# Adhesion Failures Determine the Pattern of Choroidal Neovascularization in the Eye: A Computer Simulation Study

Abbas Shirinifard<sup>1\*</sup>, James Alexander Glazier<sup>1</sup>, Maciej Swat<sup>1</sup>, J. Scott Gens<sup>1</sup>, Fereydoon Family<sup>2</sup>, Yi Jiang<sup>3,4</sup>, Hans E. Grossniklaus<sup>5</sup>

1 The Biocomplexity Institute and Department of Physics, Indiana University Bloomington, Bloomington, Indiana, United States of America, 2 Department of Physics, Emory University, Atlanta, Georgia, United States of America, 3 Department of Mathematics and Statistics, Georgia State University, Atlanta, Georgia, United States of America, 4 Theoretical Division, Los Alamos National Laboratory, Los Alamos, New Mexico, United States of America, 5 L.F. Montgomery Ophthalmic Pathology Laboratory, Emory University, Atlanta, Georgia, United States of America

# **Abstract**

Choroidal neovascularization (CNV) of the macular area of the retina is the major cause of severe vision loss in adults. In CNV, after choriocapillaries initially penetrate Bruch's membrane (BrM), invading vessels may regress or expand (CNV initiation). Next, during Early and Late CNV, the expanding vasculature usually spreads in one of three distinct patterns: in a layer between BrM and the retinal pigment epithelium (sub-RPE or Type 1 CNV), in a layer between the RPE and the photoreceptors (subretinal or Type 2 CNV) or in both loci simultaneously (combined pattern or Type 3 CNV). While most studies hypothesize that CNV primarily results from growth-factor effects or holes in BrM, our three-dimensional simulations of multi-cell model of the normal and pathological maculae recapitulate the three growth patterns, under the hypothesis that CNV results from combinations of impairment of: 1) RPE-RPE epithelial junctional adhesion, 2) Adhesion of the RPE basement membrane complex to BrM (RPE-BrM adhesion), and 3) Adhesion of the RPE to the photoreceptor outer segments (RPE-POS adhesion). Our key findings are that when an endothelial tip cell penetrates BrM: 1) RPE with normal epithelial junctions, basal attachment to BrM and apical attachment to POS resists CNV. 2) Small holes in BrM do not, by themselves, initiate CNV. 3) RPE with normal epithelial junctions and normal apical RPE-POS adhesion, but weak adhesion to BrM (e.g. due to lipid accumulation in BrM) results in Early sub-RPE CNV. 4) Normal adhesion of RBaM to BrM, but reduced apical RPE-POS or epithelial RPE-RPE adhesion (e.g. due to inflammation) results in Early sub-retinal CNV. 5) Simultaneous reduction in RPE-RPE epithelial binding and RPE-BrM adhesion results in either sub-RPE or sub-retinal CNV which often progresses to combined pattern CNV. These findings suggest that defects in adhesion dominate CNV initiation and progression.

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\* E-mail: ashirini@indiana.edu

# Introduction

## Organization

We first review the key components of the retina and the processes commonly hypothesized to underlie CNV. We then discuss our main hypotheses for CNV mechanisms and why we believe adhesion may play an important role in both initiation and progression of CNV. We then use a multi-cell computer simulation of a mechanistic computational model of the chorio-capillaris, BrM and photoreceptors to investigate the effects of adhesion variations on CNV initiation and progression. Finally, we focus on how adhesion in the BrM-RPE-POS complex changes due to aging and inflammation both in human retina and in animal models of CNV and discuss the biomedical implications of our results.

# Age-Related Macular Degeneration and Pathological Choroidal Neovascularization

Sprouting angiogenesis, growth of new blood vessels from preexisting vessels, occurs in response to chemical and mechanical stimuli and to hypoxia in both adult and embryonic tissues. Sprouting angiogenesis requires activation of normally quiescent endothelial cells in pre-existing blood vessels, breakdown of existing basement membranes, migration of activated cells led by one or more endothelial tip cells or immune cells (which can also function as tip cells) in response to environmental and cell-contact cues and proliferation of a subset of activated endothelial cells (stalk cells) with possible recruitment of support cells (pericytes and smooth muscle cells) during blood-vessel maturation [1].

In pathological angiogenesis, e.g. in vascular tumors, vessels do not mature, resulting in leaky capillary vasculature which causes



# **Author Summary**

This paper tests hypotheses for the mechanisms of choroidal neovascularization (*CNV*), the pathological growth of capillaries in response to physical defects in a structured tissue, the *retina*, showing that previously neglected cell-cell, cell-ECM and ECM-ECM adhesion failures suffice to determine the loci and progression of neovascularization. Surprisingly, a simple theory based on classes of adhesion failures, which involve variation of only five parameters, can coherently explain the heterogeneous range of CNV growth patterns and dynamics. Our results are generally applicable to other types of tissues where capillaries are close to an epithelium, *e.g.*, lung and gut.

severe edema, inefficient blood transport and reduced oxygenation. Maturation failure can result in a pathological feedback loop, where worsening hypoxia leads to higher levels of proangiogenic factors, including vascular endothelial growth factor A (VEGF-A) and platelet-derived growth factor (PDGF), and the greater excess of proangiogenic factors produces even more inefficient capillaries, worsening the hypoxia.

The hallmark of wet or exudative age-related macular degeneration (AMD), which is the leading cause of irreversible blindness in North America, Europe, and Australia [2], is lesioning choroidal neovascularization (CNV), the invasion of the retina by new blood vessels growing from the choriocapillaris (CC). In humans, CNV frequency increases with age, independent of other risk factors or specific insults, though numerous risk factors and insults can greatly increase its probability of occurrence in an individual. CNV in all patients shares the same basic neoangiogenic steps. We distinguish the following three temporal phases: Initiation, when endothelial cells first cross Bruch's membrane (BrM); Early CNV, when endothelial cells spread and form capillaries in a defined locus, and Late CNV, when additional loci may become involved, often leading to retinal pigment epithelium (RPE) detachment and degeneration, CNV regression/involution and photoreceptor death.

The diverse CNV scenarios are categorized based on histological [3] and clinical observations [4]. Neovascular vessels originating from the choroid can grow in the plane between the RPE and BrM (sub-RPE, occult or Type 1 CNV), between the retina and the RPE (sub-retinal, classic or Type 2 CNV) or in both locations (combined or Type 3 CNV). Type 3 CNV can also form as a late stage of Early Type 1 or Early Type 2 CNV. In wet AMD, severe visual loss results from subretinal hemorrhage from the leaky CNV, which leads to the eventual formation of a disciform scar. While CNV is generally a disease of the elderly, with onset occurring after 70 years, progression after onset may be rapid. According to the Macular Photocoagulation Study Group [5], about 40% of patients with untreated Type 1 CNV loose significant visual acuity within 12 months. 23% of these patients develop Type 3 CNV within 3 months and an additional 23% develop Type 3 CNV within 12 months. Current therapeutic strategies depend on the CNV locus (subfoveal, juxtafoveal or extrafoveal) and include photodynamic therapy, laser photocoagulation and most-commonly, anti-angiogenic drugs (Lucentis, Macugen or Avastin) [6]. Long-term prognoses are poor; only 20% of patients with Type 1 CNV have stabilized or improved vision 36 months after initial diagnosis and treatment [5].

Developing more effective targeted intervention strategies will depend on understanding CNV mechanisms. However, because of the structural complexity of the normal and diseased retina and the numerous homeostatic and developmental mechanisms operating concurrently, experiments have yet to identify clearly the mechanisms responsible for either CNV initiation or progression. As a novel approach to developing such understanding, this paper applies quantitative models and computer simulations to test hypotheses for the mechanisms leading to CNV initiation and controlling early and late Type 1, 2 and 3 CNV.

# Current Hypotheses for CNV Initiation and Progression

Multiple hypotheses compete to explain CNV initiation, growth and patterning (for comprehensive reviews, see [7,8]). These hypotheses form two major groups depending on their primary mechanism of action: 1) VEGF overexpression, and 2) irregularities in BrM (including focal defects and basal deposits). Inflammation affects both mechanisms because it promotes formation of irregularities in BrM and participates in angiogenesis. To better understand CNV, we consider its risk factors and correlated pathological conditions and briefly discuss their relationship to the steps of angiogenesis.

Excessive expression of VEGF, mainly in response to injuries and hypoxia, without balancing expression of angiogenesis inhibitors is a major stimulator of neoangiogenesis in most tissues. Excess VEGF has been considered a primary cause of CNV [9] because anti-VEGF drugs can significantly inhibit CNV progression. This hypothesis seems reasonable, because activation, proteolytic activity and survival of ECs depend on VEGF concentrations, and directional migration of tip cells depends on gradients of VEGF, which in turn depend on the composition of the ECM and the proteolytic activity of ECs [10] (in many cases VEGF-A is bound to the ECM and is only sensed by ECs when released by proteolytic enzymes). In animal models, excess secretion of VEGF by the RPE due to subretinal injections of reactive oxygen species (ROS) [11] or adenovirus [12] can induce CNV. However, other studies in transgenic mice show that increased expression of VEGF-A and/or angiopoietin-2 in RPE is not sufficient to initiate CNV and that overexpression of VEGF can only initiate CNV when combined with subretinal injections [13] which disturb the integrity of the RPE, probably by triggering inflammation, reducing RPE-POS contact adhesion and inducing RPE growth [14–16]. Also in transgenic mice [17], overexpression of VEGF-A<sub>164</sub> in the RPE causes extensive intrachoroidal neovascularization, but does not lead to sub-RPE or sub-retinal CNV, again suggesting that an intact Bruch's membrane/RPE barrier prevents choroidal neovascularization from penetrating into the subretinal space. Immunohistochemical analyses of human subjects with a history of chorioretinal disease show that compared to age-matched control subjects (mean age about 80 years) their PEDF levels are significantly lower than their VEGF levels in RPE cells, the RPE basal lamina, BrM and the choroidal stroma [9,18]. This imbalance shows that disturbed angiogenic and antiangiogenic factor levels correlate with late-stage chorioretinal disease, but the relative expression levels of these factors would need to be measured experimentally **before** CNV initiation to establish whether the imbalance is a cause or a result of CNV. However, secreted proteome profiling in human RPE cell cultures derived from donors with AMD shows a 2- to 3-fold increase in their levels of PEDF compared to age-matched healthy donors [19]. Thus, while the experimental evidence shows a clear increase in proangiogenic factors, this increase may be compensated by an increase in antiangiogenic factors. Whether an imbalance develops is thus not definitively established. Another serious objection to the VEGF-hypothesis is that it fails to explain the distinct loci and progression of CNV. VEGF levels are high throughout the retina and cannot provide spatial cues to lead to

the localization of CNV to either the RPE-BrM boundary (Type 1) or the RPE-POS boundary (Type 2). Indeed, no experiment has established the presence of VEGF gradients within the BrM-RPE-POS complex.

Both age-related changes of the retina and pathological conditions can increase VEGF expression. Life-long accumulation of lipids in BrM and their gradual oxidation (producing reactive oxygen species and recruiting immune cells) correlate with increased production of VEGF by the RPE and greater likelihood of developing CNV [20]. Hypoxia also temporarily increases the secretion of VEGF in cultured RPE cells by up to 3-fold over 48 hours, followed by a return to baseline [21,22]. Inflammatory cells also secrete VEGF and other proangiogenic and antiangionegic factors (see Inflammation subsection in supplementary Text

Irregularities of BrM include focal breaks and thinning in BrM, abnormal production of ECM by the RPE, and formation of soft drusen. All of these BrM defects correlate with CNV [23,24]. However, the common hypotheses that BrM presents a physical barrier to the invasion and/or growth of choriocapillaries into the retina and that small gaps in BrM may be responsible for initiation of CNV, contradict several experimental and clinical observations: 1) BrM is never an impenetrable barrier to immune and tip cells and has not been shown to physically block the invasion of activated ECs into the sub-RPE space. BrM is only 2–4 µm thick, with pores up to 0.5 µm diameter [25]. The BrM elastin layer in the macula of healthy young adults (age < 62) can have gaps of up 2 µm [26]. 2) Activated endothelial cells, which are always present in the normal choriocapillaris, probe their micro-environment by sending out processes (like filopodia) as thin as 0.1 µm and as long as 200 µm even in dense embryonic and adult tissues. Such flilopodial processes can easily cross BrM through its pores. Leukocytes can cross BrM rapidly under both normal and inflammatory conditions [27] (taking at most a few hours to cross the BrM-RPE barrier and only a few minutes to cross the endothelium in an in vitro flow model [28]). ECs digest and penetrate an intact BrM in less than a week when RPE is severely damaged due to phototoxicity in a rat model [29]. 3) The rate of CNV in persons younger than 50 years old is negligible (except in cases of excess inflammatory response in the eyes). 4) The CNV initiation probability when BrM is mechanically disrupted in animal models is about 10% [30]. These observations suggest that focal defects and thinning of BrM do not significantly reduce the already minimal efficacy of the physical barrier function of healthy BrM. Instead, other mechanisms may explain the correlation of focal defects in BrM with CNV, e.g., breaks in BrM due to calcification may disrupt both the RBaMs and the basement membranes of CC cells, disrupting the epithelial junctional structure of the RPE [23] and activating CC endothelial cells. This simultaneous activation of ECs and disruption of the RPE may explain the correlation of focal defects in BrM with CNV.

However, while BrM does not form a mechanical barrier to persistent EC penetration of the retina, BrM and the RPE attached to it clearly do form an effective barrier to choroidal penetration, even in the presence of small holes in BrM. The nature of this barrier is not clear. Haptotaxis may play a role. ECs exhibit strong haptotactic preference for their own basement membrane. The basement membrane of the RPE (RBaM) differs in structure and components from the CC basement membrane (CC BaM) (reviewed in [31]). ECs preferentially adhere to their own basal lamina and new blood vessels follow the pattern of any pre-existing EC-manufactured basal lamina after capillary atrophy [32]. Thus, in the absence of factors that induce directed migration of ECs (chemotaxis or haptotaxis), we hypothesize that

activated ECs of the choriocapillaris prefer to stay on the outer side of BrM, which has a high level of CC BaM, and not to invade sub-RPE space, which almost entirely lacks CC BaM.

Since overexpression of VEGF and reduction in BrM's barrier function may not fully explain CNV initiation, multiple types, loci and progression [23], this paper investigates the possible role of additional mechanisms, particularly adhesion defects.

#### Adhesion Failure and CNV

While not usually considered crucial to CNV, a great deal of experimental evidence suggests that failures of adhesion are essential for the development of CNV (Table 1). The strict spatial separation of the CC from the normal retina and the distinct loci of Type 1 and Type 2 CNV suggest that the physical structure and properties of the BrM-RPE-POS complex may determine both CNV initiation and progression. Experimental evidence suggests that reduced RBaM-BrM adhesion may enable CNV to invade the sub-RPE space. The differences in properties and effects of hard and soft drusen support this hypothesis. Soft drusen are strong risk factors for CNV and are often associated with detachment of the RPE from BrM, suggesting that they substantially reduce RBaM-BrM adhesion [33-35]. However, hard drusen, which contain hyalinised material and attach firmly to the inner collagenous layer of BrM (based on EM images) do not greatly increase the likelihood of CNV [24,35]. Softening of hard drusen, which reduces their adhesion to RBaM, correlates with CNV [36,37]. Similarly, the ability of inflammation to induce CNV suggests that impaired lateral adhesion between cells in the RPE promotes Type 2 CNV. Pathological conditions that compromise the integrity of the oBRB by weakening junctional epithelial adhesion in the RPE cause a wide range of neovascular diseases in the retina [38-42]. Recent studies show that subretinal drusenoids, which are drusen-like deposits that accumulate between the RPE and photoreceptors, perturb RPE-POS adhesion and correlate with CNV [43-45]. Finally, the detachment of the POS from the RPE (retinal detachment) reduces the integrity of the oBRB and significantly increases the risk of CNV in animal models of CNV, suggesting that impaired RPE-POS adhesion also promotes CNV.

Since the relative importance, roles and interactions among the different types of adhesion impairment during CNV initiation and progression are unclear, this body of experimental evidence motivated us to study the role of adhesion failures in the BrM-RPE-POS complex in CNV.

The need for models and simulation. While a detailed experimental analysis of adhesion effects in CNV is desirable, it is currently impractical. No animal model exhibits the full range of AMD-related CNV pathologies [46], while in vitro experiments do not reproduce the complex layering and porosity of BrM, the interlocking of the RPE and POS, the accumulation of lipids in the BrM layers or the formation of soft drusen. Independent quantitative control of biological mechanisms is experimentally difficult, especially in vivo. We therefore chose to develop computational models which allow us to titrate the effects of specific mechanisms without confounding crosstalk or quantitative uncertainties and to study the synergistic or antagonistic effects of multiple mechanisms acting simultaneously or sequentially. Computational models also allow us to explore many more combinations of bio-mechanistic hypotheses and parameter choices than we could in experiments. Our computational models include key retinal components, cell-cell, cell-ECM and ECM-ECM adhesion mechanisms and major angiogenesis-related processes, like BrM breakdown by proteases, hypoxic signaling upregulating VEGF production and VEGF and oxygen transport.

**Table 1.** Pathological conditions and injuries, their effects on adhesion and their correlations with CNV.

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	Context		Adhesion			Effects		
	Condition	Subject	RPE-RPE	RBaM-BrM	RPE-POS	RPE Viability	CNV Loci	Simulation Results
-	Normal Aging (No Drusen)	Human	+	+	+	+		No initiation even in presence of small holes in <b>BrM</b> (Table S1)
7	Hard Drusen [23,35]	Human	1	1	+	1		See the Current Hypotheses for CNV Initiation and Progression section
т	Soft Drusen [23,35–37]	Human	+/-	-/-	+/-	+/-	Sub-RPE	<b>S11, T12, P13 CNV</b> (Tables S2, S5, S6, S7)
4	Sub-retinal Drusenoid (reticular pseudodrusen) [44,45,96]	Human	-/-	+/-/-	-/-	+/-	Sub-Retinal and/or Sub-RPE	<b>T12, S22, P23 CNV</b> (Tables S6, S8, S9)
2	BrM Calcification [23,24]	Human	+/-	+/-	+	+/-	*	*
9	Active Inflammation [80]	Young Human	1	+	+/-/-	+/-	Sub-Retinal	<b>S22 CNV</b> (Table S8)
7	Retinal Detachment [14,40]	Cat	-/-	+	ı	+	*	<b>S22 CNV</b> (Table S8)
∞	High Fat Diet+Aging+Blue Light [75]	Mouse	+/-	-/-	+	-/+	Early Sub-RPE	ET1 CNV (Table S2)
6	Chemotoxicity [81]	Rabbit	1	+/-	1	ı	Sub-Retinal	<b>P23 CNV</b> (Table S9)
10	Sub-Retinal Injection [83–86]	Rat, Rabbit	ı	+/-	1	+/-	Sub-Retinal	<b>S22, P23 CNV</b> (Tables S8, S9)
=	Sub-retinal Injection and VEGF Overexpression [13]	Rat	I	+/-	I	+/-	Sub-Retinal	<b>S22, P23 CNV</b> (Tables S8, S9)

Columns: Condition: type of condition, injury or perturbation in clinical or experimental observations. Subject: human or animal. Adhesion: strength of adhesion (+= normal, -= moderately impaired, -= severely impaired, between the cells die, control of control of control of initiation and progression, sub-RPE=Type 1, sub-retinal =Type 2, combined pattern = Type 3, \*= no data presented/available). Simulation results (boldface words = model objects. CNV Type definitions: see Table 4 and Table 5. \*= no data presented/available. See the Results and Discussion sections for details of simulation results).

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Our computational model of the retina allows us to investigate the significance of these hypothesized mechanisms in both CNV initiation and progression. In this paper, we focus on the significance of adhesion failures in the BrM-RPE-POS complex to CNV early and late progression, deferring a detailed comparative study of the roles of VEGF overexpression and BrM defects to future publications.

#### A Quantitative Model of the Retina-RPE-CC Complex

CNV involves the interaction of two complex components, the retina, with its supporting structures, and the choriocapillaris. We briefly review the functional and structural properties of these components in the context of CNV in supplementary Text S1.

To allow unbiased study of CNV mechanisms, our model of the retina-RPE-CC includes objects and processes (Table 2) capable of recapitulating all the major CNV hypotheses (VEGF overexpression, BrM defects, adhesion failures and inflammation). We list our key modeling assumptions in supplementary Text S2. We translate our quantitative model into a computational model in the Methods section in supplementary Text S3 (for a detailed explanation of our modeling terminology see supplementary Text S4). To avoid confusion, we use normal fonts for biological objects and **boldface** to represent objects and times in the quantitative model, e.g. RPE denotes the model's representation of biological RPE and one year denotes one simulated biological year. We also use **boldface** to distinguish the specific simulation interactions of **iunctional** adhesion, labile adhesion and plastic coupling in our model from their biological correlates, but we do not use a separate font to distinguish other modeled and biological processes.

Anatomical components of the model. Since CNV is usually limited to the outer retina, we model the choriocapillaris, BrM, RPE and parts of the outer retina in detail, and represent the inner retina implicitly through appropriate boundary conditions at the outer limiting membrane (see Figure 1, for normal anatomical components). Our model does not explicitly represent the OLM which defines the innermost (towards the inner retina) **boundary** of the modeled outer retina. The properties of the retinal layers depend on the in-layer distance from the fovea. We could represent these typical anatomical/thickness variations of the biological retina in our model by changing a limited number of geometrical and metabolic parameters, though we do not do so in the present paper. Our model explicitly represents **BrM**, but neglects its layered structure and assumes that the inner and outer basal laminae and basement membrane of BrM provide equivalent adhesion substrates. Modeled BrM is composed of small blocks of non-diffusible solid material (frozen generalized cells). We assume that cells cannot cross intact BrM. So our modeled BrM blocks cell migration (See Discussion section for more details). Our model does not explicitly represent basal deposits, which play a major role in CNV initiation and progression, but includes them implicitly via their effects on the adhesion properties of the RPE-BrM complex. Since CNV originates from the outgrowth of capillaries in the choriocapillaris, our model represents the capillary network of the **choriocapillaris** (*CC*) and the **endothelial cells** (*EC***s**) explicitly. Modeled **CNV** capillaries are composed of **stalk cells** (see the *Angiogenesis* and BrM Degradation subsection, below). Our model represents extracellular fluid in the tissue by a **medium** that fills spaces unoccupied by **cells** or **BrM**.

