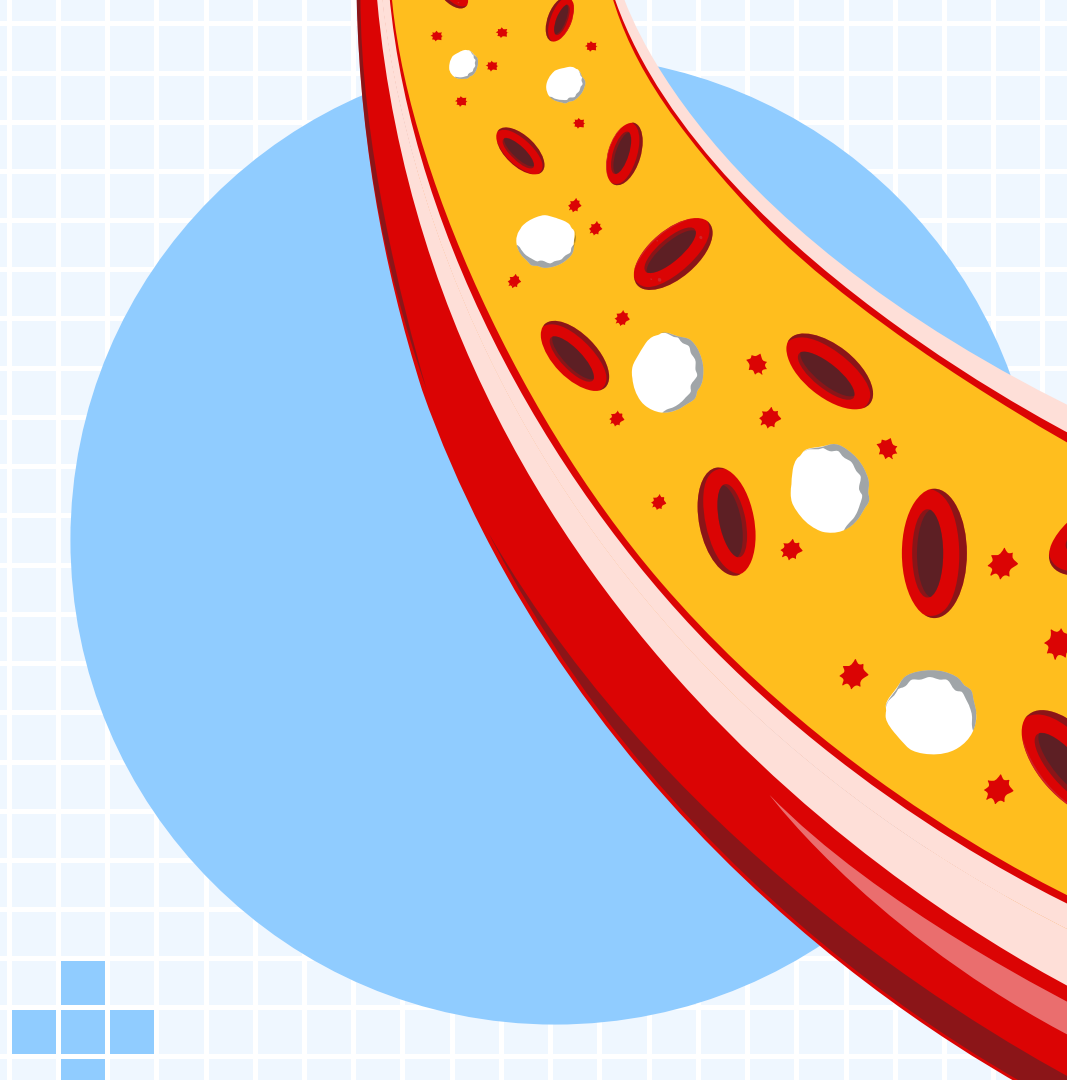


# No Vein No Gain: Modeling Angiogenesis

**Group 13**

Fabian Ivulic, Costanza D'Ercole,  
Noa Roebersen, and Sophie Engels



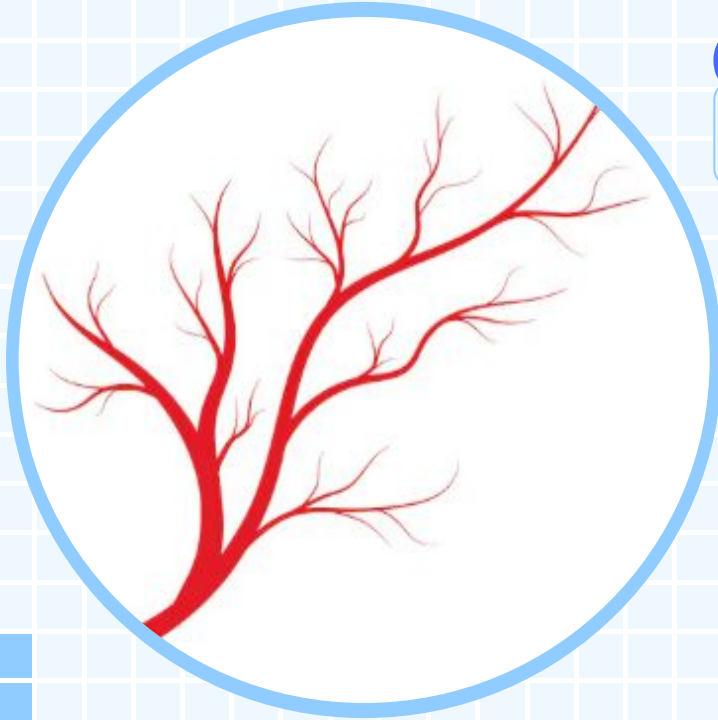


# Background

Modeling Angiogenesis:  
Understanding Tumor Growth through VEGF Dynamics

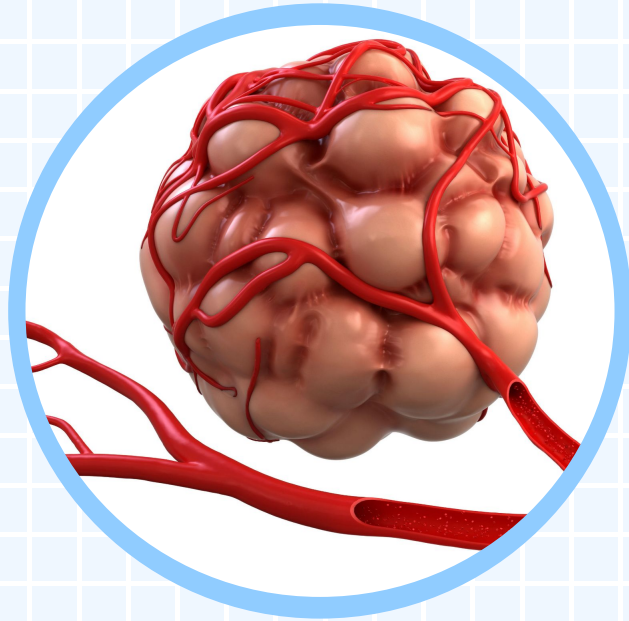
# What to examine?

