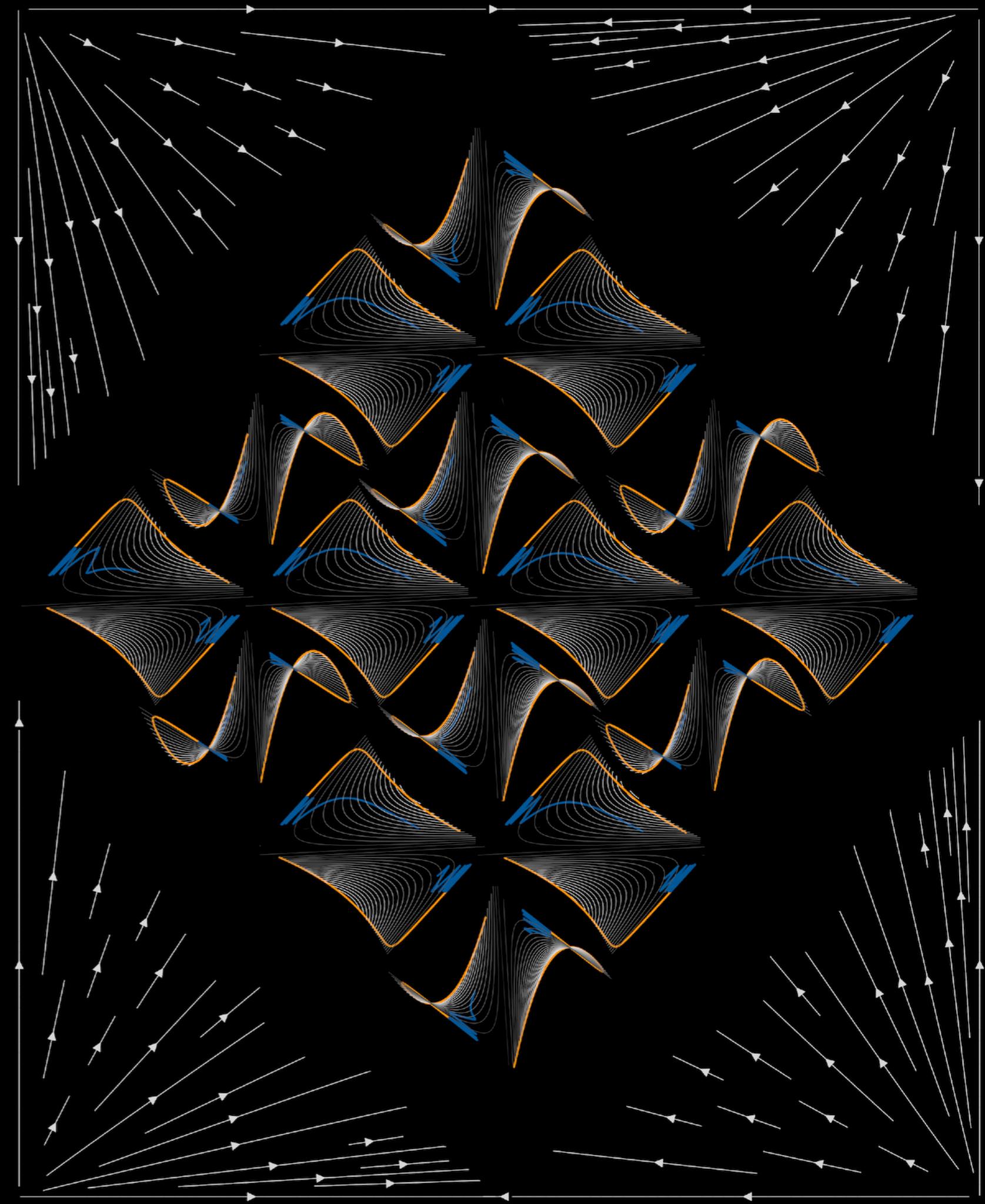


# Spatial structure impacts adaptive therapy by shaping intra-tumoral competition

Maximilian Strobl



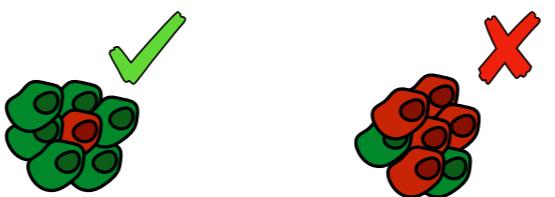
@StroblMAR



# AT Selection Criteria

## Important Factors in AT

### 1. Initial resistance fraction



### 