Oxygen transport and metabolism in the model retina. The choriocapillaris secretes diffusing oxygen at a constant rate (see the Methods section in supplementary Text S3) and PO<sub>2</sub> at the OLM **boundary** is constant. Numerous experimental and theoretical studies of oxygen tension profiles in the retina show that the oxygen consumption by the RPE is negligible compared to that of the PIS [47]. Our model assumes that **RPE** oxygen uptake is negligible [47,48]. Our model neglects the effects of blood flow entirely and assumes that PO<sub>2</sub> is independent of position along a capillary, or whether a capillary is a sprout or has anastomosed with other vessels. The effects of blood flow on vascular remodeling and tumor growth have been extensively studied by Owen et al. [49], Szczerba and Székely [50], Perfahl et al. [51], Alarcon et al., Bartha and Rieger [52], Welter et al. [53,54], McDougall et al. [55], Stephanou et al. [56,57], Pries et al. [58-61] and Macklin et al. [62]. Our flow-related simplifying assumptions generally have the effects of increasing oxygen availability, reducing the rate and extent of neovascularization. We have performed simulations (data not shown) in which PO<sub>2</sub> at choriocapillaris is set to half of its normal level, representing continuous systemic hypoxia. These simulations show that lower PO<sub>2</sub> at the **choriocapillaris** has little effect on the generic behavior of our model.

Adhesion properties of EC, RPE, POS and PIS cells. Our model has two types of **cell-cell** and **cell-BrM** adhesion: 1) labile adhesion and 2) junctional adhesion. Modeled labile **adhesion** represents cell-cell or cell-ECM surface adhesion in the absence of strong junctional structures (e.g. RPE-POS adhesion). Junctional adhesion combines labile adhesion at cell boundaries with plastic coupling (e.g. between neighboring cells or between **BrM** and **cells**). The **plastic coupling** simulates cytoskeletally-coupled junctional structures as breakable springs (see the Methods section in supplementary Text S3) that mechanically connect neighboring cells and also connects cells to BrM. Junctional adhesion represents biological epithelial/endothelial junctional adhesion or cell-ECM focal adhesion. Our representation of adhesion gives us the flexibility to represent both mesenchymal cells and cells organized in an epithelium. When plastic coupling between neighboring or ECM-adhering cells is strong relative to other effects including labile adhesion, cells are less likely to break their **plastic couplings** and change their neighbors, as is typical in epithelial-junction-coupled cells in an epithelium (e.g. a layer of differentiated epithelial cells in vitro at 100% confluency). However, when **plastic coupling** is weak or absent, cells can relatively easily migrate or change their neighbors, as is typical of mesenchymal cells or epithelial cells in vitro well below 100% confluency. In our model, we use this flexibility to vary the strengths of labile adhesion and plastic coupling independently to represent the differing adhesion properties of cells in healthy and pathological tissues.

Our model represents the in-plane epithelial junctions between healthy RPE cells by junctional adhesion with both strong labile adhesion and strong plastic coupling between RPE cells (Figure 2). Since RPE cells adhere strongly to their basement membranes, we treat the RBaM as a part of each **RPE cell** and assume that attachment of RPE cells to BrM depends on the adhesion of the RBaM (not of basal lamina) to BrM. During RPE detachment, cleavage occurs between the RBaM and BrM. Since we do not model the RBaM, we represent this RPE-RBaM-BrM adhesion as a single junctional adhesion between RPE and BrM cells (RPE-BrM junctional adhesion) (Figure 2). Since no known junctional structures couple RPE to the POS, we represent RPE-POS adhesion by relatively weak RPE-POS labile adhesion between RPE cells and POS cells. RPE-**POS labile adhesion** is weak relative to the strength of **labile** adhesion in RPE-RPE junctional adhesion. Neighboring PIS and POS cell segments adhere via junctional adhesion (Figure 2), limiting traverse **photoreceptor** displacement under normal conditions.

Table 2. Model objects and processes.

Object Types			Processes
Generalized Cells	Endothelial Cells (EC)	Vascular Cells (of the CC)	Adhere via junctional adhesion to ECs and BrM
			Adhere via labile adhesion to RPE, PIS, POS and Medium
			Take up RPE-derived VEGF-A
			Secrete short-diffusing VEGF-A
			Secrete Oxygen
			Die when RPE-derived VEGF-A is less than a threshold
			Have intrinsic random motility
			Migrate via chemotaxis up gradients of <b>short-diffusing VEGF-A</b> (Contact-inhibited)
		Stalk Cells (of the CNV)	All Processes of Vascular Cells and:
			Migrate via chemotaxis up gradients of <b>RPE-derived VEGF-A</b> (Contact-inhibited)
			Grow in response to <b>RPE-derived VEGF-A</b> (Contact-inhibited)
		Tip Cells	All Processes of Vascular Cells except secretion of Oxygen:
			Migrate via chemotaxis up gradients of <b>RPE-derived VEGF-A</b> (Contact-inhibited)
			Secrete MMP
		RPE Cells	Adhere via junctional adhesion to RPE cells and BrM
			Adhere via labile adhesion to ECs, PIS, POS and Medium
			Secrete RPE-derived VEGF-A
			Die in absence of contact with RPE and BrM
			Have intrinsic random motility
	Photoreceptor Compartments	POS Cell-parts	Adhere via junctional adhesion to POS and PIS cells
			Adhere via labile adhesion to ECs, RPE, BrM and Medium
			Have intrinsic random motility
		PIS Cell-parts	All Processes of POS Cell-parts and:
			Consume Oxygen
	Extracellular Materials	BrM	Non-diffusing solid material (implemented as non-motile generali cells)
			Adheres via labile and/or junctional adhesion (see EC, RPE, PPOS)
			Degraded by <b>MMP</b>
		Medium	Adheres via labile adhesion to cells and BrM
			Fills space unoccupied by <b>cells</b> or <b>BrM</b>
Fields		Oxygen	Diffuses
			Decays
		RPE-derived VEGF-A	Diffuses
			Decays
		Short-diffusing VEGF-A	Diffuses
			Decays
		ММР	Diffuses
			Decays
			Degrades <b>BrM</b>

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In an endothelium, ECs mainly adhere to other ECs via vascular endothelial cadherin (VE-Cadherins) and tight junctions. When forming the CC, modeled ECs adhere via junctional adhesion to neighboring ECs and BrM (Figure 2). Stalk cells (representing activated ECs) adhere to all other ECs via junctional adhesion with labile adhesion at the same strength as ECs in the CC, but have relatively weak plastic coupling to ECs and BrM

(Figure 2). We assume **ECs** adhere to the **RPE** and to photoreceptor segments (**PIS** and **POS** generalized **cells**) weakly via **labile adhesion** representing nonspecific biological surface adhesion (Figure 2).

Adherent cells suspended in liquid assume a spherical shape, meaning that non-specific cell-liquid adhesion is weak. We represent this weak cell-liquid adhesion by weak **labile adhesion** 

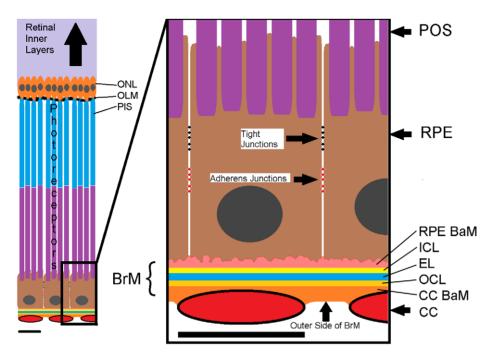


Figure 1. Retinal structure, the retinal pigment epithelium, Bruch's membrane and the choriocapillaris. Left large-scale: Structure of the outer retinal layers, the RPE and the CC. Right: Detail of the CC-BrM-RPE-POS complex. CC: choriocapillaris, BrM: Bruch's membrane, RPE: Retinal pigment epithelium, CC BaM: Basement membrane of the CC, OCL: Outer collagenous layer, EL: Elastin layer, ICL: Inner collagenous layer, RPE BaM: Basement membrane of the RPE (we abbreviate RPE BaM as RBaM), POS: Photoreceptor outer segment, PIS: Photoreceptor inner segment, ONL: Outer nuclear layer. Light purple shading indicates the location of the inner retina. Scale bars  $\sim$ 10  $\mu$ m. doi:10.1371/journal.pcbi.1002440.g001

between **cells** and **medium**. Thus **cells** prefer to adhere to other **cells** or **BrM** rather than to be surrounded by **medium**.

We do not model explicitly the differences in adhesion between the apical, lateral, and basal surfaces of biological RPE cells and photoreceptors. In our model **labile adhesion** strengths depend only on the types of **cells** or **membranes** in contact, not on the apical, basal or lateral identity of the contacting regions. However, effective cell polarization in the model develops from the specific geometry and contacts which occur in the normal and diseased retina, so at most times, **cells** emergently exhibit correctly polarized adhesivity, even though we do not impose it. We also neglect temporal adhesion changes observed clinically or experimentally during CNV progression, assuming temporally constant adhesivity of **RPE**, **POS**, **PIS cells** in our individual simulations.

Since we can vary independently the strength of the **labile** adhesion and plastic coupling which contribute to junctional adhesion, we refer to the labile components of RPE-RPE or RPE-BrM junctional adhesion as RPE-RPE or RPE-BrM labile adhesion and to the plastic coupling components of RPE-RPE or RPE-BrM junctional adhesion as RPE-RPE or RPE-BrM plastic coupling.

Angiogenic and antiangiogenic factors. To aggregate the effects of RPE-derived diffusible growth factors on the **choriocapillaris** and **CNV** capillaries we include a diffusible growth-factor **field, RPE-derived VEGF-A** which represents the aggregate proangiogenic effect of all biological long-diffusing proangiogenic and antiangiogenic factors. All types of **ECs** in our model take up **RPE-derived VEGF-A** uniformly at a constant rate. We omit growth factors and cytokines from other sources. Since we assume that PEDF affects CNV only as an antiangiogenic factor and that it diffuses at the same rate as RPE-derived VEGF, we can combine the effects of the two RPE-derived VEGF isoforms (120 and 165) and PEDF on CNV growth

and regression into an effective cell response to RPE-derived VEGF-A. While numerous other diffusible proangiogenic and antiangiogenic factors [63,64] may play a modulatory role in capillary behavior (see Inflammation subsection in supplementary Text S1), we lack detailed experimental data on their spatial and temporal distribution and function. All modeled ECs (including **CC** and activated **ECs**, see below) secrete a **short-diffusing VEGF-A**. The **short-diffusing VEGF-A** is not a survival factor for **ECs** and we ignore its uptake by **ECs**. Both **short-diffusing** VEGF-A and RPE-derived VEGF-A decay at constant rates and diffuse uniformly everywhere in our modeled retina. However, the two VEGF-A diffusion lengths differ significantly. Typically, **RPE-derived VEGF-A** diffuses ∼5 times farther than short-diffusing VEGF-A. Assuming the decay rates for both RPE-derived VEGF-A and short-diffusing VEGF-A are the same, a five-fold difference in diffusion length translates into a twenty-five fold larger diffusion constant for RPE-derived VEGF-A compared to short-diffusing VEGF-A.

Angiogenesis and BrM degradation. Computer simulations can help us analyze the role of multiple mechanisms during angiogenesis, both in pathological conditions like tumor-induced angiogenesis [65–68] and corneal angiogenesis [69] and in healthy tissues like muscle [70]. Here, we use a multi-cell 3D angiogenesis model which we have previously described [65] to simulate CNV growth and patterning. Our model includes two types of activated ECs: tip cell and stalk cell types. The tip cell type is a transient cell type that lasts one day, then differentiates into the stalk cell type. Cells of stalk cell type remain stalk cells. Both stalk and tip cells migrate via chemotaxis up gradients of both RPE-derived VEGF-A and short-diffusing VEGF-A at any cell boundaries which are not in contact with other ECs, i.e. they exhibit contact-inhibited chemotaxis. Thus, a stalk cell at the tip of an angiogenic sprout, which has less contact area with

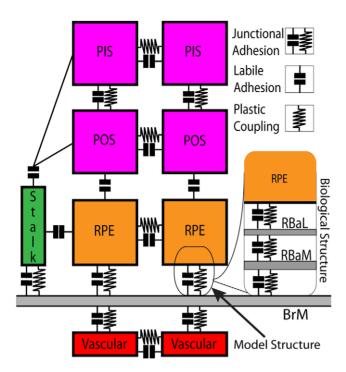


Figure 2. Adhesive interaction processes in the model retina. Our model includes two types of cell-cell and cell-BrM adhesion: 1) labile adhesion and 2) junctional adhesion. Modeled labile adhesion represents cell-cell or cell-ECM labile adhesion in the absence of strong junctional structures (e.g., RPE-POS adhesion). Junctional adhesion combines labile adhesion at cell boundaries with plastic coupling (e.g., between neighboring cells or between BrM and cells). Plastic **coupling** simulates cytoskeletally-coupled junctional structures as breakable springs (see the Methods section in supplementary Text S3) that mechanically connect neighboring cells and also connect cells to BrM. Junctional adhesion represents biological epithelial or endothelial junctional adhesion or cell-ECM focal adhesion. In the model, a single junctional adhesion between RPE cells and BrM represents the complex biological adhesion between RPE cells and their basal laminae (RBaL), adhesion between the basal laminae and their basement membrane (RBaM) and adhesion between RBaM and BrM (inset). Modeled adhesion processes are: EC-EC and EC-BrM junctional adhesion; EC-RPE, EC-POS and EC-PIS labile adhesion; RPE-RPE and RPE-BrM junctional adhesion; RPE-PIS and RPE-POS labile adhesion; PIS-PIS, PIS-POS and POS-POS junctional adhesion. Key: BrM: Bruch's membrane, RPE: retinal pigment epithelium, RBaM: basement membrane of the RPE, RBaL: basal lamina of the RPE, POS: photoreceptor outer segment, PIS: photoreceptor inner segment. doi:10.1371/journal.pcbi.1002440.g002

other **ECs**, migrates more strongly than other **stalk cells** in response to **VEGF-A** gradients. Thus **stalk cells** can function as biological endothelial tip cells, leading other **stalk cells** in the trunk of an angiogenic sprout, as seen in experiments. **Stalk cells** self-organize into capillary-like network patterns [71].

Since experiments suggest that both ECs and macrophages can function as tip cells in CNV, we can interpret a **tip cell** either as an EC tip cell or as an immune cell that invades BrM. Modeled **tip cells** secrete a single **MMP field**. Our model is agnostic about the type of MMP, though experiments seem to favor MMP-2 which is activated on contact with tip cells or macrophages expressing MT1-MMP. Our model's **MMP field** represents a very short-diffusing molecule that degrades **BrM**. If we assume that other types of MMP remain bound to the EC, it does not greatly affect our simulations, data not shown. Active tip cells produce MMPs at rates which allow them to invade even dense

ECM at speeds of more than a few µm per day (e.g. during intersegmental blood vessel formation in zebrafish embryos). At this rate of degradation, a single **tip cell** could destroy the entire simulated **BrM** within a few simulated months. However, the typical hole size in BrM in vivo is less than a few cell diameters [29]. To generate a simulated hole in **BrM** compatible with these in vivo observations (a roughly one cell-diameter hole), we must switch off **MMP** secretion by the **tip cell** after 24 simulated hours. In our simulations we represent this cessation of MMP secretion by the differentiation of the **tip cell** into a **stalk cell** at 24 h. We neglect the slow reconstruction of BrM by RPE cells.

**Inflammation.** We represent the adhesion-reducing effects of inflammation due to inflammatory factors and immune cells implicitly by weakening **RPE-RPE**, **RPE-POS** (due to acute inflammation) and **RPE-BrM adhesion** (due to chronic irregularities in complement cascade). We neglect the role of inflammation on juxtacrine Delta/Notch coupling between ECs.

Cell proliferation and death. Typically, adherent cells like RPEs need to adhere to other cells (of the same or different types) or to an appropriate substrate to remain viable. Otherwise they die. Modeled RPE cells require RPE-RPE and RPE-BrM contact to remain viable. In the absence of such contact, RPE cells die. RPE cells do not proliferate or grow. Both CC and ECs require a low concentration of RPE-derived VEGF to remain viable, and die below a threshold level of RPE-derived VEGF-A. Stalk cells grow at a rate depending on the local concentration of RPE-derived VEGF-A unless their growth is inhibited by stalk-EC contact (contact-inhibited growth, see the Methods section in supplementary Text S3 for details).

## Results

In this section, we discuss how adhesion in the **BrM-RPE-POS** complex forms an effective physical barrier to CNV and how adhesion failures increase the risk of CNV initiation. We then relate the different modes of adhesion failure to the resulting **CNV** loci (CNV types), **CNV** progression and translocation (changes of CNV locus). We also discuss the **CNV** dynamics for individual adhesion scenarios and individual simulations representative of those adhesion scenarios.

All simulations begin with either no **tip cell** or one **tip cell**. In our simulations, the **tip cell** degrades **BrM** via **MMP** secretion, forming a roughly one cell diameter hole in **BrM** which allows it to cross BrM into the retina. The tip cell does not divide; 24 **hours** after the start of the simulation, it differentiates into a stalk cell, ending its degradation of BrM. All other stalk cells descend from this stalk cell. Stalk cells at the tip of angiogenic sprouts behave like biological tip cells. This tip- cell-like behavior allows stalk cells to migrate away from existing stalk-cell clusters, releasing their contact-inhibition. They then grow and divide when they reach a preset doubling-volume. **CNV** refers to the ensemble of **stalk cells** in a simulation. We define the time of CNV onset (the CNV initiation time) to be the time at which the total number of stalk cells exceeds three. For implementation parameter values and additional simulation details see the Methods section in supplementary Text S3.

We simulated 108 different adhesion *scenarios* (sets of adhesion parameters) (ID: 1 to 108) assigning one of three levels: *normal*: 3, *moderately impaired*: 2 and *severely impaired* (*weak*): 1 to each of the five key adhesion parameters: 1) the **RPE-RPE labile adhesion** strength (*RRl*), 2) the **RPE-RPE plastic coupling** strength (*RRp*), 3) the **RPE-BrM labile adhesion** strength (*RBl*), 4) the **RPE-BrM plastic coupling** strength (*RBp*), and 5) the **RPE-POS labile adhesion** strength (*ROl*). For each adhesion scenario we

simulated our **retina** both in the absence and presence of a **tip cell** for one simulated **year**. In the presence of a **tip cell**, **CNV** may initiate (see below, in the *Necessary and Sufficient Conditions for CNV Initiation* section). We ran 10 simulation replicas for each adhesion scenario in which we included a **tip cell** (1080 simulations), and 3 simulation replicas for each adhesion scenario in the absence of a **tip cell** (324 simulations). Although not all the adhesion scenarios are physiologically likely (for example, Table S7: adhesion scenario ID: 90), a comprehensive exploration of the adhesion-parameter space clarifies the role of each corresponding mechanism in **CNV** initiation and progression.

The results of our simulations are 3D time-varying **structures** and **fields**. Quantitative comparison and classification of patterns and changes in patterns in 3D are often challenging. We have developed a morphometric quantification and classification algorithm (see the Quantification and Classification of Simulations subsection in supplementary Text S3 for details) that is able to classify CNV patterns, i.e. CNV types, and their time-dependent (CNV-type) changes, i.e. CNV progression (Table 3, Table 4, Table 5). Our algorithm calculates a morphometric weight, MW, based on the total contact area between **stalk cells** and **BrM**, and between **stalk cells** and the **POS**. A MW close to 1 indicates that most stalk cells are confined between the RPE and BrM (**sub-RPE**) in **Type 1 CNV**. A MW close to 0 indicates that most stalk cells are confined between the RPE and POS (subretinal) in Type 2 CNV. A MW close to 0.5 usually indicates Type 3 CNV (see the Quantification and Classification of Simulations subsection in supplementary Text S3 for additional conditions when  $MW\sim0.5$ ). Our computational classification is compatible with current static histological classifications and can be applied to images of appropriately labeled histological sections and 3D microscopy images of the retina.

We use multiple-regression analysis to relate the **CNV** initiation probability, types, progression and dynamics to the typical adhesion scenarios which cause them (e.g., Figures 3–6). When statistical inference is ambiguous ( $R^2 < 0.7$ ), we look at individual simulation time series in detail.