**Angiogenesis:** the growth of blood vessels.



- Scale-invariance
- Power law
- Various control parameters

# VEGF and Tumor Growth



- Vascular endothelial growth factor (**VEGF**)
- Signaling molecule
- VEGF-based bias
- Eventually tumor growth

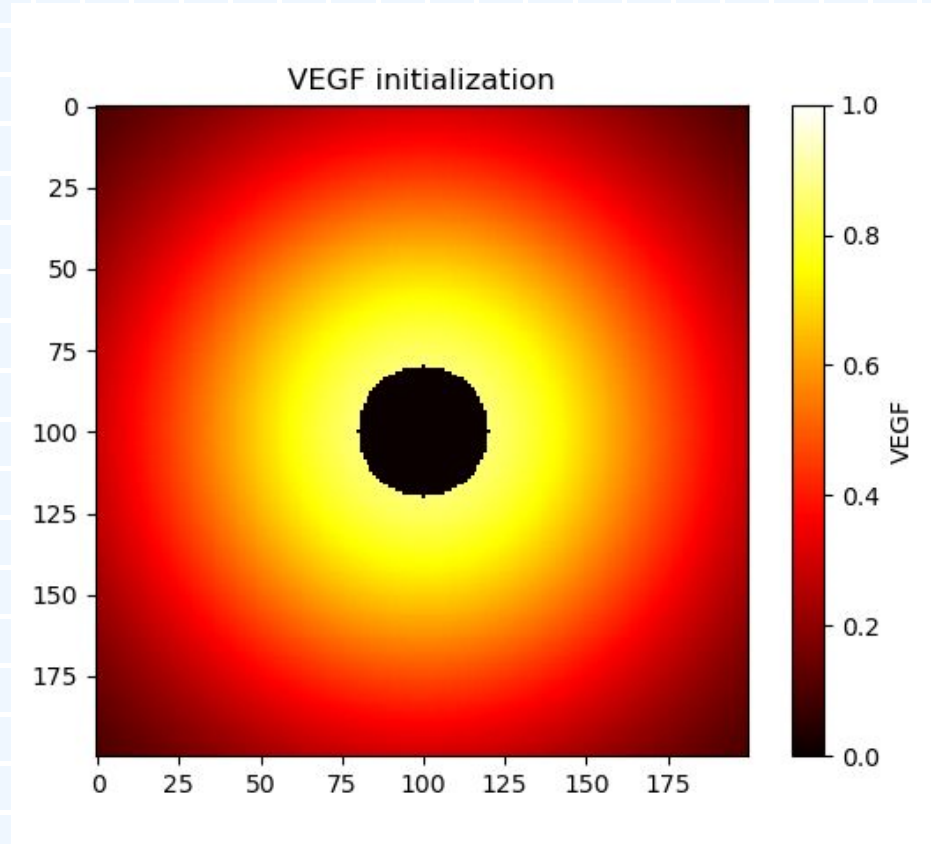


02

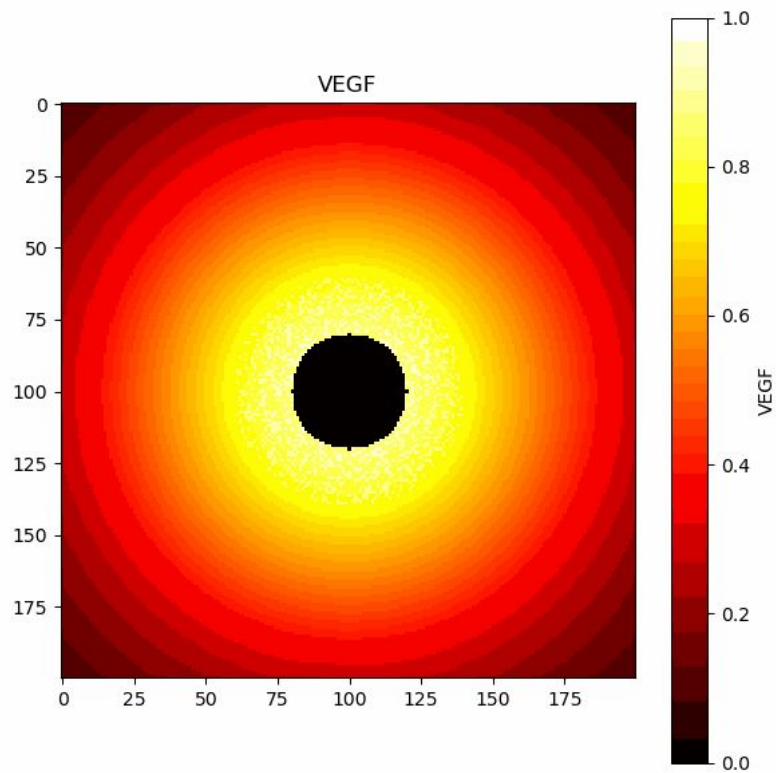
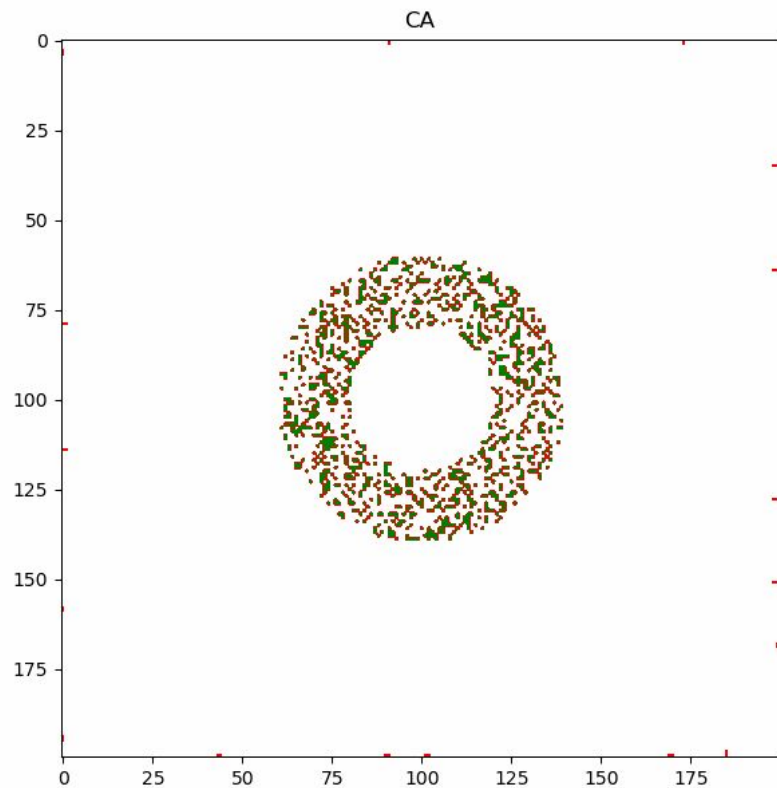
# Model Design and Implementation