# Necessary and Sufficient Conditions for CNV Initiation

**CNV** initiation in our simulations requires: 1) a **tip cell**, and 2) adhesion failures. A **tip cell** is not sufficient to initiate **CNV** if all adhesions are normal. Even when a **tip cell** makes a hole in **BrM**,

**Table 3.** Classification of CNV type based on Morphometric Weight.

Morphometric Weights ( <i>MW</i> s)	CNV Type
<i>MW</i> ≥0.75	Type 1
<i>MW</i> ≤0.25	Type 2
0.25< <i>MW</i> <0.75	Type 3

We define the type of **CNV** based on the mean morphometric weight during a three **month** window. A *MW*≥0.75 throughout the window indicates that most **stalk cells** lie between **BrM** and the **RPE** (in the **sub-RPE** space) and do not contact the **POS**. We therefore assign the time window to **Type 1**. A *MW*≥0.25 throughout the window indicates that most **stalk cells** lie between **RPE** and the **POS** (in **sub-retinal** space) and do not contact **BrM**. We therefore assign the time window to **Type 2 CNV**. 0.25<*MW*<0.75 usually indicates that **stalk cells** occur in both the sub-**RPE** and **sub-retinal** spaces. In a few exceptional cases (Table S10) with 0.25<*MW*<0.75, most **stalk cells** lie between neighboring **RPE cells** rather than in either the **sub-RPE** or **sub-retinal** spaces (discussed in the *Stable Type 3 CNV* subsection in supplementary Text S5).

doi:10.1371/journal.pcbi.1002440.t003

**Table 4.** (Temporal) Nomenclature for CNV.

CNV Classification	Relevant Adhesion Scenarios
Early Type 1 (ET1)	Table S2
Late Type 1 (LT1)	-
Early Type 2 (ET2)	Table S3
Late Type 2 (LT2)	-
Early Type 3 (ET3)	Table S4
Late Type 3 (LT3)	-

To classify **CNV** progression dynamics during a simulated **year**, we determine the *early* and *late* loci of **stalk cells** using the mean *MW*s during the first and last three **months** of each simulation (we can make this calculation whether or not **CNV** initiates).

doi:10.1371/journal.pcbi.1002440.t004

crosses **BrM** and differentiates into a **stalk cell CNV** does not initiate if all adhesions are normal (Table S1, adhesion scenario ID:1).

The strong adhesion of **RPE cells** to neighboring **RPE cells**, POSs and BrM means that the BrM-RPE-POS ensemble behaves as a mechanically stable *complex*. This complex effectively obstructs CNV by limiting the proliferation and invasion of stalk cells into the sub-RPE and sub-retinal spaces. We discuss, in greater detail below, how different modes of adhesion failure in the **complex** allow **stalk cells** to proliferate and invade. Chemotaxis greatly affects how stalk cells invade the sub-RPE and subretinal spaces. Stalk cells migrate via chemotaxis up gradients of both short-diffusing and RPE-derived VEGF-A. RPE**derived VEGF-A** is especially important because its concentration is maximal in the RPE, encouraging stalk cells to migrate from the CC into the sub-RPE and sub-retinal spaces. Adhesion between components of the **BrM-RPE-POS** complex opposes such invasion, inhibiting CNV initiation. Our simulations show that finite-strength adhesive interactions among the components of the BrM-RPE-POS complex can prevent invasion by **stalk cells** if the adhesion forces are greater than the forces which stalk cells exert on the RPE-RPE and RPE-BrM boundaries due to chemotaxis. Because of the complicated interactions among components during angiogenesis, the existence of such adhesion thresholds is not obvious a priori. Our simulations therefore allow us to refine our understanding of these thresholds to show that EC-EC adhesion is also important in vivo. Self-organization of **ECs** into a capillary network pattern requires: 1) Strong chemotaxis forces that balance EC-EC adhesion (ECs form clusters rather than networks when chemotaxis to both short-diffusing and **RPE-derived VEGF-A** is weak), 2) the **EC-EC** adhesion strength must be comparable to the adhesion strengths in the **BrM-RPE-POS** complex. Thus the strength of adhesion among RPE-RPE, RPE-BrM and RPE-POS required to resist chemotaxing **ECs** also depends on **EC-EC** adhesivity.

We performed multiple-regression analysis (see the *Methods* section in supplementary Text S3 for details) against five adhesion parameters (RRl, RRp, RBl, RBp, ROl) to relate specific adhesion failures to the probability of **CNV** initiation. The five adhesion parameters and their (multi)linear combinations account for 88% of the observed variance in the **CNV** initiation probability (adjusted  $R^2 = 0.83$ ). To visualize the five-dimensional (5D) regression relations, we reduce 5D to 3D by assuming that RRp = RRl and RBp = RBl. We call this reduction *symmetric* since it assumes that impairing **RPE-RPE labile adhesion** also impairs **RPE-RPE plastic coupling**. E.g., we would expect changes in

Table 5. Nomenclature for CNV dynamics.

Dynamics Classification	CNV Dynamics	Relevant Adhesion Scenarios
Stable Type 1 ( <i>S11</i> )	Early Type 1→Late Type 1	Table S5
Sub-RPE to Sub-Retinal Translocation ( <i>T12</i> )	Early Type 1→Late Type 2	Table S6
Sub-RPE to Sub-Retinal Progression ( <i>P13</i> )	Early Type 1→Late Type 3	Table S7
Sub-Retinal to Sub-RPE Translocation ( <i>T21</i> )	Early Type 2→Late Type 1	Not Observed
Stable Type 2 ( <i>522</i> )	Early Type 2→Late Type 2	Table S8
Sub-Retinal to Sub-RPE Progression ( <i>P23</i> )	Early Type 2→Late Type 3	Table S9
Type 3 to Sub-RPE Translocation ( <i>T31</i> )	Early Type 3→Late Type 1	Not Observed
Type 3 to Sub-Retinal Translocation ( <i>T32</i> )	Early Type 3→Late Type 2	Not Observed
Stable Type 3 ( <i>\$33</i> )	Early Type 3→Late Type 3	Table S10

We classify CNV progression dynamics in each simulation based on its early and late CNV types, allowing for nine CNV-dynamics scenarios. We use the term progression when a simulation replica initially develops either Early Type 1 CNV or Early Type 2 CNV and then develops Late Type 3 CNV and translocation when a replica initially develops either Early Type 1 CNV or Early Type 3 CNV, then Late Type 2 CNV or initially develops either Early Type 2 CNV or Early Type 3 CNV, then Late Type 1 CNV. Three translocation scenarios, T21, T31 and T32, did not occur in our simulations.

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cytoskeletal architecture due to inflammation to affect both adhesion mechanisms together. We consider asymmetric reductions in adhesion later in this section. Figure 3 shows a 3D volumetric visualization of the **CNV** initiation probability  $(P_{\rm init})$  in the symmetrically reduced parameter space (RRp = RRl) and

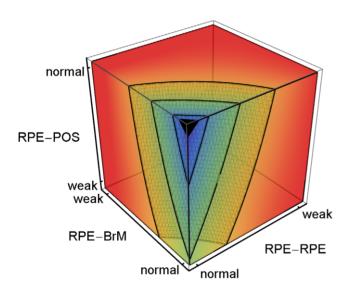


Figure 3. CNV Initiation probability dependence on key adhesion mechanisms. 3D plot of the regression-inferred CNV initiation probability ( $P_{init}$ ) vs. three key adhesion strengths using ten simulation replicas for each adhesion scenario in the 3D parameter space obtained by setting RRp = RRI and RBp = RBI. Red corresponds to  $P_{\text{init}} = 1$  and purple to  $P_{\text{init}} = 0$ . The black region at the top-front corner indicates the locus of normal adhesion. The three isosurfaces of CNV initiation probability correspond to  $P_{\text{init}} = 0.25$  (front), 0.5 (middle) and 0.75 (back). The five adhesion parameters and their (multi)linear combinations account for 88% of the observed variance in CNV initiation probability (adjusted  $R^2 = 0.83$ ). Regression predicts a minimum **CNV** initiation probability of 0.08 for normal adhesion, much higher than observed in either our simulations or experiments. For normal RPE-POS labile adhesion, moderate impairment of either RPE-RPE (RRp = RRI) or RPE-BrM (RBp = RBI) junctional adhesion increases the CNV initiation probability to ~50%. Severe impairment of **RPE-POS** increases the **CNV** initiation probability to ~50% even when both RPE-RPE and RPE-BrM are normal. doi:10.1371/journal.pcbi.1002440.g003

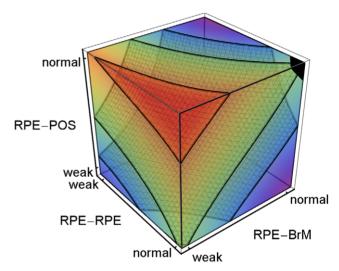


Figure 4. Sub-RPE CNV dependence on adhesion. 3D plot of the regression-inferred average MW using 10 simulation replicas for each adhesion scenario in the 3D parameter space obtained by setting RRp = RRI and RBp = RBI. The average MW shows the **stalk cell** locus even when CNV fails to initiate, so a region prone to ET1 CNV develops **ET1 CNV** only if **CNV** initiates. Red corresponds to MW=1and purple corresponds to MW = 0. The black region at the top-left corner indicates the locus of normal adhesion. MW = 1.0 for **RPE-RPE** junctional adhesion normal, RPE-BrM junctional adhesion severely impaired (weak) and RPE-POS labile adhesion normal. The three isosurfaces correspond to MW = 0.25 (back), 0.5 (middle) and 0.90 (front). The five adhesion parameters and their (multi)linear combinations account for 93% of the observed variance in average MW for all 108 adhesion scenarios (adjusted  $R^2 = 0.89$ ). Severe impairment of RPE-POS labile adhesion greatly reduces the MW, so ET1 CNV can only occur when RPE-POS labile adhesion is near normal. Scenarios with severe impairment of RPE-BrM junctional adhesion (RBp = RBI = 1), and normal **RPE-POS labile adhesion** are prone to ET1 CNV for a wide range of RPE-RPE junctional adhesion impairment (MW > 0.95 for RRp = RRI > 1.5). The red region with MW > 0.9has  $P_{\text{init}} > 0.8$ . We have rotated the axes from their orientation in Figure 3 to show the regions in the parameter space prone to ET1 CNV. To show the structure of the isosurfaces, we have rotated the axes relative to Figure 3.

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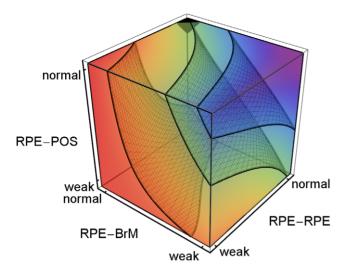


Figure 5. Sub-Retinal CNV dependence on adhesion. 3D plot of the regression-inferred average (1-MW) using 10 simulation replicas for each adhesion scenario in the 3D parameter space obtained by setting RRp = RRI and RBp = RBI. The average (1 - MW) shows the **stalk cell** locus even when CNV fails to initiate, so a region prone to ET2 CNV, develops ET2 CNV only if CNV initiates. Red corresponds to (1-MW)=1 and purple corresponds to (1-MW)=0. The black region at the top-back corner indicates the locus of normal adhesion. The three isosurfaces correspond to (1-MW) = 0.25 (right), 0.5 (middle) and 0.90 (left). The five adhesion parameters and their (multi)linear combinations account for 93% of the observed variance in average MW for all 108 adhesion scenarios ( $R^2 = 0.89$ ). The red region with (1-MW)>0.9, can be divided into three sub-regions: 1) When **RPE-RPE** junctional adhesion is normal, RPE-BrM junctional adhesion is moderately impaired, and RPE-POS labile adhesion is severely impaired (weak). 2) When RPE-RPE junctional adhesion is severely impaired (weak) and RPE-BrM junctional adhesion is normal, independent of RPE-POS labile adhesion. 3) When RPE-RPE adhesion is weak, RPE-BrM adhesion is moderately to severely impaired, and RPE-POS adhesion is severely impaired. The red region does not include all adhesion scenarios in Table S3 leading to Early Type 2 CNV. To show the structure of the isosurfaces, we have rotated the axes relative to Figure 3 doi:10.1371/journal.pcbi.1002440.g005

RBp = RBl). The three isosurfaces of **CNV** initiation probability correspond to  $P_{\rm init} = 0.25$ , 0.5 and 0.75 in order from front to back. Regression predicts a minimum **CNV** initiation probability of 0.08 for normal adhesion, while **CNV** did not initiate in any of our simulation replicas for normal adhesion. Thus the simulated **CNV** initiation probability for normal adhesion is effectively 0, as observed clinically, while the regression-inferred 0.08 initiation probability is an artifact of the linear inference, an example of the greater predictive power of mechanistic simulations compared to pure statistical inference.

Figure 3 shows that when **RPE-POS labile adhesion** is normal, even moderate impairment of either **RPE-RPE** (RRp = RRl) or **RPE-BrM** (RBp = RBl) **junctional adhesion** increases the **CNV** initiation probability to  $\sim 50\%$ . When both **RPE-RPE** and **RPE-BrM junctional adhesion** are normal (RRp = RRl = RBp = RBl = 3) and **RPE-POS labile adhesion** is severely impaired (ROl = 1) **CNV** initiation probability is also  $\sim 50\%$ . Thus, for severe impairments of any one of the three adhesion failure mechanisms can each independently induce **CNV**, as predicted both by our regression model and our mechanistic interpretation. Adhesion failures in the **BrM-RPE-POS** complex show strong combinatorial effects. When either **RPE-RPE** or **RPE-BrM junctional adhesion** is moderately

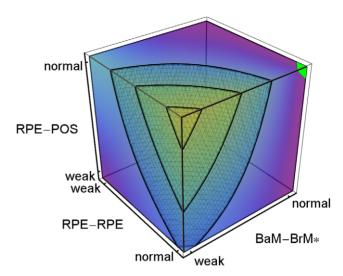


Figure 6. Stable Type 1 CNV dependence on adhesion. 3D plot of the regression-inferred probability of occurrence of Stable Type 1 CNV (S11 CNV probability) using 10 simulation replicas for each adhesion scenario in the asymmetrically reduced parameter space obtained by setting RRp = RRI and RBp = 3 (indicated by the **RPE-BrM\*** axis label). Red corresponds to a S11 CNV probability of 1 and purple corresponds to a S11 CNV probability of 0. The black region at the topleft corner indicates the locus of normal adhesion. The maximal regression-inferred probability of S11 CNV is 0.93 when RPE-RPE junctional adhesion is normal (RRp=RRI), RPE-BrM labile adhesion is severely impaired (RBI=1), RPE-BrM plastic coupling is normal (RBp = 3), and **RPE-POS labile adhesion** is normal. The three isosurfaces correspond to S11 CNV probabilities of 0.25 (back), 0.5 (middle) and 0.8 (front). The five parameters and their (multi)linear combinations account for 76% of the observed variance in the probability of occurrence of **S11 CNV** ( $R^2 = 0.67$ ). Severe impairment of RPE-POS labile adhesion and RPE-RPE junctional adhesion greatly reduces MW, so S11 CNV can only occur when both adhesion strengths are near normal. To show the structure of the isosurfaces, we have rotated the axes relative to Figure 3. doi:10.1371/journal.pcbi.1002440.g006

impaired and **RPE-POS labile adhesion** is severely impaired, **CNV** initiation probability increases to 100%. Table S1 shows that asymmetrical impairment of either **RPE-RPE** or **RPE-BrM plastic coupling** alone, without impairment of the corresponding **labile adhesion** barely increases the probability of **CNV** initiation. Thus, the **plastic coupling** strengths have only a minor effect on the ability of the **BrM-RPE-POS** complex to oppose **CNV**.

We believe that our simulated initiation probabilities are higher than those observed in experiments due to two simplifying assumptions of our model: 1) We assumed that all stalk cells can divide indefinitely. Limiting the number of stalk-cell divisions (due to senescence), would lower the probability of CNV initiation. In *in vitro* experiments, less than 2% of endothelial cells have high proliferation potential [72,73], so angiogenic sprouts often fail to grow, or even regress, if the ECs forming the sprouts have low proliferation potential. 2) We assumed that stalk cells adhere equally to both sides of BrM, while BrM and CC basement membrane are histologically distinct. In experiments, ECs haptotax to the basement membrane of the CC on the outer side of BrM (Figure 1), reducing their probability of crossing BrM compared to our simulations. We expect that increasing adhesion between  $stalk\ cells$  and the CC-side of BrM would reduce the CNV initiation probability, since stalk cells would then prefer to remain on the CC-side of BrM, where contact with the preexisting vasculature would inhibit their growth.

# Early and Late CNV and CNV Progression

To classify CNV progression during a simulated year, we determine the early and late loci of stalk cells, using the mean (weighted by the number of **stalk cells**) MWs during the first and last three months of each simulation whether or not CNV initiates (we can calculate the MW even if CNV fails to spread and thus in the absence of initiation). The mean MW measures the ability of the BrM-RPE-POS complex to confine stalk cells to specific regions. A MW≥0.75 during a given time interval indicates that most stalk cells lie between BrM and the RPE (in the **sub-RPE** space) and that they do not contact the **POS**. We therefore assign the time interval to **Type 1 CNV**. A  $MW \le 0.25$ during a given time interval indicates that most **stalk cells** lie between the **RPE** and the **POS** (in **sub-retinal** space) and do not contact **BrM**. We therefore assign the time interval to **Type 2 CNV**. 0.25<*MW*<0.75 usually indicates that **stalk cells** occur in both the **sub-RPE** and **sub-retinal** spaces (since few **sub-RPE** stalk cells touch the POS and few sub-retinal stalk cells touch **BrM**). We therefore assign the time interval to **Type 3** CNV. In a few exceptional cases (Table S10) with 0.25<MW<0.75, most stalk cells lie between neighboring RPE cells rather than in either the sub-RPE or sub-retinal spaces (discussed in the Stable Type 3 CNV section in supplementary Text S5). The type of **CNV** during the early window which we call the **early CNV type** (the first three months of a simulation) is especially revealing, because all simulations start from the same initial condition. The early CNV type shows the efficacy of the BrM-RPE-POS complex in blocking stalk cell invasion of the **sub-RPE** and **sub-retinal** spaces. Since tissue structure and cell function can change significantly in the **BrM-RPE-POS** complex during a simulated year, changes in CNV type between the early and late windows can result from either structural or barrier-function changes in the **BrM-RPE-POS** complex. For example, the adhesion failures which typically lead to **Early Type 3 CNV** differ from those which typically leading to **Late Type 3** CNV.

Because our simulations are stochastic, different replicas of the same adhesion scenario can lead to different combinations of early and late types of CNV. Such variation is common clinically and indicates that a simple population average of MWs over simulation replicas may reveal neither the **types**, progression dynamics nor degree of heterogeneity of outcomes. To retain this dynamic and population information, we classify **CNV** dynamics (progression) in each simulation separately based on its **early** and late CNV type, for a total of 9 CNV dynamics scenarios (Table 5). We use the term *progression* when a simulation replica initially develops either Early Type 1 CNV or Early Type 2 **CNV** and then develops **Late Type 3 CNV** and *translocation* when a replica initially develops either Early Type 1 CNV or Early **Type 3 CNV**, then **Late Type 2 CNV** or initially develops either Early Type 2 CNV or Early Type 3 CNV, then Late Type 1 **CNV**. Three translocation scenarios **sub-retinal** to **sub-RPE** CNV (T21 CNV), Type 3 to sub-RPE CNV (T31 CNV) and Type 3 to sub-retinal CNV (T32 CNV) did not occur in our simulations.

Early Type 1 (ET1) CNV and its progression. Stalk cells remain confined to the sub-RPE space in two main classes of adhesion scenarios: 1) When RPE-BrM labile adhesion is moderately to severely impaired, RPE-BrM plastic coupling satisfies  $RBl+RBp \le 4$ , and both RPE-RPE and RPE-POS labile adhesion are normal (RRl = 3 and ROl = 3). 2) When both RPE-RPE and RPE-BrM labile adhesion are severely impaired (RRl = 1 and RBl = 1), RPE-BrM plastic coupling is moderately to severely impaired ( $RBp \le 2$ ), and both RPE-RPE plastic

**coupling** and **RPE-POS labile adhesion** are normal (RRp = 3, ROl = 3) (Table S2, adhesion scenario ID: 83 and 84). In both classes of adhesion scenarios, **CNV** initiation leads to **Early Type 1 CNV** (**ET1**). Table 6 shows the MW and **CNV** initiation probabilities for the adhesion scenarios most prone to **ET1 CNV** (MW > 0.9).

Multiple-regression analysis of the five adhesivities accounted for 93% of the observed variance in the average MW for all 108 adhesion scenarios (adjusted  $R^2 = 0.89$ ). Figure 4 shows the **stalk cell** locus regression-inferred from the average MW as a function of the adhesion parameters obtained by setting RRp = RRl and RBp = RBl. Since Figure 4 shows the **stalk cell** locus even when **CNV** fails to initiate, a region *prone* to **ET1 CNV**, develops **ET1** CNV only if CNV initiates. Severe impairment of RPE-POS **labile adhesion** greatly reduces the MW, so **ET1 CNV** can only occur when RPE-POS labile adhesion is near normal. Scenarios with severe impairment of RPE-BrM junctional adhesion (RBp = RBl = 1), and normal **RPE-POS labile adhe**sion are prone to ET1 CNV over a wide range of RPE-RPE adhesion impairment (MW > 0.95)RRp = RRl > 1.5). The red region with MW > 0.9 has  $P_{init} > 0.8$ (Figure 4).

In most adhesion scenarios that develop **Early Type 1 CNV** with MW>90% the **CNV** remains in the **sub-RPE** space during one simulated **year** (**Late Type 1 CNV**, MW>75%). *I.e.* they exhibit **Stable T1 CNV** (**S11 CNV**) (see Figure 6, Table 7 and supplementary Text S5 for details). Generally, **CNV** growth speed differs from replica to replica in adhesion scenarios prone to **S11 CNV** (compare to **S22 CNV** dynamics, below). Figure 7 shows typical **S11 CNV** dynamics for 10 simulation replicas of a single adhesion scenario (RRl=3, RRp=3, RBl=2, RBp=2, ROl=3) (Table S5, adhesion scenario ID: 38). We visualize snapshots of **S11 CNV** dynamics in one replica in Figure 8 and Video S1.

Adhesion scenarios in which some replicas exhibit **T12 CNV** can also have replicas which exhibit either **S22** or **S11** over one simulated **year**. Figure 9 shows **T12 CNV** dynamics for 10 simulation replicas of the adhesion scenario (RRl=3, RRp=3, RBl=1, RBp=1, ROl=1) (Table S6, adhesion scenario ID: 93). We visualize snapshots of the **T12 CNV** dynamics in one replica in Figure 10 and Video S2.

**CNV** dynamics is very similar across all replicas in adhesion scenarios prone to **P13 CNV** and much less heterogeneous than for **T12 CNV**. Figure 11 shows typical **P13 CNV** dynamics for 10

**Table 6.** Adhesion scenario classification based on early CNV type.

		Турі	cal Adhesion	Scena	rio	
Early CNV	Sub-classes	RRI	RRp	RBI	RBp	ROI
Type 1	1	3	*	1,2	RBI+RBp≤4	3
	2	1	3	1	1,2	3
Type 2	1	3	*	2,3	*	1
	2	1	*	2,3	*	*
	3	1	RBp+RRp>3	1	RBp+RRp>3	1
Type 3	1	1	*	1,2	*	3

Key: RRI: RPE-RPE labile adhesion strength, RRp: RPE-RPE plastic coupling strength, RBI: RPE-BrM labile adhesion strength, RBp: RPE-BrM plastic coupling strength, ROI: RPE-POS labile adhesion strength. Scaled adhesion strengths: 3: normal, 2: moderately impaired, 1: severely impaired (weak), \*: all strength levels.

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Table 7. Adhesion scenario classification based on CNV dynamics.

		Typical	Adhesion Scenarios			
CNV Progression Dynamics	Sub-classes	RRI	RRp	RBI	RBp	ROI
S11	1	3	2, 3	1, 2	3≤RBI+RBp≤4	3
T12	1	3	$RRp+RBp \ge 4$ except RRp = RBp = 2	1	$RRp + RBp \ge 4$ except $RRp = RBp = 2$	1
P13	1	1	*	1	1, 2	3
S22	1	3	*	2, 3	*	1
	2	1	*	2, 3	*	*
	3	1	RBp+RRp>3	1	RBp+RRp>3	1
P23	1	1	1, 2	1	1	1
S33	1	1	*	2	RBI+RBp≤4	3
	2	1	*	1	3	3

To simplify, we list only the adhesion scenarios most prone to each type of CNV progression dynamics. Key: RRI: RPE-RPE labile adhesion strength, RRp: RPE-RPE plastic coupling strength, RBI: RPE-BrM labile adhesion strength, RBp: RPE-BrM plastic coupling strength, ROI: RPE-POS labile adhesion strength. Scaled adhesion strengths: 3: normal, 2: moderately impaired, 1: severely impaired (weak), \*: all strength levels. See Table 5, for nomenclature for CNV dynamics. doi:10.1371/journal.pcbi.1002440.t007

simulation replicas of the adhesion scenario (RRl=1, RRp=3, RBl=1, RBp=2, ROl=3) (Table S7, adhesion scenario ID: 83). We visualize snapshots of **P13 CNV** dynamics in one replica in Figure 12 and Video S3.

Early Type 2 (ET2) CNV and its progression. Stalk cells initially invade the sub-retinal space (Early Type 2 CNV) in

three main classes of adhesion scenarios: 1) When **RPE-RPE labile adhesion** is normal (RRl=3), **RPE-BrM labile adhesion** is normal or moderately impaired  $(RBl \ge 2)$ , and **RPE-POS labile adhesion** is severely impaired (ROl=1). 2) When **RPE-RPE labile adhesion** is severely impaired (RRl=1) and **RPE-BrM labile adhesion** is either normal or moderately impaired

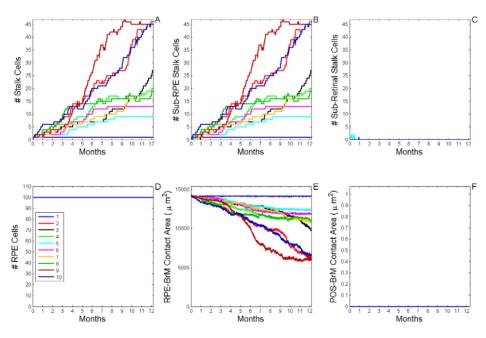


Figure 7. Dynamics of stable Type 1 CNV (S11 CNV). A) Total number of stalk cells vs. time. B) Total number of stalk cells confined in the sub-RPE space vs. time. C) Total number of stalk cells in contact with the POS (stalk cells in the sub-retinal space) vs. time. D) Total number of RPE cells vs. time. E) Total contact area between RPE cells and BrM vs. time. F) Total contact area between POS cells and BrM vs. time. The different colors represent the dynamics of 10 simulation replicas of the adhesion scenario (RRI = 3, RRp = 3, RBI = 2, RBp = 2, ROI = 3) (Table S5, adhesion scenario ID: 38). (A, B) CNV initiates in 9 out of 10 simulation replicas. All develope Early Type 1 CNV. CNV remains confined in the sub-RPE space during one simulated year (Stable Type 1 CNV). A Fully developed sub-RPE capillary network contains about 45 stalk cells ( $\sim 3000$  cells/mm<sup>2</sup>). In 5 simulation replicas a few stalk cells die during the simulated year due to lack of RPE-derived VEGF-A. (C) Stalk cells have minimal contact with the POS. (D, E) The RPE remains viable and its total contact area with BrM decreases as stalk cells proliferate. (F) The POS never contacts BrM, indicating that the RPE does not develop any holes. doi:10.1371/journal.pcbi.1002440.g007

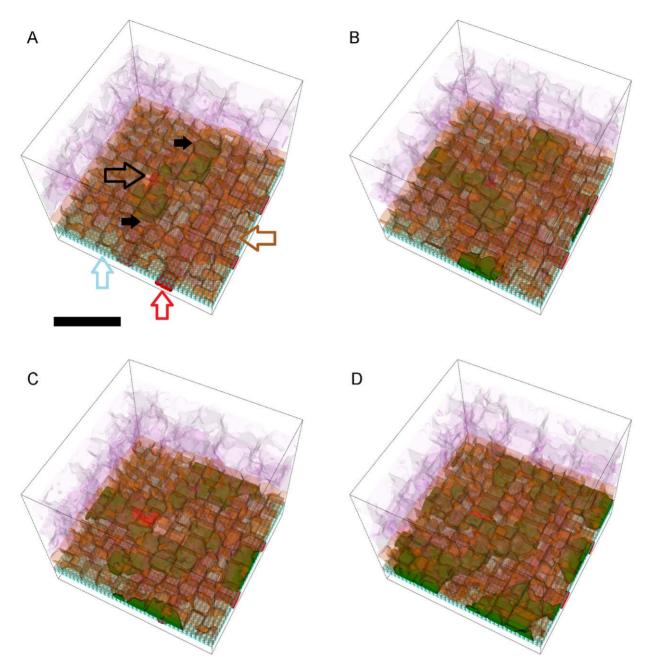


Figure 8. Snapshots of a simulation replica with stable Type 1 CNV. 3D visualization of a simulation replica exhibiting Stable Type 1 CNV over one simulated year (adhesion scenario ID: 38, simulation ID: 902) (RRI=3, RRp=3, RBI=2, RBp=2, ROI=3). Snapshots of the simulation at months 3 (A), 6 (B), 9 (C) and 12 (D). (A) Stalk cells (black arrows) invade the sub-RPE space through a hole (black outline arrow) in BrM (light blue outline arrow) that the tip cell opens during the first 24 hours. Brown outline arrow shows the RPE cells. Red outline arrow shows the CC (B, C) Stalk cells proliferate until they fill the sub-RPE space in month 9, after which proliferation slows down (D) The 45 stalk cells form a connected capillary network in the sub-RPE space. Cell type colors: 1) POS and PIS: light purple, 2) RPE: brown, 3) Stalk cells: green, 4) Vascular cells (CC): red, 5) BrM: light blue. Scale bar ~50 μm. We have rendered the boundaries of individual cells as semi-transparent membranes. POS, PIS and RPE cells are more transparent to show the underlying structures. See also Video S1. doi:10.1371/journal.pcbi.1002440.g008

 $(RBl \ge 2)$ . 3) When **RPE-RPE**, **RPE-BrM** and **RPE-POS labile adhesion** are severely impaired (RRl = RBl = ROl = 1), and the combination of **RPE-RPE** and **RPE-BrM plastic coupling** satisfies RBp + RRp > 3. Unless all **labile adhesions** are severely impaired, impairment of either **RPE-RPE** or **RPE-BrM plastic coupling** has little effect on the average MW, though it does increase the **CNV** initiation probability. For example, adhesion scenarios ID: 22 and 24, which differ only in their **RPE-BrM** 

**plastic coupling**, exhibit the same mean MW; however,  $P_{\text{init}} = 0.8$  for normal **RPE-BrM plastic coupling** (ID: 22) and  $P_{\text{init}} = 1$  for severely impaired **RPE-BrM plastic coupling** (ID: 24).

Figure 5 shows (1-MW), which measures the degree of *confinement* of **stalk cells** to the **sub-retinal** space, based on the regression-inferred average MW (see, the *Early Type 1 (ET1) CNV* subsection, above) as a function of the five adhesion

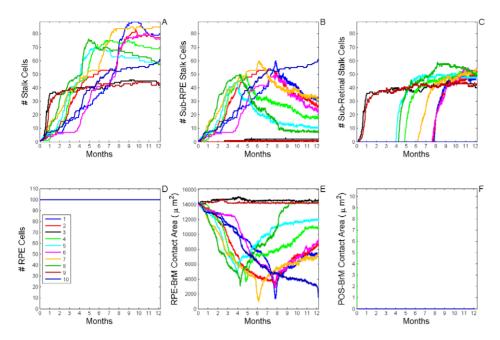


Figure 9. Dynamics of sub-RPE to sub-retinal translocation (T12 Translocation). A) Total number of stalk cells vs. time. B) Total number of stalk cells confined in the sub-RPE space vs. time. C) Total number of stalk cells in contact with the POS (stalk cells in the sub-retinal space) vs. time. D) Total number of RPE cells vs. time. E) Total contact area between RPE cells and BrM vs. time. F) Total contact area between POS cells and BrM vs. time. The different colors represent the results of 10 simulation replicas of the adhesion scenario (RRI = 3, RRp = 3, RBI = 1, RBp = 1, ROI = 1) (Table S6 adhesion scenario ID: 93). (A, B) CNV initiates in all replicas. By 3 months, most replicas form a developed sub-RPE capillary network composed of ~20 to 40 stalk cells in most replicas die due to lack of RPE-derived VEGF-A. (C) Two replicas show Stable Type 1 (S11) CNV. Some stalk cells in most replicas die due to lack of RPE-derived VEGF-A. (C) Two replicas show Stable Type 2 (S22) CNV (Early (ET2) and Late Type 2 (LT2) CNV, black and dark red lines). 7 replicas show LT2 CNV. (D) The RPE remains viable in all replicas. (E) The contact area between the RPE and BrM decreases as either ET1 CNV or S11 CNV develops, and remains constant during ET2 CNV. RPE reattaches to BrM during T12 CNV. (F) The POS contacts BrM once, but the contacts area and duration are both small, so the RPE does not develop any persistent or substantial holes.

parameters, reduced to 3D by setting RRp = RRl and RBp = RBl. The red region with (1-MW) > 0.9, can be divided into three subregions: 1) When **RPE-RPE junctional adhesion** is normal, **RPE-BrM junctional adhesion** is moderately impaired, and **RPE-POS labile adhesion** is severely impaired (weak). 2) When **RPE-RPE junctional adhesion** is severely impaired (weak) and **RPE-BrM junctional adhesion** is normal, independent of **RPE-POS labile adhesion**. 3) When **RPE-RPE junctional adhesion** is severely impaired (weak), **RPE-BrM junctional adhesion** is moderately to severely impaired, and **RPE-POS labile adhesion** is severely impaired. Figure 5 does not include all the adhesion scenarios in Table S3 leading to **Early Type 2 CNV**.

In **Stable Type 2 CNV** (**S22 CNV**), **stalk cells** initially invade the **sub-retinal** space to develop **Early Type 2 CNV** and remain confined in the **sub-retinal** space in **Late Type 2 CNV**. Most adhesion scenarios that develop **ET2 CNV** in which the MW remains less than 0.15 during the first three months also exhibit **S22 CNV** (Figure 13, Table 7 and supplementary Text S5). Generally, **CNV** dynamics is very similar across all replicas of the adhesion scenarios prone to **S22 CNV** (Table 7 and supplementary Text S5). As for **P13 CNV**, the variability from replica to replica is smaller than for **S11 CNV**. Figure 14 shows typical **S22 CNV** dynamics for 10 simulation replicas of the adhesion scenario (RRl=1, RRp=1, RBl=3, RBp=3, ROl=3) (Table S8, adhesion scenario ID: 16). We show snapshots of the **S22 CNV** dynamics in one replica in Figure 15 and Video S4.

**CNV** dynamics is very similar across all replicas of the adhesion scenarios prone to **P23 CNV** (Table 7 and supplementary Text

S5). Variability from replica to replica is low and comparable to the variability observed in **P13 CNV** and **S22 CNV**. Figure 16 shows typical **P23 CNV** dynamics for 10 simulation replicas of the adhesion scenario where all adhesions are severely impaired (RRl=1, RRp=1, RBl=1, RBp=1, ROl=1) (adhesion scenario ID: 108). We visualize snapshots of the **P23 CNV** dynamics in one replica in Figure 17 and Video S5.

Early Type 3 (ET3) CNV and its progression. In Early Type 3 (ET3) CNV, Stalk cells initially grow both between the RPE and BrM and between the RPE and the POS. Most adhesion scenarios have severely impaired RPE-RPE labile adhesion (RRl=1), normal RPE-POS labile adhesion (ROl=3) and either severely or moderately impaired RPE-BrM labile adhesion ( $RBl \le 2$ ) (Table S4). In these adhesion scenarios, RPE-RPE and RPE-BrM plastic coupling have little effect on mean MW and CNV initiation probability. For example, adhesion scenarios ID: 82 (RRp=3), 85 (RRp=2) and 88 (RRp=1) have similar mean MW and CNV initiation probability, despite differing in their RPE-RPE plastic coupling strengths (RRp).

Generally, **CNV** dynamics is very similar across all replicas of the adhesion scenarios prone to **S33 CNV** (Table 7 and supplementary Text S5). Variability from replica to replica is comparable to the variability in **P13 CNV**, **S22 CNV** and **P23 CNV**. Figure 18 shows the typical **S33 CNV** dynamics in 10 simulation replicas of the adhesion scenario (RRl=1, RRp=1, RBl=2, RBp=2, ROl=3) (Table S10, adhesion scenario ID: 53). We visualize snapshots of **S33 CNV** dynamics in one replica in Figure 19 and Video S6.

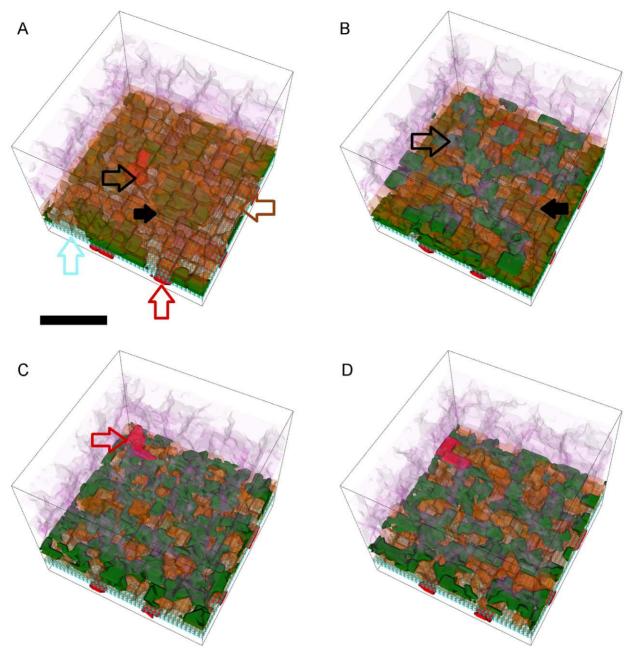


Figure 10. Snapshots of a simulation replica showing sub-RPE to sub-retinal translocation (T12 Translocation). 3D visualization of a simulation replica exhibiting T12 CNV translocation during one simulated year (RRI=3, RRp=3, RBI=1, RBp=1, ROI=1) (adhesion scenario ID: 93, simulation ID: 849). Snapshots of the simulation at months 3 (A), 5 (B), 9 (C) and 12 (D). (A) Stalk cells (solid black arrow) invade the sub-RPE space through a hole in BrM (black outline arrow) and form a capillary network. All stalk cells remain in the sub-RPE space during the first 3 months. A few vascular cells fill the hole in BrM (black outline arrow) to connect CNV capillaries to the CC (red outline arrow). Brown outline arrow shows an RPE cell. (B) Half of the stalk cells (black outline arrow) have crossed the RPE and transmigrated into the sub-retinal space, forming a new capillary network in the sub-retinal space. The black arrow shows a stalk cell in the sub-RPE space. (C) Most stalk cells have transmigrated into the sub-retinal space and the RPE has completely reattached to BrM (Figure 9E, dark green line). A few vascular cells of the CC have transmigrated into the sub-retinal space (red outline arrow) (D) The sub-retinal capillary network has fewer stalk cells than (C) since stalk cells that migrate into the retina far from the RPE die. Cell type colors: 1) POS and PIS: light purple, 2) RPE: brown, 3) Stalk cells: green (stalk cells in the sub-retinal space have lighter shading), 4) Vascular cells (CC): red, 5) BrM: light blue. Scale bar ~50 μm. We have rendered the boundaries of individual cells as semi-transparent membranes. POS, PIS and RPE cells are more transparent to show the underlying structures. See also Video S2. doi:10.1371/journal.pcbi.1002440.g010

## Discussion

Our simulations show that variations in five key adhesion strengths suffice to explain many of the experimentally and clinically observed dependencies of CNV initiation on drusen, inflammation, retinal detachment and iatrogenic to reproduce the main observed types and progression dynamics of CNV associated with those defects. Since pathological conditions can cause multiple adhesion failures in the BrM-RPE-POS complex, we simulated factorial combinations of graded impairments of the five adhesion types to explore the effects of biologically-coupled adhesion failures. In this section, we discuss the effects of both

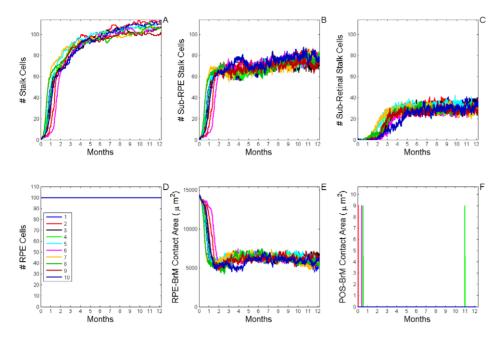


Figure 11. Dynamics of sub-RPE CNV to sub-retinal CNV progression (P13 Progression). A) Total number of stalk cells vs. time. B) Total number of stalk cells confined in the sub-RPE space vs. time. C) Total number of stalk cells in contact with the POS (stalk cells in the sub-retinal space) vs. time. D) Total number of RPE cells vs. time. E) Total contact area between RPE cells and BrM vs. time. F) Total contact area between POS cells and BrM vs. time. The different colors represent the results of 10 simulation replica of the adhesion scenario (RRI = 1, RRp = 3, RBI = 1, RBp = 2, ROI = 3) (Table S7, adhesion scenario ID: 83). CNV initiates in all replicas and all develop ET1 CNV. A few stalk cells in most replicas die due to lack of RPE-derived VEGF-A. (C) Stalk cells cross the RPE and invade the sub-retinal space once the number of stalk cells in the sub-RPE space reaches ~60 cells, which usually occurs within first two months after initiation. CNV progression to the sub-retinal space is complete around month 5. (D) The RPE remains viable in all replicas. (E) The contact area between the RPE and BrM decreases as ET1 CNV develops, and remains constant afterwards throughout LT3 CNV. (F) The POS contacts BrM a few times, but the contact area and duration are both small, so the RPE does not develop any persistent or substantial holes.

individual adhesion failures and their combinations on **CNV** initiation, **type** and **dynamics** and explain their clinical and experimental relevance.

Table 1 aggregates a spectrum of clinical and experimental observations for a variety of conditions, with rough estimates of the degree of impairment of the three main inter-component adhesions present in the BrM-RPE-POS complex. Table 1 also lists the most common types of CNV associated with each condition. In this section, we compare clinical and experimental observations for these conditions to the results of our simulations for appropriate adhesion scenarios. Since we assume adhesion is constant over the duration of the simulation, to understand the effects of the gradual changes in adhesion which occur in patients as CNV develops, we must look successively at the results of multiple simulations for an appropriate series of adhesion impairments comparable at each time to those of the disease as it progresses.