Modeling Angiogenesis:  
Understanding Tumor Growth through VEGF Dynamics

# Initialization



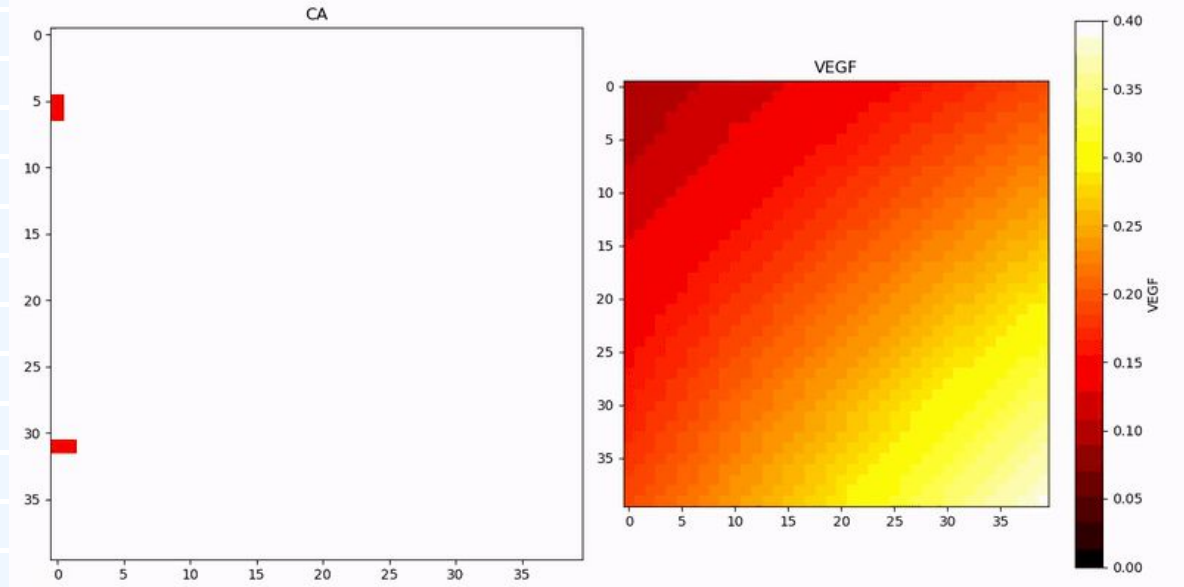
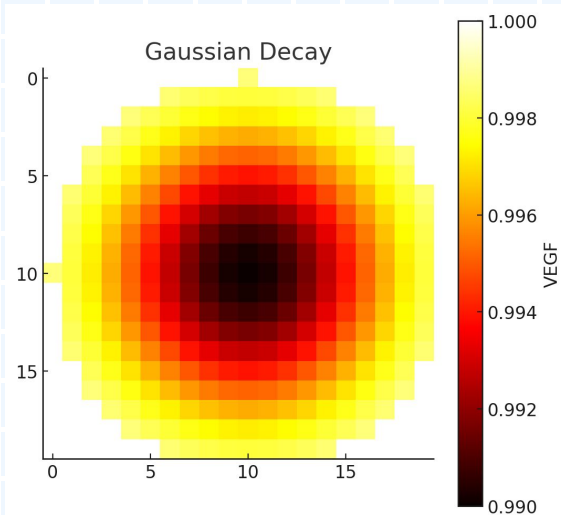
# The Model



# Vessel Growth and Gaussian VEGF Decay

Probability of growing to  
neighbor cell x,y

$$P(x,y) = U(0,1) * (1 - \text{bias\_factor}) \\ + \text{VEGF}(x,y) * \text{bias\_factor}$$



$$w(d) = e^{-\frac{d^2}{2\sigma^2}} \quad \sigma = 10/2, \quad d = 10$$

$$\text{VEGF}(x,y) = \max(0, \text{VEGF}(x,y) * (1 - w(d) * 0.01))$$



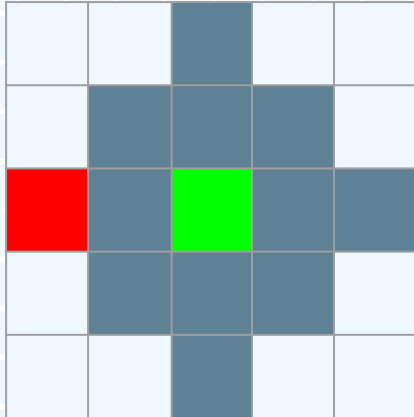
# Growth and Death of Proliferating Tumor Cells

$$P(\text{static}) = 1 - p$$

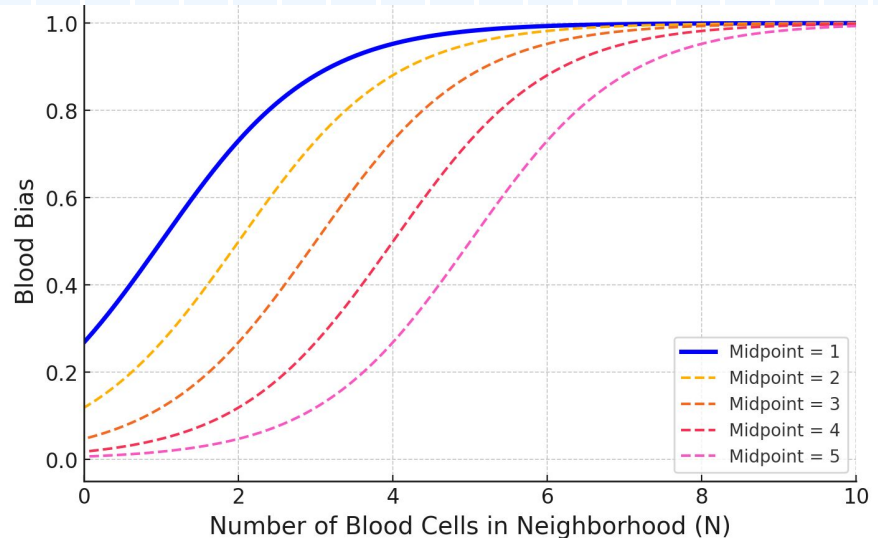
$$P(\text{death}) = p \times (1 - \text{blood\_bias})$$

$$P(\text{division}) = p \times \text{blood\_bias}$$

Von Neumann  
Neighborhood  
( $r = 2$ )

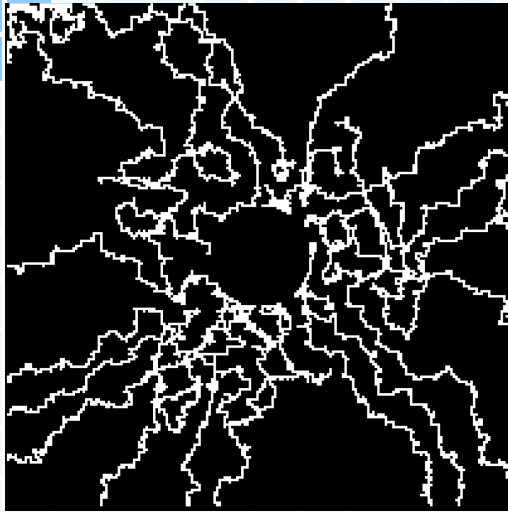


$$\text{blood\_bias}(N) = \frac{1}{1 + e^{-(N - \text{midpoint})}}$$

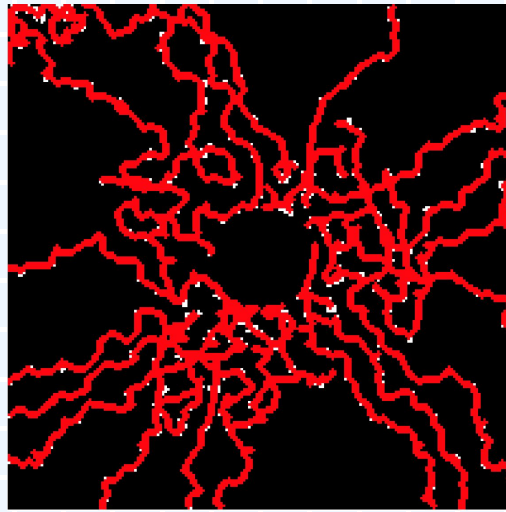


# Image Processing and Vessel Network Creation

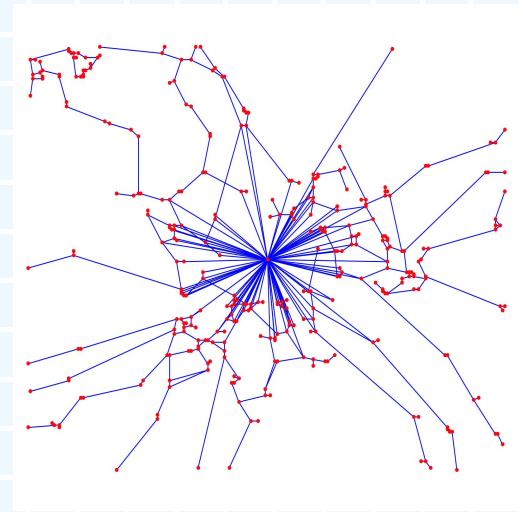
**Binary Image**



**Skeletonized Image**



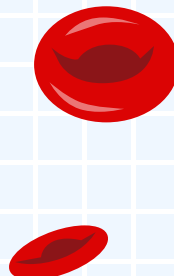
**Estimated Network**



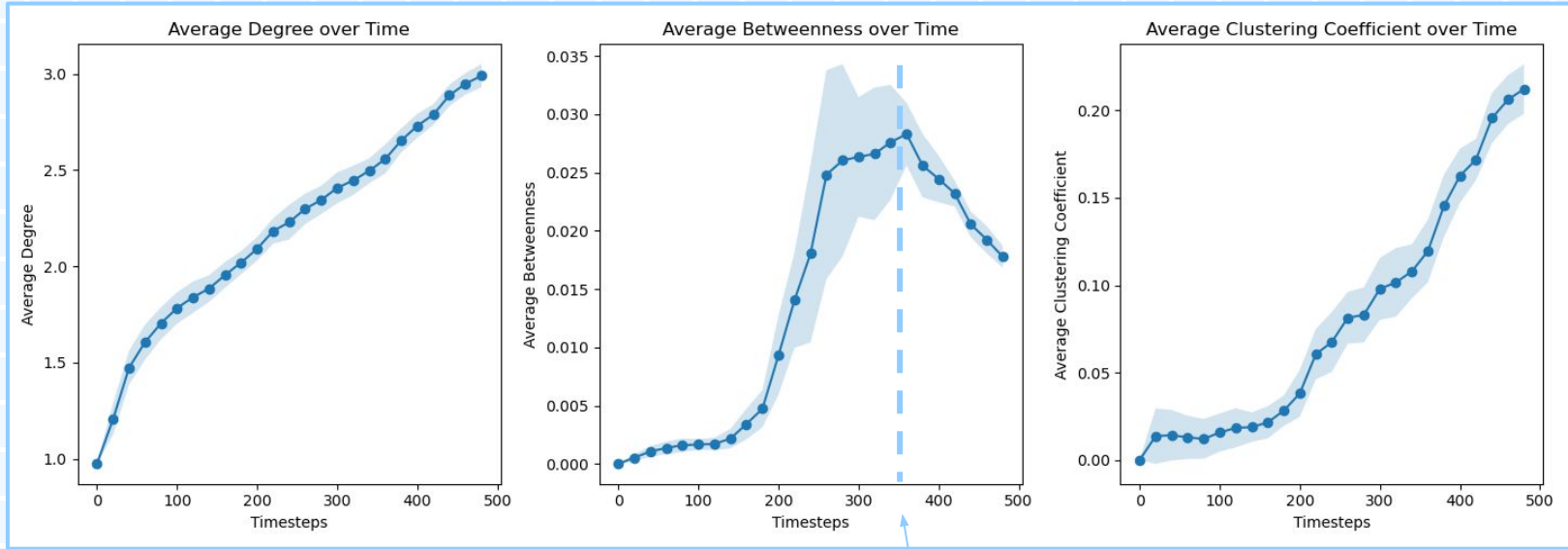


03

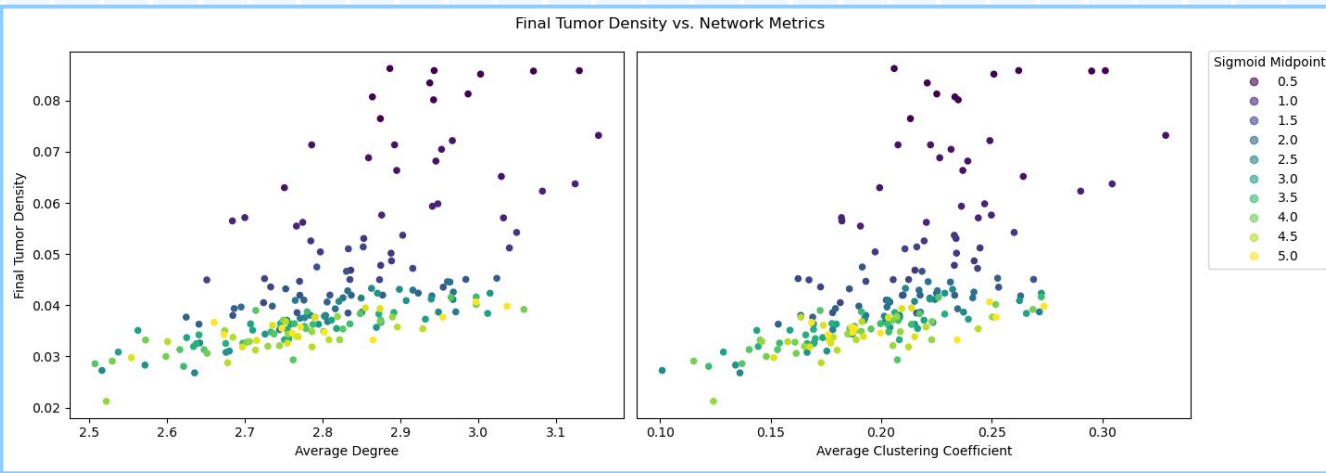
# **Results: Tumor and Vessel Growth Analysis**