# Clinical and Experimental Types of CNV and their Relation to Simulations

**CNV due to soft drusen in older humans.** As we discussed earlier (see the section *Current Hypotheses for CNV Initiation and Progression*), soft drusen significantly reduce the adhesion of the basement membrane of the RPE to BrM (RBaM-BrM adhesion). Sub-RPE CNV often starts by growing between these weakly adhered layers. Although soft drusen are seen clinically, the early stages of invasion of ECs into the sub-RPE space have little effect on visual acuity, so early EC invasions can remain unreported and unnoticed. In these patients, initial vision acuity prior to CNV initiation is not severely impaired compared to typical age-

controlled visual acuity, suggesting that their photoreceptors remain healthy or at most moderately impaired compared to age-matched controls. Since the RPE plays multiple roles in maintaining both photoreceptors (e.g. through the phagocytosis of spent disks from the photo receptors) and the outer retina (e.g. through the transport of fluids), near-normal photoreceptors can only persist in the presence of near-normal RPE cells. Nearnormal vision also requires that the POS remain attached to the RPE without accumulation of sub-retinal fluid or retinal detachment, indicating that RPE-POS adhesion must remain nearnormal. Based on these observations, we hypothesize that in patients with soft drusen, both RPE-RPE and RPE-POS adhesion are near-normal, but BaM-BrM adhesion is impaired with the level of impairment differing patient-to-patient. This spectrum of adhesion impairments in the BrM-RPE-POS complex is comparable to the first sub-class of adhesions scenarios which are prone to Early Type 1 CNV (Table 6). Within this sub-class, variation in the degree of adhesion impairment of RPE-RPE plastic coupling, RPE-BrM labile adhesion and RPE-BrM plastic coupling affects many aspects of CNV in simulations, including the CNV initiation probability, CNV onset time and CNV dynamics. Additionally, some adhesion scenarios in this class show significant variability among simulation replicas with identical adhesivities.

Patients with multiple large soft drusen or *confluent drusen* (soft indistinct drusen) have a higher chance of developing CNV [74], suggesting that CNV initiation probability depends on total area of drusen and their shape. In standard clinical usage, drusen with a diameter <63 µm are called *small drusen* and those with a diameter >125 µm are called *large drusen*. Confluent drusen or soft indistinct

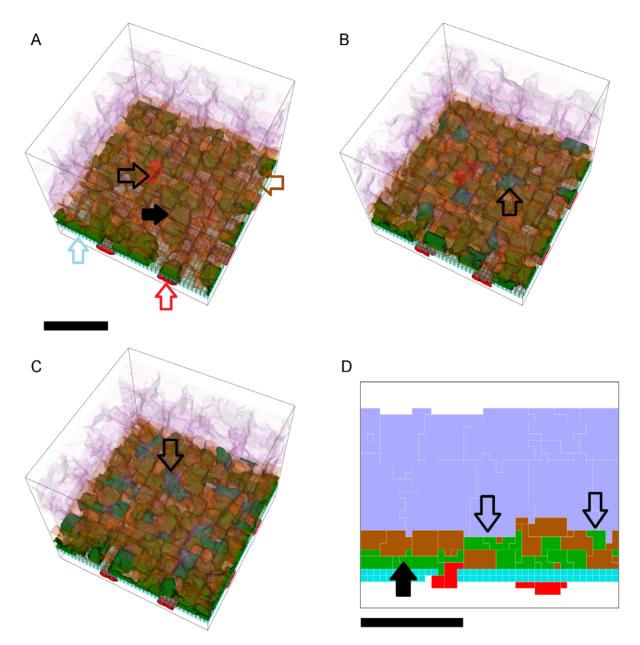


Figure 12. Snapshots of a simulation replica showing sub-RPE CNV to sub-retinal CNV progression (P13 Progression). 3D and 2D visualizations of a simulation replica exhibiting P13 CNV progression during one simulated year (RRI = 1, RRp = 3, RBI = 1, RBp = 2, ROI = 3) (Table S7, adhesion scenario ID: 83, simulation ID: 515). Snapshots of the simulation at months 1 (A), 2 (B), 6 (C) and 12 (D). (A) Stalk cells (solid black arrow) invade the sub-RPE space through a hole in BrM (blue outline arrow) and form a capillary network. The vascular cells (black outline arrow) of the CC (red outline arrow) occupy the hole that the tip cell forms during the first 24 hours of the simulation, connecting the CNV capillaries to the CC. All stalk cells remain in the sub-RPE space during the first month of the simulation. (B) A few stalk cells (black outline arrow) cross the RPE into the sub-retinal space. (C) Additional stalk cells migrate into the sub-retinal space and form vascular cords (black outline arrow). (D) A 2D cross-section of the retina showing the hole in BrM. The stalk cells form a sub-RPE capillary network (black arrow) connected to a sub-retinal capillary network (black outline arrows). Two vascular cells connect the CC to the CNV capillaries through the hole in BrM. Cell type colors: 1) POS and PIS: light purple, 2) RPE: brown, 3) Stalk cells: green (stalk cells in the sub-retinal space have lighter shading), 4) Vascular cells (CC): red, 5) BrM: light blue. Scale bar ~50 μm. We have rendered the boundaries of individual cells as semi-transparent membranes. POS, PIS and RPE cells are more transparent to show the underlying structures. See also Video S3. doi:10.1371/journal.pcbi.1002440.g012

drusen form when multiple soft drusen touch and merge. Confluent drusen strongly correlate with CNV and serous RPE detachment due to fluid accumulation between BrM and the RPE, indicating severe impairment of RBrM-BrM adhesion due to the larger area of impaired RBrM-BrM adhesion and high lipid levels in the drusen affected regions. These experimental observations

suggest that the probability of CNV initiation increases with both the degree and total area of RBrM-BrM adhesion impairment. In our simulations, the total area of impaired adhesion is the same in all replicas, so it does not affect the **CNV** initiation probability. However, the **CNV** initiation probability increases with the degree of impairment of **RPE-BrM junctional adhesion** in those

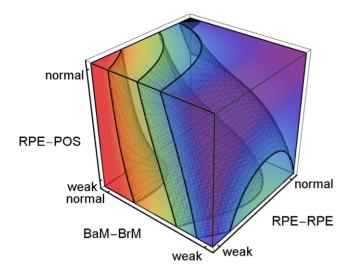


Figure 13. Stable Type 2 CNV dependence on adhesion. 3D plot of the regression-inferred probability of occurrence of Stable Type 2 CNV (S22 CNV probability) using 10 simulation replicas for each adhesion scenario in the 3D parameter space obtained by setting RRp = RRI and RBp = RBI. Red corresponds to a **S22 CNV** probability of 1 and purple corresponds to a S22 CNV probability of 0. The black region at the top-back corner indicates the locus of normal adhesion. The three isosurfaces correspond to S22 CNV probabilities of 0.25 (right), 0.5 (middle) and 0.9 (left). The five parameters and their (multi)linear combinations account for 89% of the observed variance in the probability of occurrence of S22 CNV in all 108 adhesion scenarios (adjusted  $R^2 = 0.84$  ). **S22 CNV** occurs primarily when **RPE-RPE** junctional adhesion is moderately to severely impaired, RPE-BrM junctional adhesion is normal or moderately impaired, independent of RPE-POS labile adhesion (red region with S22 CNV probability>0.9). The red region does not include all adhesion scenarios in Table S8 leading to S22 CNV. To show the structure of the isosurfaces, we have rotated the axes relative to Figure 3. doi:10.1371/journal.pcbi.1002440.g013

adhesion scenarios exhibiting **ET1 CNV** (Table 6, **ET1 CNV** first sub-class), supporting our experimentally-based hypothesis.

The locus of **stalk cells** in all simulation replicas of the first sub-class of **ET1 CNV** agrees with that in clinical and sub-clinical (sub-clinical CNV appears in histology but not clinically) sub-RPE CNV, the typical early CNV type in these patients. It also agrees with the appearance of drusen-like deposits and the initial stages of EC invasion into BrM observed in a fat-fed aged-mouse model (16 months old) exposed to non-phototoxic levels of blue light [75]. However, CNV did not progress in this mouse model [75].

While experimental and clinical results are incomplete, as we discussed above, they do suggest that patients with stable sub-RPE CNV do not suffer high rates of severe RPE detachment, indicating that their RBaM-BrM adhesion is not severely impaired. Among simulations with **ET1 CNV**, those in which **RPE-BrM junctional adhesion** is not too severely impaired (Table 7, RBl = 1 or 2 and  $3 \le RBl + RBp \le 4$ ), exhibit **Stable Type 1 CNV**, agreeing with our interpretation of this clinical observation.

Since we hypothesize that more severe impairment of RBaM-BrM adhesion facilitates CNV spreading and progression, we expect higher variability of outcomes in patients with moderately impaired adhesion than in patients with severely impaired adhesion. In older patients, CNV progression timing and the size and growth rate of the CNV-affected area vary significantly patient-to-patient [5,76–78]. About one third of untreated sub-RPE CNV cases in older patients remain stable for extended

periods of time (~30% remain stable 3 years after diagnosis). A slightly larger population of apparently similar patients progress to more damaging sub-retinal CNV in a short period of time (~40% develop sub-retinal CNV within the 12 months after diagnosis). According to a different study [76], sub-RPE CNV lesion size doubles in 12 months in ~30% of patients and quadruples in ~40% of patients and remained stable in the remainder. Such patient-to-patient variability corresponds closely to the variability we observe in stalk cell proliferation, CNV area growth and onset time in our corresponding simulations. As in clinical observations, simulations of adhesion scenarios with moderately impaired **RPE-BrM junctional adhesion** (Table 7, RBl = 1 or 2 and  $3 \le RBl + RBp \le 4$ ,) have greater variability in stalk cell proliferation, CNV growth rate and CNV onset time than simulations with severely impaired RPE-BrM junctional **adhesion** (Table 6, RRl = 3, RRp = 3, RBl = 1, RBp = 1, ROl = 3). For example, in the 10 simulation replicas of an adhesion scenario with moderately impaired RPE-BrM junctional **adhesion** and all other adhesion normal (Table 7, RRl = 3, RRp = 3, RBl = 2, RBp = 2, ROl = 3) (Figure 7) nine out of ten replicas initiate CNV, but the total number of stalk cells after one simulated **year** shows a four-fold variation (from a minimum of 10 stalk cells to a maximum of 45 stalk cells) and the CNV onset time varies from a minimum of two weeks to a maximum of 4 months (after formation of the initial hole in **BrM**). For less impaired adhesion, when the plastic component of RPE-BrM junctional adhesion is severely impaired but the labile component is normal (Table S1, RRl=3, RRp=3, RBl=3, RBp = 1, ROl = 3), **CNV** initiates in only 30% of simulations, the initiation onset time is around 10 months (after formation of the initial hole in BrM) and the total number of stalk cells remains less than 6 in all replicas during the simulated year.

Overall, the stalk cell growth and proliferation rate among simulations that develop ET1 CNV, is slowest in those simulations exhibiting S11 CNV and fastest in those simulations exhibiting **P13 CNV**. The **stalk cell** division rate (the frequency of **stalk** cell division within the tissue) in S11 CNV ranges from one or two cell divisions per **year** to one cell division every 48 **hours**. The stalk cell division rate in P13 CNV is less variable, about one cell division every  $\sim 12$  **hours** during **ET1 CNV** (Figure 11A, the first **month** in most replicas). The long initiation delays and slow sub-RPE CNV development observed in some of our simulation replicas correspond to the slow sub-RPE CNV development and long-term CNV stability observed in a small population of patients (<30% as mentioned in [78]). Fastprogressing ET1 CNV in some of these simulations agrees with the clinically-observed rapid increase in sub-RPE CNV size in a different set of otherwise similar patients. Based on the observed variability in **CNV** onset time and growth rate in our simulations and its dependence on the degree of adhesion impairment, we believe that the observed clinical patient-to-patient variability may result from both intrinsic stochasticity in certain adhesion regimes and from small patient-to-patient differences in the degree and type of adhesion impairments in the patient's BrM-RPE-POS complex.

In older patients, sub-RPE CNV may later also invade the sub-retinal space (sub-RPE CNV to CNV sub-retinal progression is a common CNV progression scenario). The factors involved in this transition are not well understood. Gradual degradation of the RPE due to sub-RPE hemorrhaging, formation of sub-RPE fibrosis and inflammation triggered by initial sub-RPE CNV are associated with this transition. The death of RPE cells during this degradation indicates that RPE-RPE adhesion is impaired. The rapid vision loss associated with the transition from sub-RPE CNV

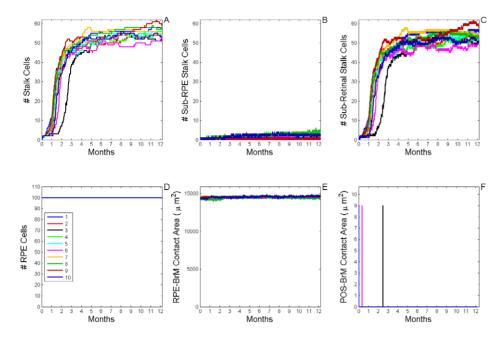


Figure 14. Dynamics of stable Type 2 CNV (S22 CNV). A) Total number of stalk cells vs. time. B) Total number of stalk cells confined in the sub-RPE space vs. time. C) Total number of stalk cells in contact with the POS (stalk cells in the sub-retinal space) vs. time. D) Total number of RPE cells vs. time. E) Total contact area between RPE cells and BrM vs. time. F) Total contact area between POS cells and BrM vs. time. The different colors represent the results of 10 simulation replicas of the adhesion scenario (RRI = 1, RRp = 1, RBJ = 3, RBp = 3, ROJ = 3) (Table S8, adhesion scenario ID: 16). (A, C) CNV initiates in all replicas and all develop ET2 CNV during the first three months of the simulation. All replicas exhibit S22 CNV. A few stalk cells in most replicas die due to lack of RPE-derived VEGF-A. (C) Few or no stalk cells reach the sub-RPE space. (D) The RPE remains viable in all replicas. (E) The contact area between the RPE and BrM does not change as S22 develops. (F) The POS contacts BrM a few times, but the contact area and duration are both small, so the RPE does not develop any persistent or substantial holes. doi:10.1371/journal.pcbi.1002440.g014

to sub-retinal CNV, indicates impaired RPE-POS adhesion, though, clinically, we do not know whether RPE-POS adhesion impairment is a cause or result of the transition. Thus these conditions imply impairment of RPE-RPE junctional adhesion and/or RPE-POS labile adhesion in addition to preexisting impairment of RPE-BrM junctional adhesion (due to lipid accumulation). Three classes of adhesion scenarios are relevant: 1) When both RPE-POS labile adhesion and RPE-**BrM junctional adhesion** are impaired, 2) when both **RPE-RPE** and **RPE-BrM junctional adhesion** are impaired, and 3) when RPE-RPE junctional adhesion, RPE-POS labile adhesion, RPE-BrM junctional adhesion are impaired. These three classes include all the sub-classes of adhesion scenarios leading to T12 CNV, P13 CNV, S22 CNV, S23 CNV and S33 **CNV**. These three classes never lead to **S11 CNV** (for definitions of the sub-classes of adhesion scenarios see Table 7), suggesting that impairment of RPE-RPE and/or RPE-POS adhesion in addition to preexisting impairment of RBaM-BrM in patients is the primary mechanism leading to the sub-RPE CNV to subretinal CNV transition.

Clinically, adhesion strengths may change as CNV progresses. However our simulations show that P13 CNV progression can occur in patients even for time-independent adhesion. We can thus use our simulations to develop a prognosis for patients with sub-RPE CNV and in whom RPE-RPE and/or RPE-POS adhesion are impaired in addition to preexisting impairment of RBaM-BrM. Simulations that exhibit **ET1 CNV** and later invade the sub-retinal space in **P13 CNV** (Table 7, RRl = 1, independent of RRp, RBl = 1, RBp = 1 or 2, ROl = 3) correspond to the most common clinically observed progression of AMD-induced CNV, which begins as sub-RPE CNV and later progresses to involve the sub-retinal space. Simulations with **T12 CNV** (Table 7, RRl = 3,

RBl=1, ROl=1, RRp+RBp≥4 except RRp=RBp=2) do not appear to correspond to any standard clinical CNV progression dynamics, perhaps, because the transient nature of the sub-RPE to sub-retinal translocation makes its clinical detection difficult; we hypothesize that T12 CNV may be occurring but is not being diagnosed. Clinically, depending on the time of observation, T12 CNV could be diagnosed as sub-RPE CNV, Type 3 or sub-retinal CNV. Only frequent prospective eye examinations and long-term follow up can determine whether our prediction of clinical sub-RPE to sub-retinal translocations is correct.

Clinically, ET2 and ET3 CNV are not common in druseninduced CNV in patients. However, the adhesion scenarios that exhibit ET2 and ET3 in our simulations might correspond to secondary CNV which develops later to a primary site of CNV in patients with pre-existing ET1 CNV. To explore the relevance of these scenarios, we could conduct simulations beginning with preexisting ET1 CNV instead of a single tip cell in the CC. For example, we would expect the pre-existing ET1 CNV to translocate to the **sub-retinal** space when simulated in adhesion scenarios that exhibit primary **S22 CNV**. Such CNV dynamics would look like **T12 CNV** (discussed above). Clinically, this result implies that if we were to increase RBaM-BrM adhesion therapeutically (e.g. by extraction of lipids from BrM or by removing/reducing fluids between RBaM and BrM) in the presence of pre-existing sub-RPE CNV, stalk cells could translocate to the sub-retinal space in a transition to sub-retinal CNV. Since sub-retinal CNV is much more damaging to vision than sub-RPE CNV, this translocation would be a serious iatrogenic side effect. We can make similar analogies for the significance of simulated S23 CNV and S33 CNV.

Vascular RPE detachment caused by growth of CNV under the RPE is a common complication of sub-RPE CNV in AMD. We

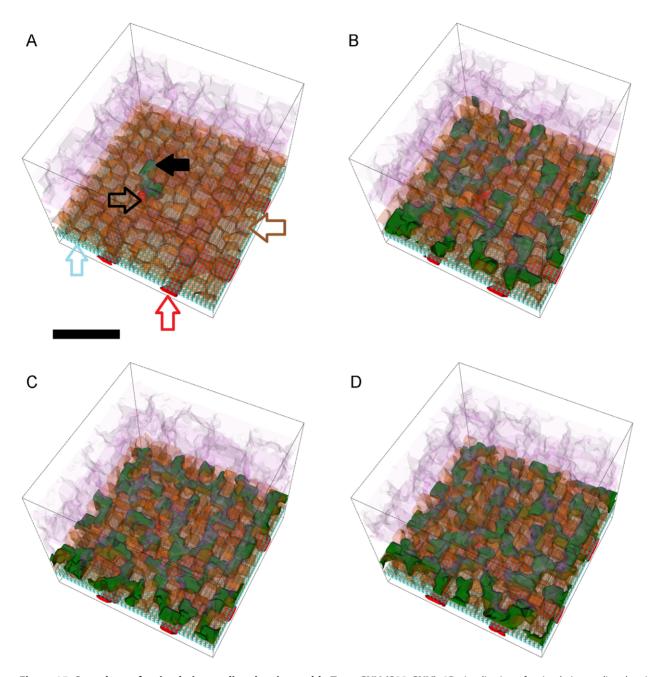


Figure 15. Snapshots of a simulation replica showing stable Type CNV (522 CNV). 3D visualization of a simulation replica showing S22 CNV in one simulated year (RRI = 1, RRp = 1, RBI = 3, RBp = 3, ROI = 3) (adhesion scenario ID: 16, simulation ID: 556). Snapshots of the simulation at months 1 (A), 2 (B), 6 (C) and 12 (D). (A) Stalk cells (solid black arrow) invade the sub-retinal space through a hole in BrM (black outline arrow) and form a partially developed capillary network (B). CNV finishes sub-retinal invasion around month 5 and remains in the sub-retinal space throughout LT2 CNV (C-D). A few vascular cells (A, black outline arrow) fill the hole in BrM to connect the CNV capillaries to the CC (red outline arrow). Brown outline arrow shows an RPE cell. Cell type colors: 1) POS and PIS: light purple, 2) RPE: brown (stalk cells in the sub-retinal space have lighter shading), 3) Stalk cells: green, 4) Vascular cells (CC): red, 5) BrM: light blue. Scale bar ~50 µm. We have rendered the boundaries of individual cells as semi-transparent membranes. POS, PIS and RPE cells are more transparent to show the underlying structures. See also Video S4. doi:10.1371/journal.pcbi.1002440.g015

observe a corresponding pathology when **RPE-BrM junctional adhesion** is severely impaired (Table 6, **Early Type 1** sub-class 1, RBl = RBp = 1). In this case, **Early Type 1 CNV** results in later **RPE** detachment, leading to either **T12 CNV** translocation or **P13 CNV** progression in conjunction with the formation of holes in the RPE (we will discuss late-stage CNV complications in detail in future papers).

**Inflammation-induced CNV.** Sub-retinal CNV without prior diagnosed sub-RPE CNV occurs, but is not as common in older patients as drusen-induced CNV [79]. It also occurs in young patients in conjunction with acute inflammatory conditions, particularly in cases of serpiginous choroidopathy, multifocal choroiditis and panuveitis [80]. The mechanisms leading to this type of CNV are not well understood and we lack clinical insight

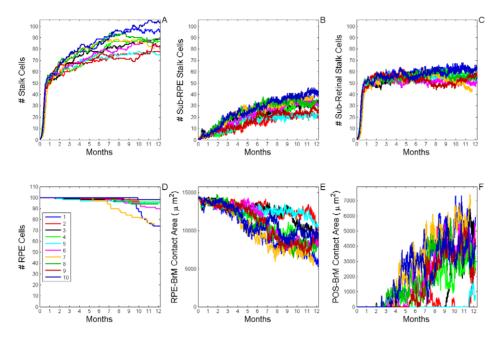


Figure 16. Dynamics of sub-retinal CNV to sub-RPE CNV progression (P23 CNV Progression). A) Total number of stalk cells vs. time. B) Total number of stalk cells confined in the sub-RPE space vs. time. C) Total number of stalk cells in contact with the POS (stalk cells in the sub-retinal space) vs. time. D) Total number of RPE cells vs. time. E) Total contact area between RPE cells and BrM vs. time. F) Total contact area between RPE cells and BrM vs. time. F) Total contact area between POS cells and BrM vs. time. The different colors represent the results of 10 simulation replicas of the adhesion scenario (RRI = 1, RRp = 1, RBI = 1, RBp = 1, ROI = 1) (Table S9, adhesion scenario ID: 108). CNV initiates in all replicas and all develop ET2 CNV. A few stalk cells in most replicas die due to lack of RPE-derived VEGF-A. (B) Stalk cells cross the RPE and invade the sub-RPE space once the number of stalk cells in the sub-RPE space reaches ~50 cells, which usually occurs during the first month after initiation. Stalk cells gradually invade the sub-RPE space during one simulated year. (D) Up to 30 RPE cells (30% of the total) die. The number of RPE cell deaths increases with the number of sub-RPE stalk cells. (E) The contact area between the RPE and BrM decreases as P23 CNV develops. (F) In all replicas the POS contacts BrM persistently and extensively, as the RPE develops substantial holes (see Figure 17).

into how specific risk factors affect the probability of CNV initiation. Younger patients usually lack both drusen [80] and significant dispersed build up of lipids in BrM. As we discussed earlier active inflammation reduces RPE-RPE epithelial adhesion. Alteration of RPE-RPE epithelial adhesion combined with edema due to active inflammation may also reduce RPE-POS adhesion. We do not know whether inflammation always impairs RPE-RPE and RPE-POS adhesion at the same time, or to the same degree. Since CNV initiation occurs promptly during acute inflammation, we do not expect acute inflammation to decrease RBaM-BrM adhesion significantly. Thus, in young patients inflammation both RPE-RPE epithelial adhesion and RPE-POS adhesion are impaired, but not RBaM-BrM adhesion. This adhesion impairment corresponds to impairments of RPE-RPE junctional adhesion and RPE-POS labile adhesion, while RPE-BrM junctional adhesion is near-normal (Table 6, Early Type 2 **CNV** sub-class 1 and 2). Simulations of these adhesion scenarios consistently exhibit Early Type 2 CNV (ET2 CNV), in which stalk cells initially invade the sub-retinal space without prior invasion of the sub-RPE space, in agreement with clinicallyobserved sub-retinal CNV in these patients.

In our simulations, when **RPE-RPE labile adhesion** is severely impaired and all other adhesions are normal (RRl=1, RRp=RBl=RBp=ROl=3) (Table S8, adhesion parameter set ID: 10) **CNV** always initiates, followed by **Early Type 2 CNV** (**ET2 CNV**). When **RPE-POS labile adhesion** is severely impaired and all other adhesions are normal (RRl=RRp=RBl=RBp=3, ROl=1) (Table S8, adhesion parameter set ID: 19), the **CNV** initiation probability is 50% and initiation always leads to **ET2 CNV**. When both **RPE-RPE junctional adhesion** and **RPE-**

**POS labile adhesion** are impaired **CNV**, always initiates and leads to **ET2 CNV** (see also Figure 5, for more information on how **sub-retinal CNV** depends on adhesion). Our results make two predictions that can be tested against clinical and experimental observations: 1) Disruption of RPE-RPE epithelial junctions, due to inflammation, by itself should lead to sub-retinal CNV in patients with a relatively intact retina, independent of any defects in RPE-POS adhesion 2) Disruption of RPE-POS contact, by itself, should increase the probability of developing sub-retinal CNV

Our understanding of CNV dynamics in young patients is incomplete. Neither sub-retinal CNV to sub-RPE CNV progression (P23 CNV) nor sub-retinal CNV to sub-RPE CNV translocation (T21 CNV) has been observed clinically or histologically (since CNV is not fatal, histological data for young patients with CNV is rare). We currently do not know whether this absence of observation is due to major retinal damage due to subretinal CNV, which precludes the later transition (and is not included in our model), or whether Late Type 1 CNV is simply overlooked clinically because sub-retinal CNV causes much more severe vision loss. Our simulations make three predictions relevant to inflammation-induced CNV in young patients: 1) If RPE-BrM adhesion junctional is near normal (RBl = 2 or 3, independent of RBp) any combination of severely impaired RPE-RPE **junctional adhesion** (RBl = 1, independent of RBp) and **RPE**-**POS** labile adhesion (ROl=1) will exhibit Stable Type 2 CNV. 2) When all adhesions are severely impaired (RRl = RBl = RBp = ROl = 1, RRp = 1 or 2), **Sub-retinal CNV** to sub-RPE CNV progression (P23 CNV) will occur. 3) Subretinal CNV to sub-RPE CNV translocation (T21 CNV) is

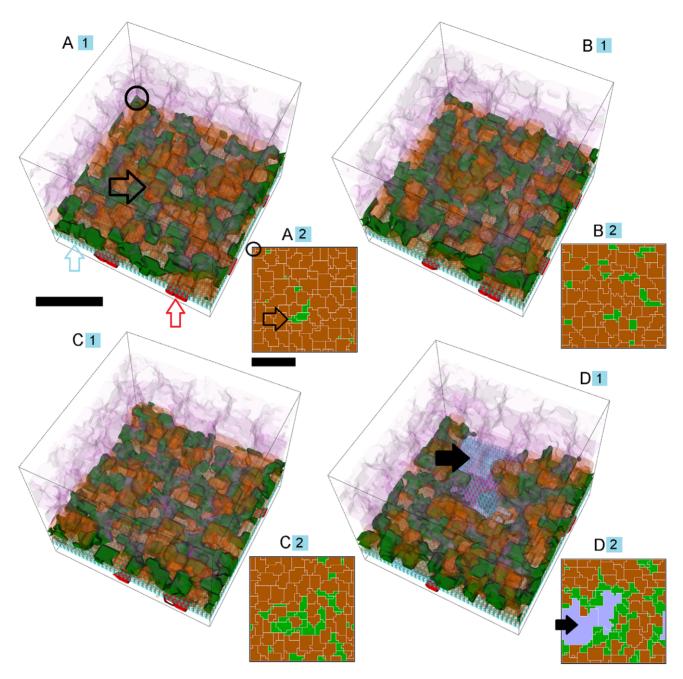


Figure 17. Snapshots of a simulation replica exhibiting sub-retinal CNV to sub-RPE CNV progression (P23 CNV). 3D and 2D visualization of a simulation replica forming P23 CNV in one simulated year (RRI = 1, RRp = 1, RBI = 1, RBp = 1, ROI = 1) (adhesion scenario ID: 108, simulation ID: 1080). Snapshots of the simulation at months 1 (A), 3 (B), 6 (C) and 12 (D). (A2-D2) Cross-sections of (A1-D1) parallel and adjacent to BrM, so stalk cells shown in (A2-D2) contact BrM. The black open circles (A1-2) at the top corner and outline back arrows (A1-2) at the location of the hole in BrM are guides to the eye to align A2 to A1. The alignment is consistent across all panels. (A) Stalk cells (solid black arrow) invade the sub-retinal space through the hole in BrM (A1-2, black outline arrows) that the tip cell form during the first 24 hours of the simulation and form a fully developed sub-retinal capillary network by month 1. (A2) Only a few stalk cells, mostly near the hole in BrM, invade the sub-RPE space during the first month. (B1, C1) The sub-retinal capillary network does not grow significantly. (B2, C2) Additional stalk cells invade the sub-RPE space. (D) More stalk cells invade the sub-RPE space, disrupting the RPE and causing a micro-tear (D1-2, black arrows). The POS contacts BrM at the location of the RPE tear. Cell type colors: 1) POS and PIS: light purple, 2) RPE: brown (stalk cells in the sub-retinal space have lighter shading), 3) Stalk cells: green (3D-visualized stalk cells in the sub-retinal space have lighter shading), 4) Vascular cells (CC): red, 5) BrM: light blue. Scale base ~50 μm. We have rendered the boundaries of individual cells in A1-D1 as semi-transparent membranes. POS, PIS and RPE cells are rendered more transparent to show the underlying structures. See also Video S5. doi:10.1371/journal.pcbi.1002440.g017

unlikely. These predictions mean that once CNV invades the subretinal space, it will not leave this space, so CNV lesions will expand primarily in the sub-retinal space as long as RBaM-BrM is not severely impaired.

Chemotoxicity (10% solution of naphthalene force-fed by gavage for 5 weeks) in a rabbit model [81] causes degradation of photoreceptors and proliferation of RPE leading to sub-retinal CNV. In this rabbit model, the RPE cells proliferating phagocy-

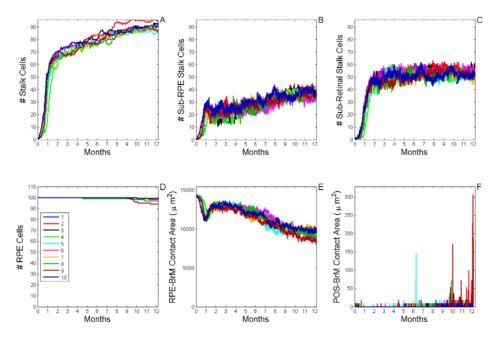


Figure 18. Dynamics of stable Type 3 CNV (S33 CNV). A) Total number of stalk cells vs. time. B) Total number of stalk cells confined in the sub-RPE space vs. time. C) Total number of stalk cells in contact with the POS (stalk cells in the sub-retinal space) vs. time. D) Total number of RPE cells vs. time. E) Total contact area between RPE cells and BrM vs. time. F) Total contact area between POS cells and BrM vs. time. The different colors represent the results of 10 simulation replicas of the adhesion scenario (RRI = 1, RRp = 1, RBI = 2, RBp = 2, ROI = 3) (Table S10, adhesion scenario ID: 53). (A, B, C) CNV initiates in all replicas and all replicas develop ET3 CNV. During the first month after initiation, stalk cells gradually invade both the sub-RPE space and the sub-retinal space, with more invading the sub-RPE space. Between months 1 and 2 about 30% of the sub-RPE stalk cells transmigrate into the sub-retinal space. After month 3, the number of sub-RPE stalk cells increases slowly, while the number of sub-retinal stalk cells remains constant. (E) During the first month of the simulation, the contact area between the RPE and BrM rapidly decreases as stalk cells invade the sub-RPE space. Between months 1 and 2, the contact area between the RPE and BrM rapidly increases as sub-RPE stalk cells transmigrate into the sub-retinal space. The contact area between the RPE and BrM slowly decreases after month 3 throughout the simulated year. (D) A few RPE cells die in most replicas. (F) In a few replicas the POS persistently contacts BrM, as the RPE develops small holes.

tose damaged photoreceptors during the first three weeks. Subretinal CNV follows about 3 months after the beginning of treatment. Because RPE cells with normal epithelial adhesion do not proliferate, we hypothesize that chemotoxicity in this animal model reduces RPE-RPE epithelial adhesion, allowing RPE cells to proliferate. Since the photoreceptors are damaged, we infer that RPE-POS adhesion is severely disrupted. BrM remains intact for the first 3 weeks of treatment. Initial signs of BrM invasion by RPE cells and ECs appear about 3 months after the beginning of treatment. Due to newly synthesized extracellular matrix at the location of the CNV, the RPE basement membrane and BrM become irregular after 6 months, with bundles of extracellular microfilaments connecting RPE basement membrane to BrM. These modifications of the RPE basement membrane and BrM, suggest that RBaM-BrM adhesion is initially normal and gradually decreases to moderately impaired over a period of six months. These adhesion impairments resemble adhesion impairments in younger patients with inflammation. For these adhesion scenarios (Table 6, Early Type 2 CNV sub-class 1 and 2) our simulations always predict early sub-retinal CNV, in agreement with experiments.

**Iatrogenic CNV.** Iatrogenic sub-retinal CNV may develop after laser photocoagulation treatment of diabetic macular edema, central serous retinopathy, proliferative diabetic retinopathy, choroidal vascular and neoplastic lesions, vascular occlusive disease and degenerative retinal-pigment-epithelium disorders (reviewed in [82]). Some believed that the primary mechanism for such iatrogenic induction of sub-retinal CNV to be the creation

of breaks in Bruch's membrane, with inflammatory cells, angiogenic factors and choroidal ischemia contributing to the development of CNV in some cases [82]. However, we believe that RPE phototoxicity due to excess (focal) laser exposure is more likely primary cause. Phototoxicity stresses RPE cells which can decrease RPE-RPE epithelial adhesion and RPE-POS adhesion and also promote excess expression of VEGF-A by RPE cells. This condition of pathologies is similar to those caused by inflammation, so we would expect these classes of iatrogenic CNV to resemble inflammation-induced CNV, as is indeed observed.

CNV to sub-retinal injections in animal Subretinal injections in most animal models (Table 1) lead to sub-retinal CNV adjacent to the site of injection within weeks, but not to sub-RPE CNV [83-85]. CNV initiation probability depends on the type and amount of material injected (Matrigel, polystyrene beads suspended in liquid, vitreous humor, ...) (see [46], for a detailed review). Secondary sub-RPE CNV may follow sub-retinal CNV in some animal models, e.g., in a rabbit model [86], a sub-retinal injection of a cocktail containing endotoxins and growth-factors, incorporated in heparin-sepharose leads rapidly to primary sub-retinal CNV and secondary sub-RPE CNV forms farther from site of injection between 2 weeks and 8 months later [86]. The mechanisms leading to this secondary sub-RPE CNV are not well understood. Ni et al. [86] believed that the major factors were changes in RPE cell function due to diffusion of soluble mediators originating from the area of primary CNV, e.g. from atrophied primary RPE cells or newly-formed activated secondary RPE cells or changes in function of endothelial cells,

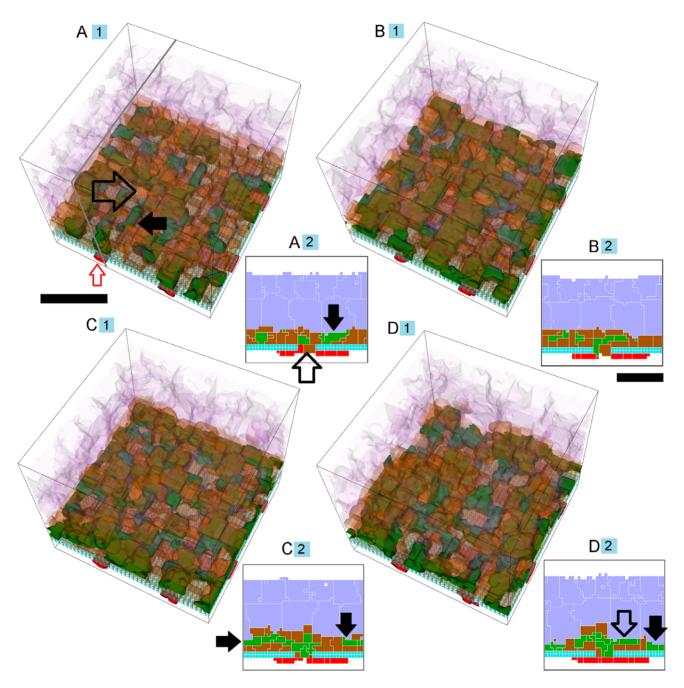


Figure 19. Snapshots of a simulation replica exhibiting stable Type 3 CNV (S33 CNV). 3D and 2D visualization of a simulation replica developing S33 CNV in one simulated year (RRI = 1, RRp = 1, RBp = 2, RBp = 2, ROI = 3) (adhesion scenario ID: 53, simulation ID: 917). Snapshots of the simulation at months 1 (A), 2 (B), 6 (C) and 12 (D). (A2-D2) Cross-sections of (A1-D1). All cross-section planes in (A1-D1) panels defined by the two thick black lines in A1. (A) Stalk cells invade the sub-RPE space through a hole in BrM (A1-2, black outline arrows) that the tip cell form during the first 24 hours of the simulation. These stalk cells then form a fully developed sub-RPE capillary network. (A2) Only a few stalk cells (black arrow, A1-2) reach the sub-retinal space during the first month. (B1, C1) The sub-retinal and sub-RPE capillary networks do not grow significantly. (C2) A capillary (black arrows), enveloped by a bilayer of RPE cells, connects the sub-retinal space to the CC via the hole in BrM (D) Stalk cells disrupt the RPE, forming small holes in the RPE (D2, black arrow). The stalk cells at the location of the hole in the RPE (D2, black arrow) contact both the POSs and BrM. The black outline arrow shows sub-retinal stalk cells. Cell type colors: 1) POS and PIS: light purple, 2) RPE: brown, 3) Stalk cells: green, 4) Vascular cells (CC): red, 5) BrM: light blue. Scale bar ~50 μm. We have rendered the boundaries of individual cells in A1-D1 as semi-transparent membranes. POS, PIS and RPE cells are rendered more transparent to show the underlying structures. See also Video S6. doi:10.1371/journal.pcbi.1002440.g019

photoreceptors and Müller cells in regions peripheral to the primary CNV, e.g., increased expression of FGF-1, FGF-2, TGF-alpha and VEGF.

Subretinal injections can cause acute physical retinal detachment, instantaneously destroying RPE-POS contact at the site of

injection. However, RPE active pumping and passive flow gradually remove the excess sub-retinal fluid, allowing the retina to reattach within a few days. Sub-retinal injection also almost always induces significant inflammation, which gradually reduces RPE-RPE epithelial adhesion over a period lasting a few days to a

few weeks. Such condition of transient detachment and followed by long-lasting inflammation induces RPE migration [83] and proliferation [86] (RPE activation). Because RPE cells neither proliferate nor migrate when they are in epithelium and RPE-RPE epithelial adhesion remain normal, the combination of RPE migration and proliferation suggest that RPE-RPE epithelial adhesion may decrease significantly over a period of a few days to a few weeks. Inflammation can also cause the death of

photoreceptors [81], suggesting prolonged disruption of RPE-POS contact. Sub-retinal injections can also directly cause focal rupture in all layers of BrM, suggesting that RBaM-BrM adhesion is initially (near) normal at least far from the location of the rupture.

Based on these experimental observations, sub-retinal injections appear mainly to impair RPE-RPE and RPE-POS adhesion comparable to the adhesion scenarios prone to **Early Type 2** 

Table 8. Geometrical and transport parameters.

Geometr	ical Parameters	
Name	Description	Values
Los	POS layer thickness	~30 µm (compare to [97])
L <sub>IS</sub>	PIS layer thickness	~24 µm (compare to [97])
L <sub>OLM</sub>	Location of OLM measured from RPE side of BrM	~67 µm (compare to [97])
$L_{BrM}$	BrM thickness	6 μm (compare to [24])
$L_{RPE}$	RPE thickness	12 μm (compare to [24])
Oxygen <sup>-</sup>	Transport Parameters	
Name	Description	Values
$D_{\text{ox}}$	Diffusion coefficient of oxygen in retinal tissue	2.0×10 <sup>-5</sup> cm <sup>2</sup> s <sup>-1</sup> [98]
$QO_{\mathrm{PIS}}$	Light-adapted (dark-adapted) Oxygen consumption per 100 g of PIS tissue	13 (26) ml O <sub>2</sub> min <sup>-1</sup> [47,48,99]
$PO_{ m N}^{ m CC}$	Oxygen partial pressure in choriocapillaries under normoxia	80 mmHg [48,99]
$PO_{ m H}^{ m CC}$	Oxygen partial pressure in choriocapillaries under systemic hypoxia	60 mmHg (extrapolated from rat [100])
$PO^{\mathrm{OLM}}$	Oxygen partial pressure at OLM under normoxia and hypoxia	18 mmHg [47]
$PO_{ m N}^{ m RPE}$	Average oxygen partial pressure in the <b>RPE</b> under normoxia	65 mmHg during light-adaptation, 61 mmHg during dark-adaptation (see Oxygen Transport Parameters in Text S3)
$PO_{ m H}^{ m RPE}$	Average oxygen partial pressure in the RPE under systemic hypoxia	49 mmHg during light-adaptation, 45 mmHg during dark-adaptation (see Oxygen Transport Parameters in Text S3)
$SC_{\mathrm{ox}}^{\mathrm{N}}$	Oxygen flux from 100 g of <b>choriocapillaris tissue</b> to the retina under normoxic condition	3.42 (CC3D) or 102 ml $\rm O_2$ (100 g tissue min) $^{-1}$ during dark-adaptatio 2.67 (CC3D) or 80 ml $\rm O_2$ (100 g tissue min) $^{-1}$ during light-adaptatio
$SC_{ m ox}^{ m H}$	Oxygen flux from 100 g of <b>choriocapillaris tissue</b> to the retina under systemic hypoxia	2.81 (CC3D) or 84 ml $\rm O_2$ (100 g tissue min) $^{-1}$ during dark-adaptatio 2.05 (CC3D) or 61 ml $\rm O_2$ (100 g tissue min) $^{-1}$ during light-adaptatio
VEGF Tra	ansport Parameters	
Name	Description	Values
γ <sub>VEGF</sub>	Decay rate of RPE-derived VEGF-A and short-diffusing VEGF-A	1 h <sup>-1</sup> [101,102]
$L_{ m VEGF}^{ m RPE}$	Diffusion length of RPE-derived VEGF-A secreted by RPE cells	13.4 $\mu m \left(\sqrt{\frac{D_{\mathrm{VEGF}}^{\mathrm{RPE}}}{\gamma_{\mathrm{VEGF}}}}\right)$
$D_{ m VEGF}^{ m EC}$	Diffusion coefficient of short- diffusing VEGF-A secreted by ECs	$0.25 \times 10^{-10} \text{ cm}^2 \text{ s}^{-1}$
$L_{ m VEGF}^{ m EC}$	Diffusion length of <b>short-diffusing VEGF-A</b> secreted by <b>ECs</b>	3 µm $\left(\sqrt{\frac{D_{\mathrm{VEGF}}^{\mathrm{EC}}}{\gamma_{\mathrm{VEGF}}}}\right)$
$SV_{\mathrm{max}}^{RPE}$	Secretion rate of VEGF by HRPE cells	$\sim$ 50 pg (cell h) $^{-1}$ (compare to [103]) (0.1 molecules (voxel MCS) $^{-1}$ )
$SV_{\mathrm{basal}}^{RPE}$	Basal secretion rate of VEGF by RPE cells	$\sim$ 25 pg (cell h) $^{-1}$ (compare to [103]) (0.05 molecules (voxel MCS) $^{-1}$
$SV^{\mathrm{EC}}$	Basal secretion rate of short-diffusing VEGF by ECs	$\sim$ 25 pg (cell h) <sup>-1</sup> (0.2 (voxel MCS) <sup>-1</sup> )
$QV_{\mathrm{EC}}$	Basal uptake rate of <b>RPE-derived VEGF-A</b> by <b>vascular cells</b>	~300 ligated molecules per EC $\times$ 2.8 $\times$ 10 <sup>-4</sup> (internalization rate) [104 ~0.084 molecule (cell sec) <sup>-1</sup> = 0.28 molecule (voxel MCS) <sup>-1</sup>
MMP Tra	ansport and BrM Degradation Parameters	
Name	Description	Values
C A ctin	Secretion rate of <b>MMP</b> by the <b>tip</b> cell	0.148 molecule (cell sec) <sup>-1</sup> (1 molecule (voxel MCS) <sup>-1</sup> )
$SM^{\text{tip}}$		
$L_{ m MMP}$	Diffusion length of <b>MMP</b> secreted by the <b>tip</b> cell	0.2 μm $\left(\sqrt{\frac{D_{\text{MMP}}}{\gamma_{\text{MMP}}}}\right)$

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**CNV** (Table 6, **Early Type 2 CNV** sub-class 1 and 2) and in inflammation-induced CNV in younger patients. Thus our simulations both agree with the cause, initiation and progression of sub-retinal CNV in these animal models.