# Network Measures over Time



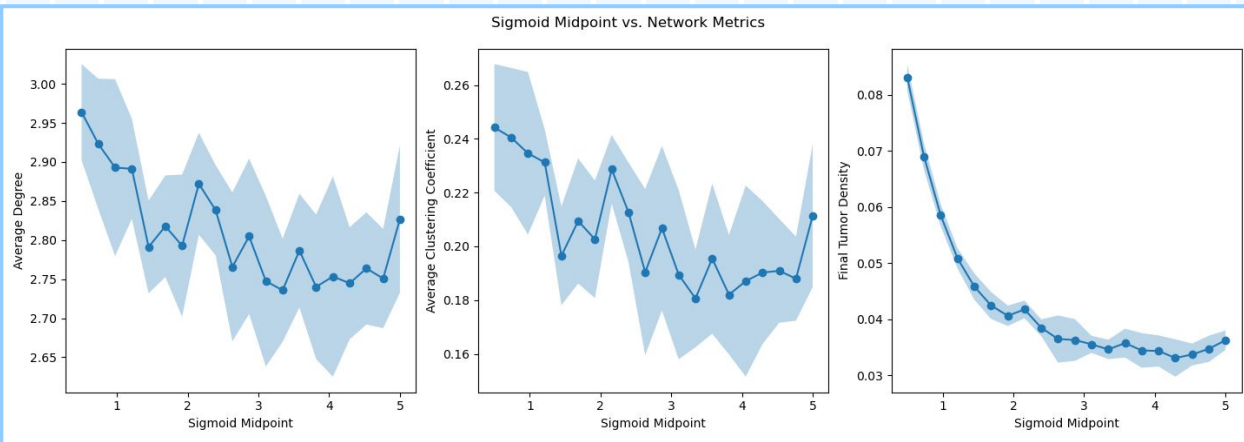
breakpoint



# Tumor density VS Network Metrics

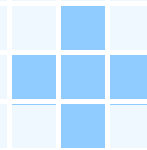
Varying Sigmoid Midpoint

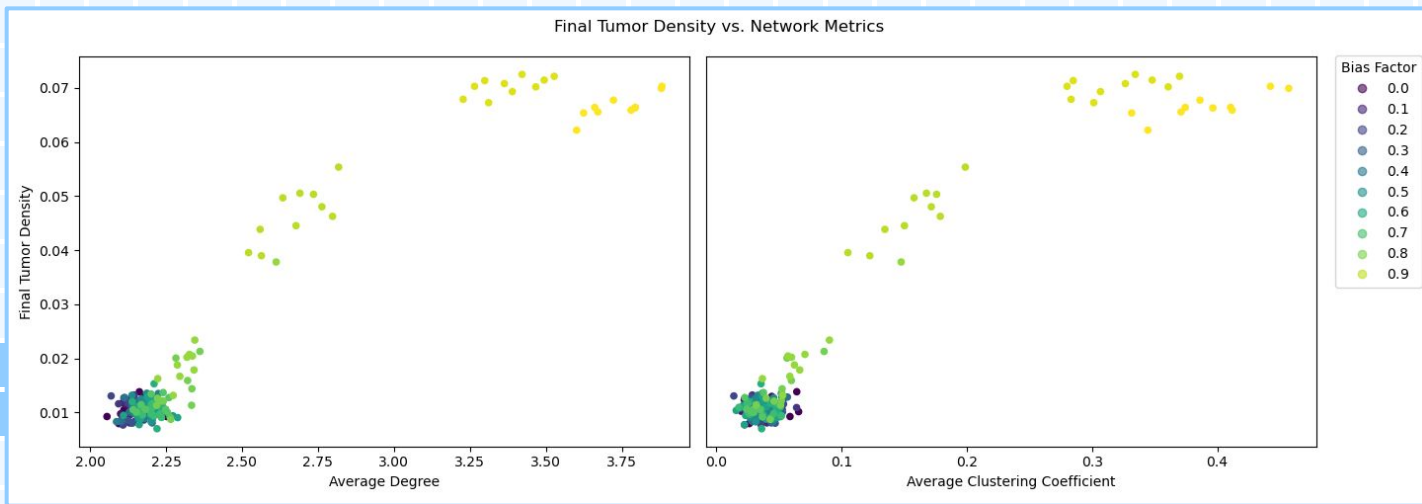
## Sigmoid Midpoint VS Network Metrics



$$P(\text{death}) = p \times (1 - \text{blood\_bias})$$

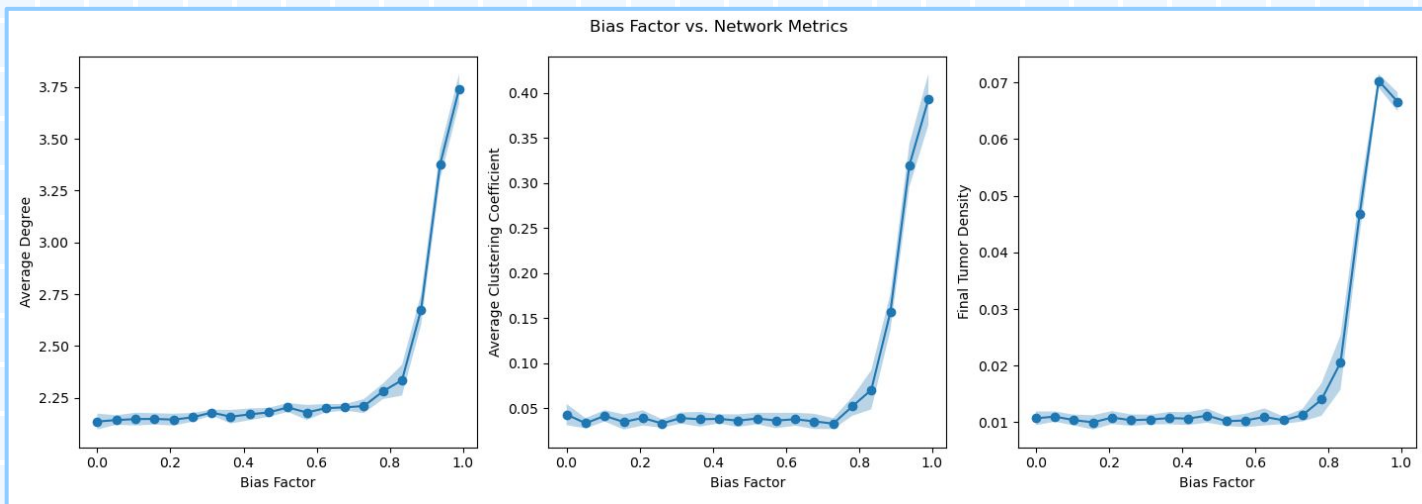
$$\text{blood\_bias}(N) = \frac{1}{1 + e^{-(N - \text{midpoint})}}$$





## Tumor density VS Network metrics

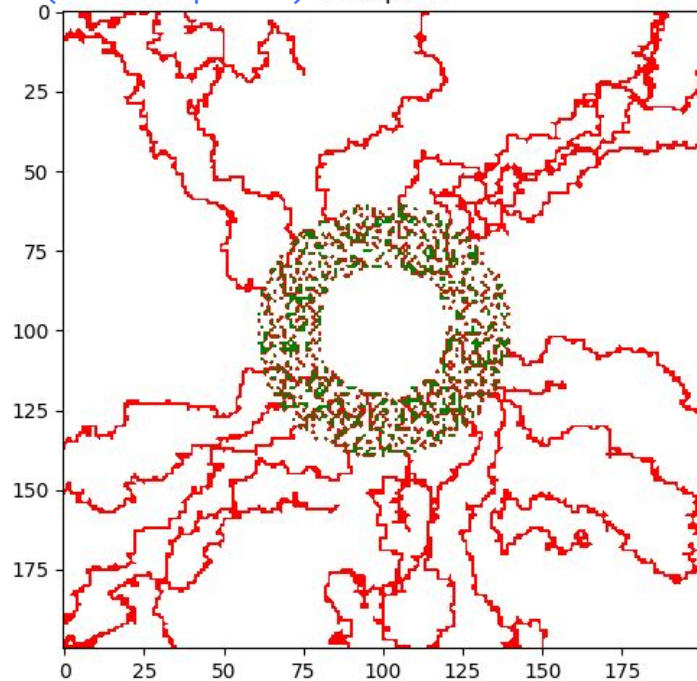
Varying Bias Factor



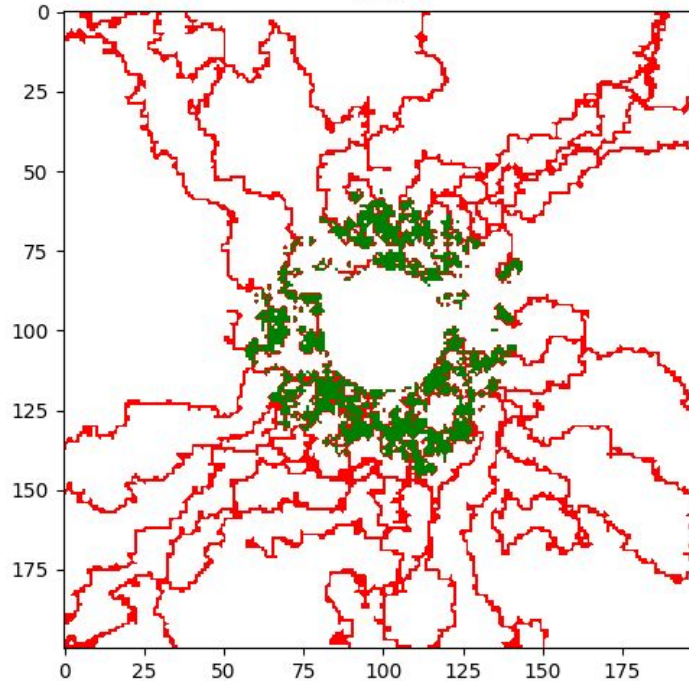
## Bias factor VS Network Metrics

# Tumor and Vessel Growth: clustering behavior over time

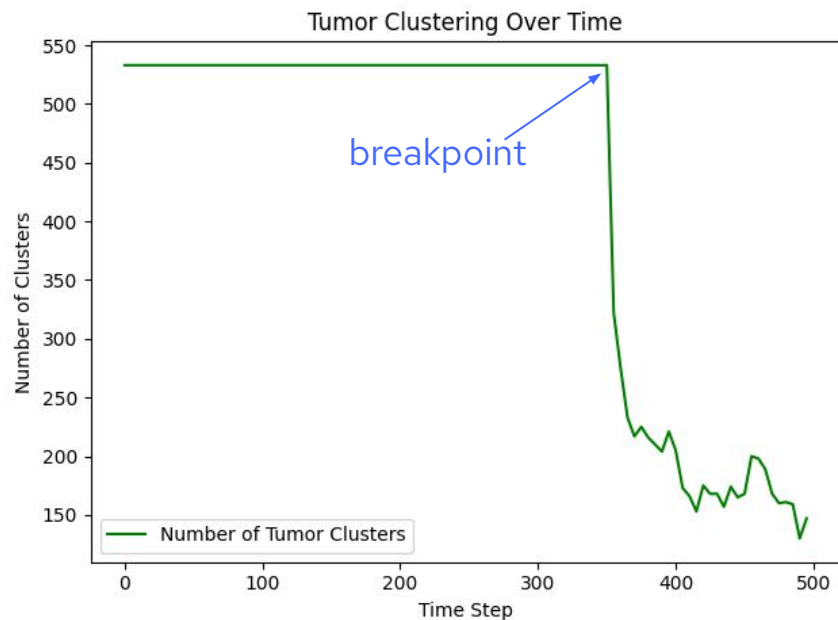
(Timestep 350) Breakpoint



Final



# Tumor Growth: clustering behavior over time

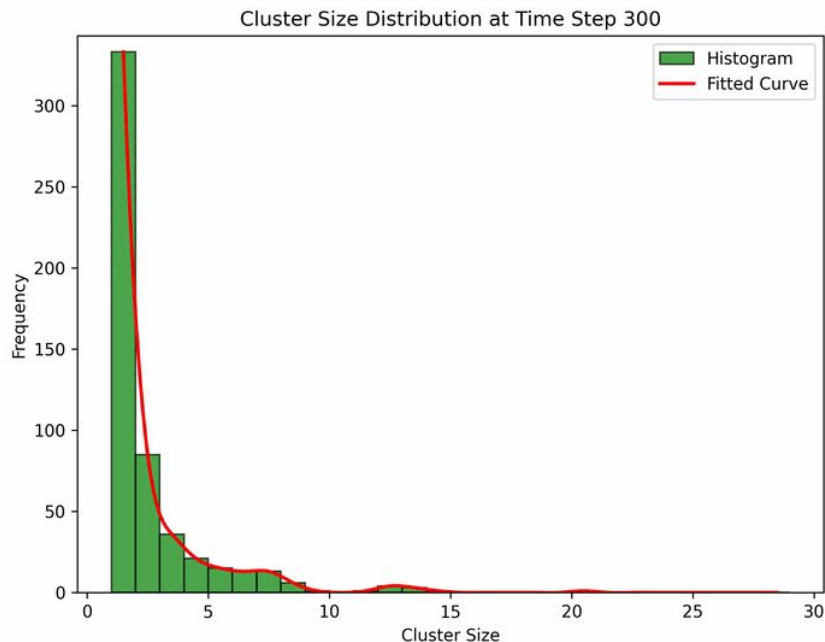


Minimum cluster size = 1

- Before the breakpoint, many small clusters exist.
- After the breakpoint, clusters start to merge.



# Tumor Growth: clustering behavior over time



**Power law?**

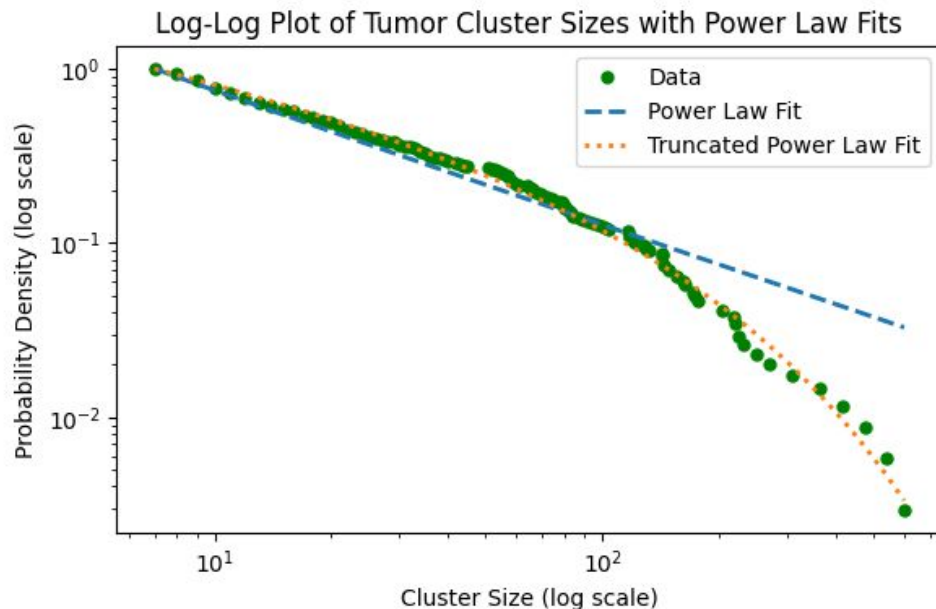
**Truncated power law?**

- 100 simulations.
- 10 combined datasets per simulation.