Our simulations predict that for secondary sub-RPE CNV to develop near a pre-existing sub-retinal CNV RPE-BrM (RBaM-BrM) adhesion must be severely impaired, to develop, independent of the degree of impairment of other types of adhesion in the BrM-RPE-POS complex. To validate our prediction, experiments would need to examine in detail the interface between BrM and the RPE basement membrane in retinal regions far from site of injection and before any initiation of sub-RPE CNV.

In these animal models, sub-retinal injection often causes rapid (less than a month) CNV initiation. We can infer that injection impairs RPE-RPE adhesion because of observed inflammation and RPE proliferation and RPE-POS adhesion because of photoreceptor degradation [81,83,86]. In agreement with these experiments, our simulations show that severe impairment of RPE-RPE labile adhesion, when all other adhesions are normal (RRl = 1, RRp = RBl = RBp = ROl = 3) (Table S8, adhesion parameter set ID: 10), increases the probability of CNV initiation within a **month** to 100%. In our simulations prolonged impairment of RPE-POS labile adhesion when all other adhesions are normal (RRl = RRp = RBl = RBp = 3, ROl = 1) (Table S8, adhesion parameter set ID: 19) increases initiation probability to 50%, higher than observed for experimental RPE-POS detachment. This discrepancy may result from the long (up to six month) onset time for CNV in this adhesion scenario. Six months is much longer than the CNV initiation time due RPE-RPE adhesion impairment and the typical time for retinal reattachment and is too long to see in most experiments. Experiments exploring the effects of RPE-POS adhesion impairment on CNV would need to disrupt RPE-POS adhesion for several months without inducing severe inflammation, e.g. by subretinal injection of neutral polystyrene microbeads (coated with anti-inflammation compounds).

The role of overexpression of VEGF. We now consider how local cytokines and growth factors that can increase the chemotactic activity of endothelial cells could affect CNV initiation and progression. Our simulations did not explore the role of these factors on the chemotactic activity of ECs directly. However, our simulations using different VEGF-A levels suggest that increased chemotactic activity of **stalk cells** should increase the **CNV initiation** probability, as in our simulations in which **RPE** expresses **RPE-derived VEGF-A** at twice the normal level. We would also expect that if these factors were short-diffusing and thus formed local gradients, they should promote sub-RPE CNV if their source were localized in the sub-RPE space, or promote subretinal CNV if their source were localized in the sub-retinal space. If these factors were long-diffusing, we would expect that the resulting global increase in chemotactic activity of stalk cells would not affect either early or late CNV loci, only the probability of initiation and the rate of progression.

In transgenic mice with inducible expression of VEGF in their RPE cells, induction of excess VEGF only induces CNV if combined with sub-retinal injections which disrupt the RPE [13]. In our simulations, when **RPE** overexpresses **RPE-derived VEGF-A** at twice the normal level, the probability of CNV initiation increases (data not shown), but the **Early CNV** types and **CNV** dynamics do not change. Thus, our simulations show that VEGF overexpression can increase the CNV initiation probability, but does not determine either the early or late CNV loci

In experiments, ocular hypoxia caused by systemic hypoxia usually promotes retinal angiogenesis, but has no observed effect on the RPE and does not induce choroidal angiogenesis (reviewed in [40]). We do not know what levels of PO<sub>2</sub> can trigger hypoxic signaling by RPE cells. Based on experimentally-measured parameters, our simulations show that the PO2 at the RPE decrease from ~65 mmHg to ~49 mmHg when the PO<sub>2</sub> at the CC decreases from 80 mmHg to 60 mmHg during systemic hypoxia in the anatomically normal retina (under light-adapted condition). If we assume that biological RPE cells are hypoxic during systemic hypoxia, then the PO<sub>2</sub> below which RPE cells become hypoxic is 49 mmHg. However, PO<sub>2</sub>~50 mmHg is significantly higher than both PO<sub>2</sub>~20 mmHg, the typical PO<sub>2</sub> in the inner retina and PO<sub>2</sub>~1 mmHg, the PO<sub>2</sub> at which mitochondria work at their maximum metabolic rate. In our simulations, **RPE cells** become hypoxic (PO<sub>2</sub><49 mmHg) only after RPE detachment, a CNV-associated complication which we will discuss in a future paper. Thus, neither the threshold for RPE hypoxia nor RPE hypoxic signaling affects the results we present in this paper.

The nature of the BrM-RPE-POS complex barrier to CNV (activated ECs). As we discussed in the Angiogenic and Antiangiogenic factors section in supplementary Text S1, activated endothelial cells are present in the normal choriocapillaris, so the frequency of ECs crossing BrM is significant even in the normal eye. Clinically, the probability of CNV initiation before age 50 in a normal retina is negligible. Our adhesion-based hypotheses for CNV initiation and progression may resolve this discrepancy. In simulations when all adhesions are normal (referenced to a normal human eyes aged less than 50 years old) activated ECs and small holes in BrM never initiate CNV, suggesting that strong adhesion among BrM-RPE-POS components is the crucial mechanism preventing activated ECs from invading the sub-RPE and sub-retinal space once they have crossed BrM.

# **Future Directions and Suggestions**

Our current model does not include several mechanisms which may also be important to CNV. In future refinements, we will include multiple types of basal deposits and fibrosis (synthesis of new ECM) explicitly to clarify their role in the initiation and progression of CNV. We particularly are interested in how differences in the size and structure of soft and hard drusen affect the initiation and progression of CNV and the frequency of occurrence of RPE detachment and RPE tear formation after therapeutic intervention to treat CNV.

Many hypothesized mechanisms for CNV initiation and progression involve irregularities in transport. We plan more realistic models including capillary maturation, blood flow and

Table 9. Field object names.

Fields		
Name	Description	Units
$PO(\overrightarrow{x})$	<b>Oxygen</b> partial pressure at $\overrightarrow{x}$	mmHg
$V_{L}(\overrightarrow{x})$ $V_{S}(\overrightarrow{x})$	RPE-derived VEGF-A at $\overrightarrow{x}$	molecule/voxel
$V_{\mathbf{S}}(\overrightarrow{x})$	Short-diffusing VEGF-A secreted by ECs at $\overrightarrow{x}$	molecule/voxel
$M(\overrightarrow{x})$	<b>MMP</b> secreted by <b>tip cells</b> at $\overrightarrow{x}$	molecule/voxel

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**Table 10.** Labile adhesion parameters (contact energies).

Cell Types	Stalk	BrM	RPE	POS	PIS	Medium
Stalk	-20	-10	-10	-10	-10	3
BrM		-12	-38/-28/-18	0	0	-1
RPE			-40/-18	-16/-1	-16/-1	3
POS PIS				-16	-16	3
PIS					-16	3
Medium						0

Negative contact energies represent adhesive interactions; positive contact energies represent repulsive interactions. More negative contact energies indicate stronger adhesive interactions. (/) separates the reference, moderately impaired and severely impaired levels of **labile adhesion**. doi:10.1371/journal.pcbi.1002440.t010

retinal-CC fluid flow to study how oxygen, nutrient and waste transport promote or inhibit CNV.

Since cell adhesion is essential to multicellularity and is important in embryonic development, homeostatic maintenance of adult tissues and diseases like cancer, its importance in CNV is, perhaps, not surprising, given CNV's many parallels with tumorinduced angiogenesis. However, the role of adhesion in CNV has not been widely appreciated, so neither the relationship between known CNV risk factors and specific adhesion failures, nor the actual adhesivities in the retina and RPE have been quantified experimentally. Quantitative measurements of these adhesion properties and their regulation in the normal and pathological retina would allow more clinically relevant models. Such experiments would greatly reduce uncertainty in our model definition, improve our understanding of CNV initiation and progression. Since measuring adhesivities directly may be difficult, especially in humans, our model also allows us to quantify adhesion failures by looking at how they affect CNV initiation and progression and matching those computational outcomes with experimental observations, then correlating the simulated adhesion changes with experimental risk factors.

Beyond retinal CNV, our results on CNV initiation and epithelial breakdown apply to any tissue in which a basement membrane separates a capillary network from a nearby epithelium, e.g. lung and gut. We expect that the relationships between specific classes of adhesion failures and the loci and dynamics of CNV which we observe in our simulations should carry over to the neovascularization-dependent pathologies of those tissues.

Ultimately, a database of verified simulations for different adhesion scenarios might allow systematic CNV prediction based on clinically-measurable properties of the eye, especially if the adhesion properties can be inferred noninvasively, e.g. by measuring optically, changes in CC or RPE morphology or autofluorescence due to lipid accumulation. In the absence of direct measurements of adhesivity, our simulations allow us to infer adhesion defects from pathologies. For example, if a patient with a functional retina exhibits micro-detachments of the RPE (due to lipid accumulation or small soft drusen), the relationship between the number and degree of detachments and the underlying classes of adhesion failures predicts the probability of CNV initiation and the distribution of CNV onset times, making clinically-useful suggestions for frequency of follow-up examinations and possible prophylactic interventions. To aid diagnosis and treatment we can also develop statistical analyses of the most significant scenarios capable of producing the observed pattern of disruption in each patient (including the probability of initiation, the time of onset of progression and progression speed...). Followup observations could then narrow the range of admitted hypothetical scenarios to improve the accuracy of the prognosis. More accurate diagnoses may improve both administration of drugs and disease management.

One crucial aspect of a model-based approach to CNV diagnosis, prognosis and treatment is that both the simulation database and the statistical predictors could be continuously refined using feedback from both clinical and histopathological sources, so they would improve with use, providing a platform to integrate clinical and histopathological data for even more accurate diagnosis and prognosis.

#### Methods

Our simulations use the Glazier-Graner-Hogeweg model (*GGH*, also known as the Cellular Potts Model, *CPM*), a multi-cell, lattice-based, stochastic methodology which describes biological cells and their interactions in terms of *Effective Energies* and constraints [87]. GGH applications include models of vascular tumors [65], avascular tumor growth [88], biofilms [89], chick limb growth [90], somitogenesis [91], blood flow and thrombus development [92] and angiogenesis [66,71,93,94]. See supplementary Text S3 for details of implementation of objects and processes listed in Table 2. Tables 8–12 summarize the key variables and parameters in our simulations (see also Text S6 for simulation files used to run replicas of adhesion scenario ID: 38).

#### **Implementation**

All our simulations use the open-source CompuCell3D simulation environment (http://www.compucell3d.org/) [95]. We ran our simulations on a computer cluster (Quarry, Indiana University) using CompuCell3D v3.4.2. A typical simulation replica takes about 30 hours on a single core of a 2.0 GHz quad-core Intel

**Table 11.** Labile adhesion strengths (contact energies).

		Labile Adhesion S	Strength	
Cell-Type Pairs	Name	Normal: 3	Moderately Impaired: 2	Severely Impaired: 1
RPE-RPE	RRI	-40	-	-18
RPE-BrM	RBI	-38	-28	-18
RPE-POS	ROI	-16	-	-1
POS-POS	-	-16	-	-
PIS-PIS	-	-16	-	-

More negative contact energies indicate stronger adhesive interactions. (-) denotes **labile adhesion** strengths not used in our simulations. doi:10.1371/journal.pcbi.1002440.t011



**Table 12.** Plastic coupling strengths  $(\lambda_{\mathrm{plastic}}(\tau(\sigma), \tau(\rho)))$  links between cell-type pairs.

		Plastic Coupling S	trength	
Cell-Type Pairs	Name	Normal: 3	Impaired: 2	Severely Impaired: 1
RPE-RPE	RRp	300	60	30
RPE-BrM	RBp	300	60	30
POS-POS	-	30	-	-
PIS-PIS	÷	30	-	-
PIS-POS	-	30	-	-
Vascular-Vascular	-	200	-	-
Stalk-Vascular	-	150	-	-
Γip-Vascular	÷	50	-	-
Stalk-Stalk	-	50	-	-
Stalk-Tip	-	50	-	-
Vascular-BrM	-	200	-	-
Stalk-BrM		25	-	-
Tip-BrM	-	25	-	-

Larger plastic coupling strengths represent stiffer linear springs. (-) denotes values of  $\lambda_{\text{plastic}}(\tau(\sigma), \tau(\rho))$  not used in our simulations. doi:10.1371/journal.pcbi.1002440.t012

Xeon 5335 processor. We stored the **cell** and **field**-lattice configurations every 6 simulated **hours** and rendered each snapshot using the integrated post-processing rendering provided by CompuCell3D.

# **Supporting Information**

Table S1 Adhesion Scenarios with Infrequent or No CNV Initiation.

(PDF)

Table S2 Adhesion Scenarios Prone to Early Type 1 CNV (MW>0.9) if CNV Initiates.

Table S3 Adhesion Scenarios Prone to Early Type 2 CNV (MW<0.05) if CNV Initiates.  $(\mathrm{PDF})$ 

Table S4 Adhesion Scenarios Prone to Early Type 3 CNV (0.35<MW<0.65) if CNV initiates. (PDF)

Table S5 Adhesion Scenarios Prone to Stable Type 1 CNV (S11 CNV Probability>0.9).
(PDF)

Table S6 Adhesion Scenarios Prone to Sub-RPE to Sub-Retinal Translocation (T12 Translocation).

(PDF)

Table S7 Selected Adhesion Scenarios Prone to Sub-RPE to Sub-Retinal Progression (P13 Progression) (P13 Probability>0.7). (PDF)

Table S8 Adhesion Scenarios Prone to Stable Type 2 CNV (S22) (S22 Probability>0.9). (PDF)

Table S9 Adhesion Scenarios Prone to Sub-Retinal CNV to Sub-RPE CNV Progression (P23 CNV) (P23 Probability>0.6). (PDF)

Table S10 Adhesion Scenarios Prone to Stable Type 3 CNV (S33 CNV) (S33 Probability>0.9). (PDF)

**Text S1 Biological Components and Processes in CNV.** (PDF)

**Text S2 Simplifying Assumptions of Our Model.** (PDF)

Text S3 GGH Implementation of the Multi-cell Model.  $(\mbox{PDF})$ 

**Text S4 Modeling Terminology.** (PDF)

**Text S5 CNV Progression Dynamics.** (PDF)

Text S6 CompuCell3D Code to Simulate Adhesion Scenario ID: 38. (ZIP)

Video S1 Time-Series of a Simulation Replica with Stable Type 1 CNV. 3D visualization of a simulation replica exhibiting Stable Type 1 CNV over one simulated year (adhesion scenario ID: 38, simulation ID: 902) (RRl=3, RRp=3, RBl=2, RBp=2, ROl=3). Stalk cells invade the sub-RPE space through a hole in BrM that the tip cell opens during the first 24 hours. Stalk cells proliferate until they fill the sub-RPE space in month 9, after which proliferation slows down. The 45 stalk cells form a connected capillary network in the sub-RPE space. Cell type colors: 1) POS and PIS: light purple, 2) RPE: brown, 3) Stalk cells: green, 4) Vascular cells (CC): red, 5) BrM: light blue. We have rendered the boundaries of individual cells as semi-transparent membranes. POS, PIS and RPE cells are more transparent to show the underlying structures. (AVI)

Video S2 Time-Series of a Simulation Replica Showing Sub-RPE to Sub-Retinal Translocation (T12 Translocation). 3D visualization of a simulation replica exhibiting T12 CNV translocation during one simulated **year** (RRl = 3, RRp = 3,

RBl = 1, RBp = 1, ROl = 1) (adhesion scenario ID: 93, simulation ID: 849). Stalk cells invade the sub-RPE space through a hole in BrM and form a capillary network. All stalk cells remain in the **sub-RPE** space during the first 3 **months**. A few **vascular** cells fill the hole in **BrM** to connect **CNV** capillaries to the **CC**. Half of the stalk cells have crossed the RPE and transmigrated into the **sub-retinal** space by **month** 5, forming a new capillary network in the sub-retinal space. Most stalk cells have transmigrated into the sub-retinal space and the RPE has completely reattached to **BrM** by **month** 9. A few **vascular** cells of the CC have transmigrated into the sub-retinal space. The sub-retinal capillary network has fewer stalk cells than the capillary in **month** 9 since **stalk cells** that migrate into the retina far from the **RPE** die. **Cell type** colors: 1) **POS** and **PIS**: light purple, 2) RPE: brown, 3) Stalk cells: green (stalk cells in the **sub-retinal** space have lighter shading), 4) **Vascular cells** (CC): red, 5) BrM: light blue. We have rendered the boundaries of individual cells as semi-transparent membranes. **POS**, **PIS** and **RPE** cells are more transparent to show the underlying structures.

Video S3 Time-Series of a Simulation Replica Showing Sub-RPE CNV to Sub-Retinal CNV Progression (P13 **Progression**). 3D visualizations of a simulation replica exhibiting P13 CNV progression during one simulated year (RRl=1,RRp = 3, RBl = 1, RBp = 2, ROl = 3) (adhesion scenario ID: 83, simulation ID: 515). Stalk cells invade the sub-RPE space through a hole in **BrM** and form a capillary network. The **vascular cells** of the **CC** occupy the hole that the **tip cell** forms during the first 24 **hours** of the simulation, connecting the **CNV** capillaries to the CC. All stalk cells remain in the sub-RPE space during the first **month** of the simulation. **Month** 2: A few stalk cells cross the RPE into the sub-retinal space. Month 6: Additional stalk cells migrate into the sub-retinal space and form vascular cords. The stalk cells form a sub-RPE capillary network connected to a **sub-retinal** capillary network. **Cell type** colors: 1) POS and PIS: light purple, 2) RPE: brown, 3) Stalk cells: green (stalk cells in the sub-retinal space have lighter shading), 4) Vascular cells (CC): red, 5) BrM: light blue. We have rendered the boundaries of individual cells as semitransparent membranes. POS, PIS and RPE cells are more transparent to show the underlying structures. (AVI)

Video S4 Time-Series of a Simulation Replica Showing Stable Type CNV (S22 CNV). 3D visualization of a simulation replica showing S22 CNV in one simulated year (RRl=1, RRp=1, RBl=3, RBp=3, ROl=3) (adhesion scenario ID: 16, simulation ID: 556). Stalk cells invade the sub-retinal space through a hole in **BrM** and form a partially developed capillary network by month 2. CNV finishes sub-retinal invasion around month 5 and remains in the sub-retinal space throughout LT2 CNV. Cell type colors: 1) POS and PIS: light purple, 2) RPE: brown (stalk cells in the sub-retinal space have lighter shading), 3) Stalk cells: green, 4) Vascular cells (CC): red, 5)

#### References

- Carmeliet P (2005) Angiogenesis in life, disease and medicine. Nature 438: 932–936.
- Smith W, Assink J, Klein R, Mitchell P, Klaver CC, et al. (2001) Risk factors for age-related macular degeneration: Pooled findings from three continents. Ophthalmology 108: 697–704.
- Grossniklaus HE, Green WR (2004) Choroidal neovascularization. Am J Ophthalmol 137: 496–503.
- Liakopoulos S, Ongchin S, Bansal A, Msutta S, Walsh AC, et al. (2008) Quantitative
  optical coherence tomography findings in various subtypes of neovascular agerelated macular degeneration. Invest Ophthalmol Vis Sci 49: 5048–5054.