Proportion of Power Law: 0.00%

Proportion of Truncated Power Law: 97.00%

# Tumor Growth: clustering behavior over time

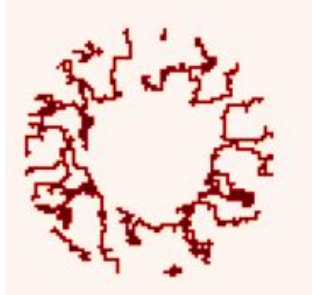


**Tumor cells clusters follow a truncated power law distribution.**

Truncated Power law VS	R	p-value
Exponential	5.56	<<0.05
Lognormal	3.30	<<0.05
Power law	3.99	<<0.05

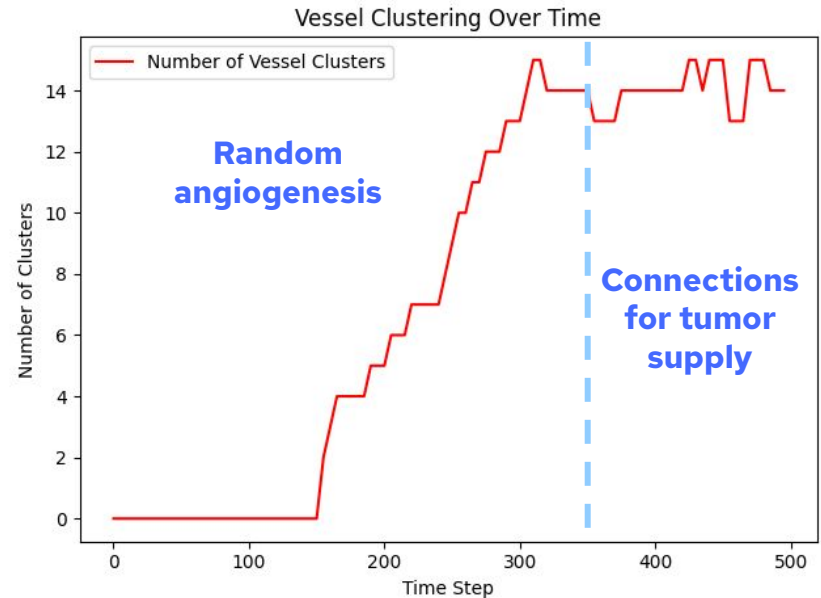
# Vessel Growth: clustering behavior over time

- Study the cluster distribution of vessel cells.
- Restrict the view **only in the tumor area.**

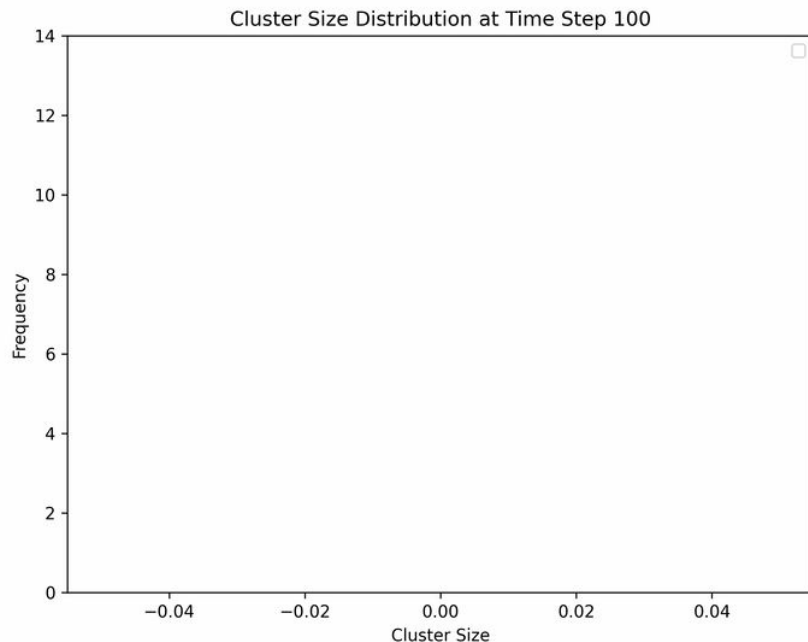


*Vessels in  
tumor area  
at  
breakpoint*

**Is the tumor clusters' power law distribution influenced by the same distribution in the vessels?**



# Vessel Growth: clustering behavior over time

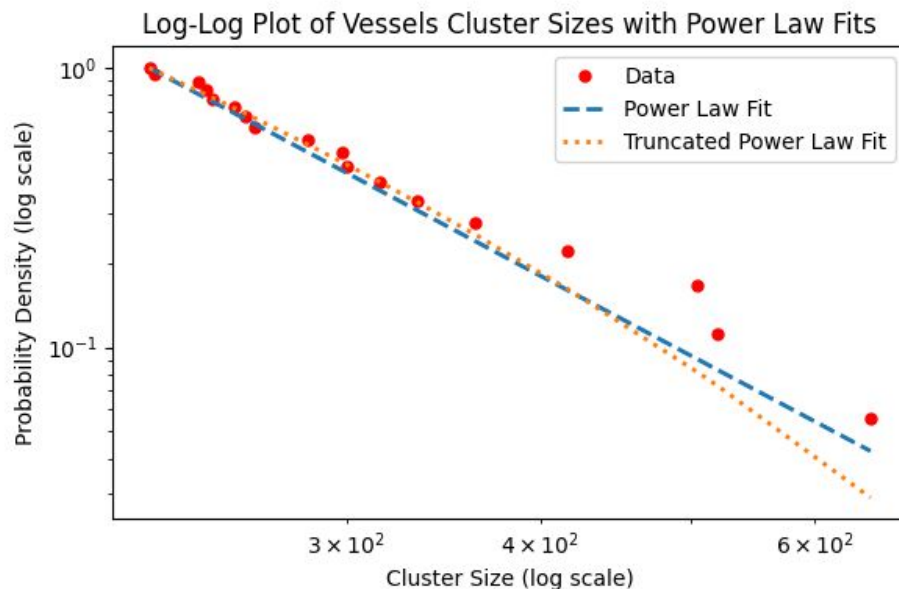


- 100 simulations.
- 10 combined datasets per simulation.

Proportion of Power Law: 0.00%  
Proportion of Truncated Power Law: 0.00%

**Vessel cluster sizes do not follow a power law distribution around the tumor.**

# Vessel Growth: clustering behavior over time



Example of vessel cluster sizes fit. All  $p$ -values  $\gg 0.05$ .