**BrM**: light blue. We have rendered the boundaries of individual cells as semi-transparent membranes. **POS**, **PIS** and **RPE** cells are more transparent to show the underlying structures. (AVI)

Video S5 Time-Series of a Simulation Replica Exhibiting Sub-Retinal CNV to Sub-RPE CNV Progression (P23 **CNV**). 3D visualization of a simulation replica forming **P23 CNV** in one simulated **year** (RRl=1, RRp=1, RBl=1, RBp=1,ROl=1) (adhesion scenario ID: 108, simulation ID: 1080). Stalk **cells** invade the **sub-retinal** space through the hole in **BrM** that the **tip cell** form during the first 24 **hours** of the simulation and form a fully developed **sub-retinal** capillary network by **month** 1. Only a few **stalk cells**, mostly near the hole in **BrM**, invade the **sub-RPE** space during the first **month**. Additional **stalk** cells invade the sub-RPE space by month 6, disrupting the RPE and causing a micro-tear. The POS contacts BrM at the location of the RPE tear. Cell type colors: 1) POS and PIS: light purple, 2) RPE: brown, 3) Stalk cells: green (stalk cells in the **sub-retinal** space have lighter shading), 4) **Vascular cells** (**CC**): red, 5) BrM: light blue. We have rendered the boundaries of individual cells as semi-transparent membranes. POS, PIS and **RPE** cells are more transparent to show the underlying structures. (AVI)

Video S6 Time-Series of a Simulation Replica Exhibiting Stable Type 3 CNV (S33 CNV). 3D visualization of a simulation replica developing S33 CNV in one simulated year (RRl=1, RRp=1, RBl=2, RBp=2, ROl=3) (adhesion scenario ID: 53, simulation ID: 917). Stalk cells invade the sub-RPE space through a hole in **BrM** that the **tip cell** form during the first 24 **hours** of the simulation. These **stalk cells** then form a fully developed **sub-RPE** capillary network by **month** 1. Only a few stalk cells reach the sub-retinal space during the first month. The sub-retinal and sub-RPE capillary networks do not grow significantly between **month** 1 and 2. **RPE cells** envelop stalk cells. Stalk cells disrupt the RPE, forming small holes in the **RPE**. **Cell type** colors: 1) **POS** and **PIS**: light purple, 2) RPE: brown, 3) Stalk cells: green, 4) Vascular cells (CC): red, 5) BrM: light blue. We have rendered the boundaries of individual cells as semi-transparent membranes. POS, PIS and **RPE** cells are more transparent to show the underlying structures. (AVI)

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#### **Author Contributions**

Conceived and designed the experiments: AS JAG JSG FF YJ HEG. Performed the experiments: AS. Analyzed the data: AS JAG. Contributed reagents/materials/analysis tools: AS MS. Wrote the paper: AS JAG.

- Group MPS (1996) Occult choroidal neovascularization. Influence on visual outcome in patients with age-related macular degeneration. Macular Photocoagulation Study Group. Arch Ophthalmol 114: 400–412.
- Lim JI, Tsong JW (2007) Exudative (neovascular) age-related macular degeneration. In: Lim JI, ed. Age-related macular degeneration: Informa Healthcare. pp 125–157.
- Spaide R, Armstrong D, Browne R (2003) Choroidal neovascularization in age-related macular degeneration—what is the cause? Retina 23: 595–614.
- Zarbin MA (2004) Current concepts in the pathogenesis of age-related macular degeneration. Arch Ophthalmol 122: 598–614.



- Bhutto IA, McLeod DS, Hasegawa T, Kim SY, Merges C, et al. (2006) Pigment epithelium-derived factor (PEDF) and vascular endothelial growth factor (VEGF) in aged human choroid and eyes with age-related macular degeneration. Exp Eye Res 82: 99–110.
- Holderfield MT, Hughes CC (2008) Crosstalk between vascular endothelial growth factor, notch, and transforming growth factor-beta in vascular morphogenesis. Circ Res 102: 637–652.
- Tamai K, Spaide RF, Ellis EA, Iwabuchi S, Ogura Y, et al. (2002) Lipid hydroperoxide stimulates subretinal choroidal neovascularization in the rabbit. Exp Eve Res 74: 301–308.
- Baffi J, Byrnes G, Chan CC, Csaky KG (2000) Choroidal neovascularization in the rat induced by adenovirus mediated expression of vascular endothelial growth factor. Invest Ophthalmol Vis Sci 41: 3582–3589.
- Oshima Y, Oshima S, Nambu H, Kachi S, Hackett SF, et al. (2004) Increased expression of VEGF in retinal pigmented epithelial cells is not sufficient to cause choroidal neovascularization. J Cell Physiol 201: 393–400.
- Johnson NF, Foulds WS (1977) Observations on the retinal pigment epithelium and retinal macrophages in experimental retinal detachment. Br J Ophthalmol 61: 564–572.
- Anderson DH, Stern WH, Fisher SK, Erickson PA, Borgula GA (1983) Retinal detachment in the cat: the pigment epithelial-photoreceptor interface. Invest Ophthalmol Vis Sci 24: 906–926.
- Anderson DH, Stern WH, Fisher SK, Erickson PA, Borgula GA (1981) The onset of pigment epithelial proliferation after retinal detachment. Invest Ophthalmol Vis Sci 21: 10–16.
- Schwesinger C, Yee C, Rohan RM, Joussen AM, Fernandez A, et al. (2001) Intrachoroidal neovascularization in transgenic mice overexpressing vascular endothelial growth factor in the retinal pigment epithelium. Am J Pathol 158: 1161–1172.
- Bhutto IA, Uno K, Merges C, Zhang L, McLeod DS, et al. (2008) Reduction of endogenous angiogenesis inhibitors in Bruch's membrane of the submacular region in eyes with age-related macular degeneration. Arch Ophthalmol 126: 670–678.
- An E, Lu X, Flippin J, Devaney JM, Halligan B, et al. (2006) Secreted proteome profiling in human RPE cell cultures derived from donors with age related macular degeneration and age matched healthy donors. J Proteome Res 5: 2599–2610.
- The Eye Disease Case-Control Study Group (1992) Risk factors for neovascular age-related macular degeneration. Arch Ophthalmol 110: 1701–1708.
- Yanjun Z, Guangyu L, Bin F, Qing W, Ving J, et al. (2007) Study of hypoxiainduced expression of HIF-lalpha in retina pigment epithelium. Bull Exp Biol Med 143: 323–327.
- Aiello LP, Northrup JM, Keyt BA, Takagi H, Iwamoto MA (1995) Hypoxic regulation of vascular endothelial growth factor in retinal cells. Arch Ophthalmol 113: 1538–1544.
- Spraul CW, Grossniklaus HE (1997) Characteristics of drusen and Bruch's membrane in postmortem eyes with age-related macular degeneration. Arch Ophthalmol 115: 267–273.
- Spraul CW, Lang GE, Grossniklaus HE, Lang GK (1999) Histologic and morphometric analysis of the choroid, Bruch's membrane, and retinal pigment epithelium in postmortem eyes with age-related macular degeneration and histologic examination of surgically excised choroidal neovascular membranes. Surv Ophthalmol 44: 10–32.
- Hussain AA, Starita C, Marshall J (2004) Transport characteristics of aging human Bruch's membrane: implications for age-related macular degeneration.
   In: Ioseliani O, ed. Focus on Macular Degeneration Research (AMD) Nova Biomedical Books. pp 59–113.
- Chong NH, Keonin J, Luthert PJ, Frennesson CI, Weingeist DM, et al. (2005)
  Decreased thickness and integrity of the macular elastic layer of Bruch's
  membrane correspond to the distribution of lesions associated with age-related
  macular degeneration. Am J Pathol 166: 241–251.
- Crane IJ, Liversidge J (2008) Mechanisms of leukocyte migration across the blood-retina barrier. Semin Immunopathol 30: 165–177.
- Shaw SK, Bamba PS, Perkins BN, Luscinskas FW (2001) Real-time imaging of vascular endothelial-cadherin during leukocyte transmigration across endothelium. J Immunol 167: 2323–2330.
- Heriot WJ, Henkind P, Bellhorn RW, Burns MS (1984) Choroidal neovascularization can digest Bruch's membrane. A prior break is not essential. Ophthalmology 91: 1603–1608.
- Ryan SJ (1979) The development of an experimental model of subretinal neovascularization in disciform macular degeneration. Trans Am Ophthalmol Soc 77: 707–745.
- Booij JC, Baas DC, Beisekeeva J, Gorgels TG, Bergen AA (2010) The dynamic nature of Bruch's membrane. Prog Retin Eye Res 29: 1–18.
- Korte GE, Pua F (1988) Choriocapillaris regeneration in the rabbit: a study with vascular casts. Acta Anat (Basel) 133: 224–228.
- Tezel TH, Del Priore LV, Kaplan HJ (2004) Reengineering of aged Bruch's membrane to enhance retinal pigment epithelium repopulation. Invest Ophthalmol Vis Sci 45: 3337–3348.
- Gullapalli VK, Sugino IK, Van Patten Y, Shah S, Zarbin MA (2005) Impaired RPE survival on aged submacular human Bruch's membrane. Exp Eye Res 80: 235–248.

- Sarks SH, Arnold JJ, Killingsworth MC, Sarks JP (1999) Early drusen formation in the normal and aging eye and their relation to age related maculopathy: a clinicopathological study. Br J Ophthalmol 83: 358–368.
- Sarks SH, Van Driel D, Maxwell L, Killingsworth M (1980) Softening of drusen and subretinal neovascularization. Trans Ophthalmol Soc UK 100: 414–422.
- Sarks JP, Sarks SH, Killingsworth MC (1994) Evolution of soft drusen in agerelated macular degeneration. Eye (Lond) 8: 269–283.
- Marmor MF (1990) Control of subretinal fluid: experimental and clinical studies. Eye (Lond) 4: 340–344.
- Putting BJ, Zweypfenning RC, Vrensen GF, Oosterhuis JA, van Best JA (1992)
   Blood-retinal barrier dysfunction at the pigment epithelium induced by blue light. Invest Ophthalmol Vis Sci 33: 3385–3393.
- Kaur C, Foulds WS, Ling EA (2008) Blood-retinal barrier in hypoxic ischaemic conditions: basic concepts, clinical features and management. Prog Retin Eye Res 27: 622–647.
- Simo R, Villarroel M, Corraliza L, Hernandez C, Garcia-Ramirez M (2010)
   The retinal pigment epithelium: something more than a constituent of the blood-retinal barrier. J Biomed Biotechnol 2010: 190724.
- Imamura Y, Noda S, Hashizume K, Shinoda K, Yamaguchi M, et al. (2006)
   Drusen, choroidal neovascularization, and retinal pigment epithelium dysfunction in SOD1-deficient mice: a model of age-related macular degeneration. Proc Natl Acad Sci U S A 103: 11282–11287.
- Rudolf M, Malek G, Messinger JD, Clark ME, Wang L, et al. (2008) Subretinal drusenoid deposits in human retina: organization and composition. Exp Eye Res 87: 402–408.
- Zweifel SA, Imamura Y, Spaide TC, Fujiwara T, Spaide RF (2010) Prevalence and significance of subretinal drusenoid deposits (reticular pseudodrusen) in age-related macular degeneration. Ophthalmology 117: 1775–1781.
- Arnold JJ, Sarks SH, Killingsworth MC, Sarks JP (1995) Reticular pseudodrusen. A risk factor in age-related maculopathy. Retina 15: 183–191.
- Grossniklaus HE, Kang SJ, Berglin L (2010) Animal models of choroidal and retinal neovascularization. Prog Retin Eye Res 29: 500–519.
- Haugh LM, Linsenmeier RA, Goldstick TK (1990) Mathematical models of the spatial distribution of retinal oxygen tension and consumption, including changes upon illumination. Ann Biomed Eng 18: 19–36.
- Roos MW (2004) Theoretical estimation of retinal oxygenation during retinal artery occlusion. Physiol Meas 25: 1523–1532.
- Owen MR, Alarcon T, Maini PK, Byrne HM (2009) Angiogenesis and vascular remodelling in normal and cancerous tissues. Math Biol 58: 689–721.
- Szczerba D, Szekely G (2005) Computational model of flow-tissue interactions in intussusceptive angiogenesis. J Theor Biol 234: 87–97.
- Perfahl H, Byrne HM, Chen T, Estrella V, Alarcon T, et al. (2011) Multiscale modelling of vascular tumour growth in 3D: the roles of domain size and boundary conditions. PLoS One 6: e14790.
- Bartha K, Rieger H (2006) Vascular network remodeling via vessel cooption, regression and growth in tumors. J Theor Biol 241: 903–918.
- Welter M, Bartha K, Rieger H (2008) Emergent vascular network inhomogeneities and resulting blood flow patterns in a growing tumor. J Theor Biol 250: 257–280.
- Welter M, Bartha K, Rieger H (2009) Vascular remodelling of an arteriovenous blood vessel network during solid tumour growth. J Theor Biol 259: 405–422.
- McDougall SR, Anderson AR, Chaplain MA (2006) Mathematical modelling of dynamic adaptive tumour-induced angiogenesis: clinical implications and therapeutic targeting strategies. J Theor Biol 241: 564–589.
- Stephanou A, McDougall SR, Anderson ARA (2005) Mathematical Modelling of Flow in 2D and 3D Vascular Networks: Applications to Anti-Angiogenic and Chemotherapeutic Drug Strategies. Math Comput Model 41: 1137–1156.
- Stephanou A, McDougall SR, Anderson ARA (2006) Mathematical modelling of the influence of blood rheological properties upon adaptative tumourinduced angiogenesis. Math Comput Model 44: 96–123.
- Pries AR, Secomb TW, Gaehtgens P (1996) Biophysical aspects of blood flow in the microvasculature. Cardiovasc Res 32: 654–667.
- Pries AR, Secomb TW (2005) Control of blood vessel structure: insights from theoretical models. Am J Physiol Heart Circ Physiol 288: 1010–1015.
- Pries AR, Secomb TW (2008) Modeling structural adaptation of microcirculation. Microcirculation 15: 753–764.
- Pries AR, Hopfner M, le Noble F, Dewhirst MW, Secomb TW (2010) The shunt problem: control of functional shunting in normal and tumour vasculature. Nat Rev Cancer 10: 587–593.
- Macklin P, McDougall S, Anderson AR, Chaplain MA, Cristini V, et al. (2009) Multiscale modelling and nonlinear simulation of vascular tumour growth. J Math Biol 58: 765–798.
- Martin G, Schlunck G, Hansen LL, Agostini HT (2004) Differential expression of angioregulatory factors in normal and CNV-derived human retinal pigment epithelium. Graefes Arch Clin Exp Ophthalmol 242: 321–326.
- Kliffen M, Sharma HS, Mooy CM, Kerkvliet S, de Jong PT (1997) Increased expression of angiogenic growth factors in age-related maculopathy. Br J Ophthalmol 81: 154–162.
- Shirinifard A, Gens JS, Zaitlen BL, Poplawski NJ, Swat M, et al. (2009) 3D multi-cell simulation of tumor growth and angiogenesis. PLoS One 4: e7190.



- Bauer AL, Jackson TL, Jiang Y (2007) A cell-based model exhibiting branching and anastomosis during tumor-induced angiogenesis. Biophys J 92:
- 67. Zhang SX, Ma JX (2007) Ocular neovascularization: implication of endogenous angiogenic inhibitors and potential therapy. Prog Retin Eye Res 26: 1-37
- Chaplain MA, McDougall SR, Anderson AR (2006) Mathematical modeling of 68. tumor-induced angiogenesis. Annu Rev Biomed Eng 8: 233-257
- Jackson T, Zheng X (2010) A cell-based model of endothelial cell migration, proliferation and maturation during corneal angiogenesis. Bull Math Biol 72:
- Qutub AA, Mac Gabhann F, Karagiannis ED, Vempati P, Popel AS (2009) 70. Multiscale models of angiogenesis. IEEE Eng Med Biol Mag 28: 14-31.
- 71. Merks RM, Perryn ED, Shirinifard A, Glazier JA (2008) Contact-inhibited chemotaxis in de novo and sprouting blood-vessel growth. PLoS Comput Biol 4: e1000163.
- Yoder MC (2010) Is endothelium the origin of endothelial progenitor cells? Arterioscler Thromb Vasc Biol 30: 1094-1103.
- Yoder MC, Mead LE, Prater D, Krier TR, Mroueh KN, et al. (2007) 73 Redefining endothelial progenitor cells via clonal analysis and hematopoietic stem/progenitor cell principals. Blood 109: 1801-1809.
- 74. Klein R, Klein BE, Tomany SC, Meuer SM, Huang GH (2002) Ten-year incidence and progression of age-related maculopathy: The Beaver Dam eye study. Ophthalmology 109: 1767-1779.
- Cousins SW, Espinosa-Heidmann DG, Alexandridou A, Sall J, Dubovy S, et al. (2002) The role of aging, high fat diet and blue light exposure in an experimental mouse model for basal laminar deposit formation. Exp Eye Res 75: 543-553.
- Stevens TS, Bressler NM, Maguire MG, Bressler SB, Fine SL, et al. (1997) Occult choroidal neovascularization in age-related macular degeneration. A natural history study. Arch Ophthalmol 115: 345-350.
- Wong TY, Chakravarthy U, Klein R, Mitchell P, Zlateva G, et al. (2008) The natural history and prognosis of neovascular age-related macular degeneration: a systematic review of the literature and meta-analysis. Ophthalmology 115:
- Polito A, Isola M, Lanzetta P, Gregori D, Bandello F (2006) The natural history of occult choroidal neovascularisation associated with age-related macular degeneration. A systematic review. Ann Acad Med Singapore 35:
- 79. Grossniklaus HE, Gass JD (1998) Clinicopathologic correlations of surgically excised type 1 and type 2 submacular choroidal neovascular membranes. Am J Ophthalmol 126: 59-69.
- Spaide RF (1999) Choroidal neovascularization in younger patients. Curr Opin Ophthalmol 10: 177-181.
- Orzalesi N, Migliavacca L, Miglior S (1994) Subretinal neovascularization after naphthalene damage to the rabbit retina. Invest Ophthalmol Vis Sci 35: 696-705
- 82. Lim JI (1999) Iatrogenic choroidal neovascularization. Surv Ophthalmol 44:
- Baba T, Bhutto IA, Merges C, Grebe R, Emmert D, et al. (2010) A rat model for choroidal neovascularization using subretinal lipid hydroperoxide injection. Am J Pathol 176: 3085-3097.
- Kimura H, Sakamoto T, Hinton DR, Spee C, Ogura Y, et al. (1995) A new model of subretinal neovascularization in the rabbit, Invest Ophthalmol Vis Sci 36: 2110-2119

- Qiu G, Stewart JM, Sadda S, Freda R, Lee S, et al. (2006) A new model of experimental subretinal neovascularization in the rabbit. Exp Eye Res 83: 141 - 152
- Ni M, Holland M, Jarstadmarken H, De Vries G (2005) Time-course of experimental choroidal neovascularization in Dutch-Belted rabbit: clinical and histological evaluation. Exp Eye Res 81: 286-297.
- Glazier JA, Graner F (1993) Simulation of the differential adhesion driven rearrangement of biological cells. Physical Review E 47: 2128-2154.
- Popławski NJ, Agero U, Gens JS, Swat M, Glazier JA, et al. (2009) Front instabilities and invasiveness of simulated avascular tumors. Bull Math Biol 71:
- Popławski NJ, Shirinifard A, Swat M, Glazier JA (2008) Simulation of singlespecies bacterial-biofilm growth using the Glazier-Graner-Hogeweg model and the CompuCell3D modeling environment. Math Biosci Eng 5: 355-388.
- Popławski NJ, Swat M, Gens JS, Glazier JA (2007) Adhesion between cells, diffusion of growth factors, and elasticity of the AER produce the paddle shape of the chick limb. Physica A 373: 521-532.
- Glazier JA, Zhang Y, Swat M, Zaitlen B, Schnell S (2008) Coordinated action of N-CAM, N-cadherin, EphA4, and ephrinB2 translates genetic prepatterns into structure during somitogenesis in chick. Curr Top Dev Biol 81: 205-247.
- Xu Z, Chen N, Shadden SC, Marsden JE, Kamocka MM, et al. (2009) Study of blood flow impact on growth of thrombi using a multiscale model. Soft Matter 5: 769-779.
- Merks RMH, Brodsky SV, Goligorksy MS, Newman SA, Glazier JA (2006) Cell elongation is key to in silico replication of in vitro vasculogenesis and subsequent remodeling. Dev Biol 289: 44-54.
- 94. Merks RMH, Glazier JA (2006) Dynamic mechanisms of blood vessel growth. Nonlinearity 19: 1-10.
- Swat MH, Hester SD, Balter AI, Heiland RW, Zaitlen BL, et al. (2009) 95. Multicell simulations of development and disease using the CompuCell3D simulation environment. Methods Mol Biol 500: 361-428.
- Cohen SY, Dubois L, Tadayoni R, Delahaye-Mazza C, Debibie C, et al. (2007) Prevalence of reticular pseudodrusen in age-related macular degeneration with newly diagnosed choroidal neovascularisation. Br J Ophthalmol 91: 354-359.
- Bagci AM, Shahidi M, Ansari R, Blair M, Blair NP, et al. (2008) Thickness profiles of retinal layers by optical coherence tomography image segmentation. Am J Ophthalmol 146: 679-687.
- Pogue BW, Paulsen KD, O'Hara JA, Wilmot CM, Swartz HM (2001) Estimation of oxygen distribution in RIF-1 tumors by diffusion model-based interpretation of pimonidazole hypoxia and Eppendorf measurements. Radiat Res 155: 15-25
- Roos MW (2007) Theoretical estimation of retinal oxygenation during retinal detachment. Comput Biol Med 37: 890-896
- Shahidi M, Wanek J, Blair NP, Mori M (2009) Three-dimensional mapping of chorioretinal vascular oxygen tension in the rat. Invest Ophthalmol Vis Sci 50: 820-825
- Serini G, Ambrosi D, Giraudo E, Gamba A, Preziosi L, et al. (2003) Modeling the early stages of vascular network assembly. EMBO J 22: 1771-1779.
- 102. Chen R, Silva E, Yuen W, Brock A, Fischbach C, et al. (2007) Integrated approach to designing growth factor delivery systems. FASEB J 21: 3896-3903.
- 103. Leith JT, Michelson S (1995) Secretion rates and levels of vascular endothelial growth factor in clone A or HCT-8 human colon tumour cells as a function of oxygen concentration. Cell Prolif 28: 415-430.
- 104. Mac Gabhann F, Ji JW, Popel AS (2006) Computational model of vascular endothelial growth factor spatial distribution in muscle and pro-angiogenic cell therapy. PLoS Comput Biol 2: e127.