## Power law VS

Exponential

R

0.04

p-value

0.97

Lognormal

-0.35

0.73

Truncated power law

-0.47

0.55

## Truncated Power law VS

Exponential

0.45

0.65

Lognormal

0.89

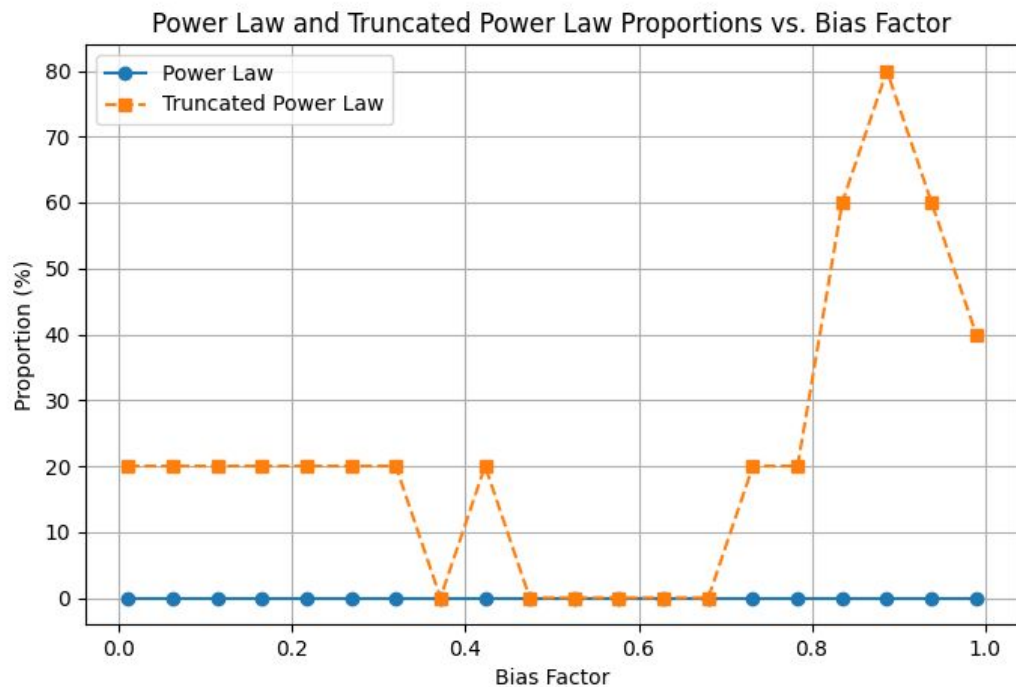
0.37

Power law

0.47

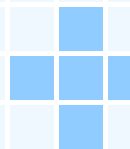
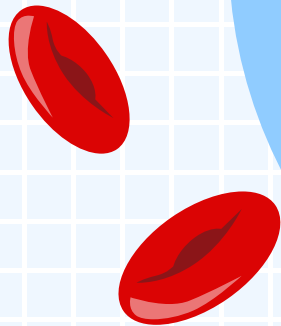
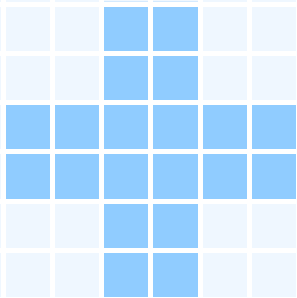
0.55

# Bias Factor and Tumor Clusters





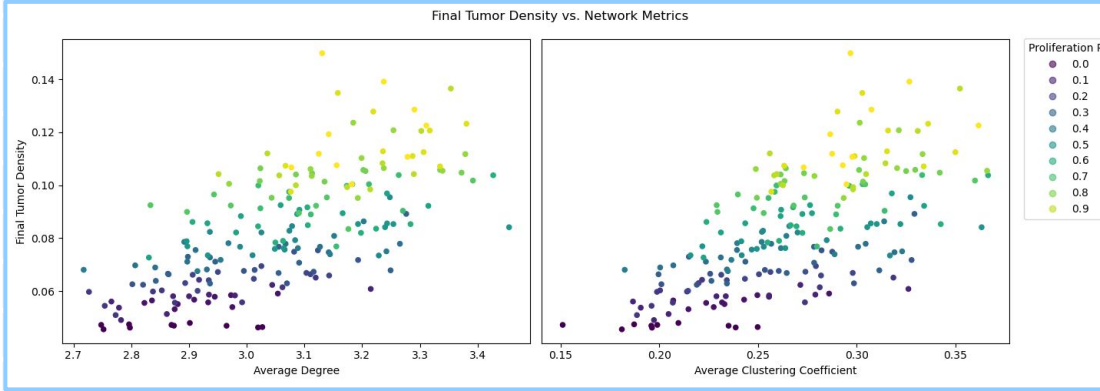
**Thank  
you!**



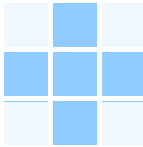
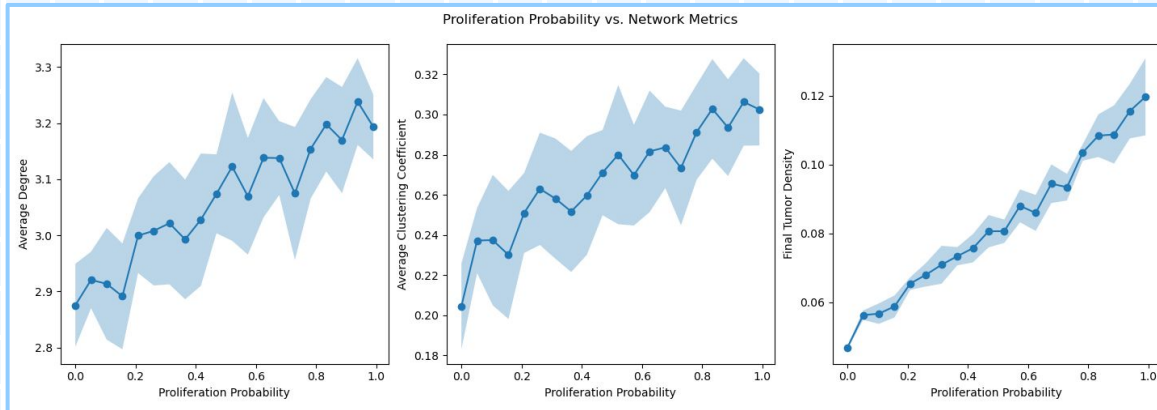


# Appendix 1

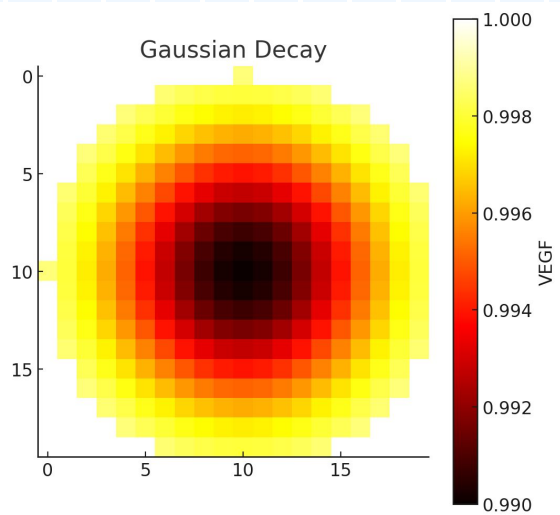
Varying the  
probability of  
tumor cell  
growth/death



## Proliferation Probability VS Network Metrics







## Gaussian Decay of VEGF due to Vessel Growth

$$VEGF(x, y) = \max(0, VEGF(x, y) \times (1 - w(d) \times (1 - \text{decay\_factor})))$$

$$w(d) = e^{-\frac{d^2}{2\sigma^2}}$$

decay\_factor = 0.99

$\sigma = 10/2,$        $d = 10$