2. Vicinity to cancer



### 3. Resistant

### 4. Turnover



### Equations:

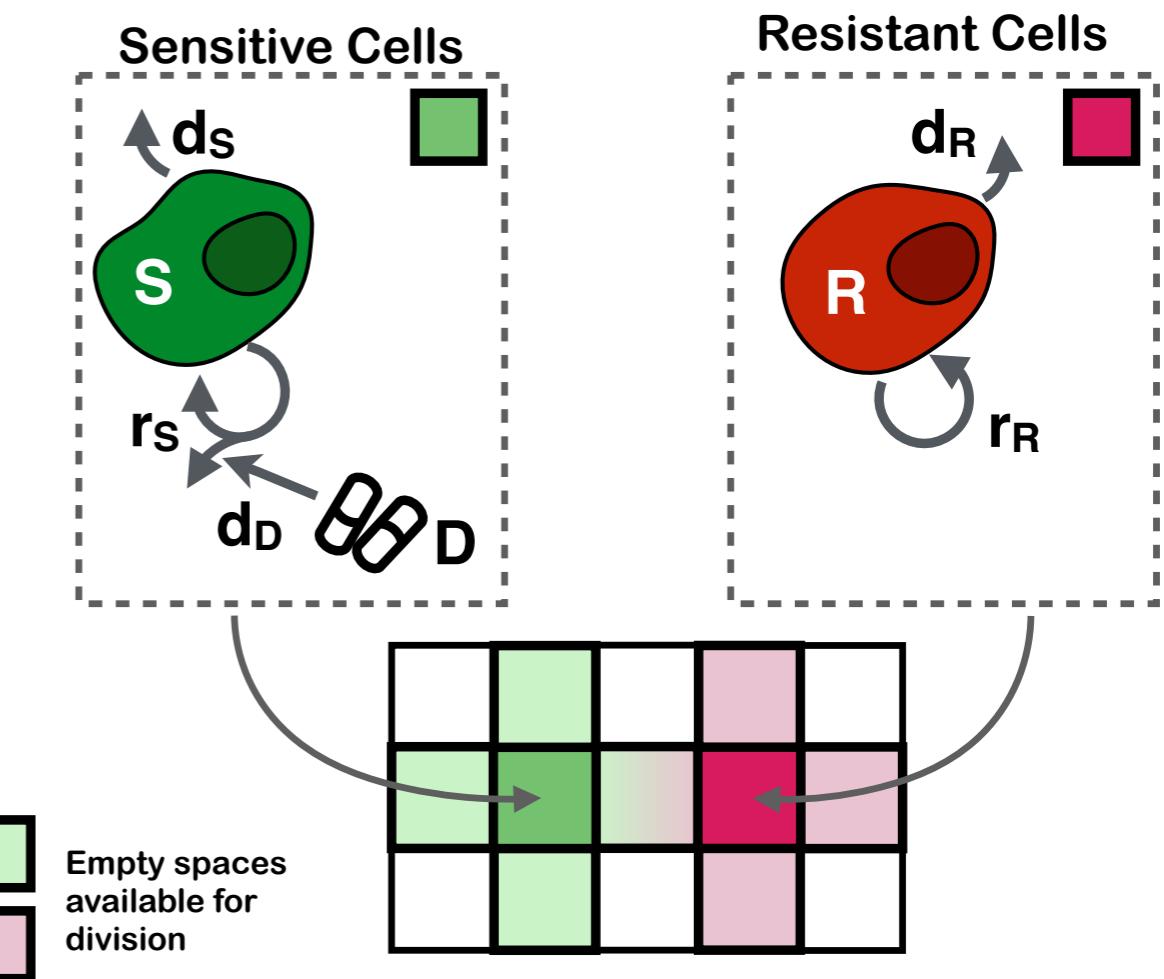
$$\frac{dS}{dt} = r_S \left( 1 - \frac{S + R}{K} \right) \left( 1 - \frac{2d_D}{D_{Max}} D(t) \right) S - d_T S,$$

$$\frac{dR}{dt} = r_R \left( 1 - \frac{R + S}{K} \right) R - d_T R,$$

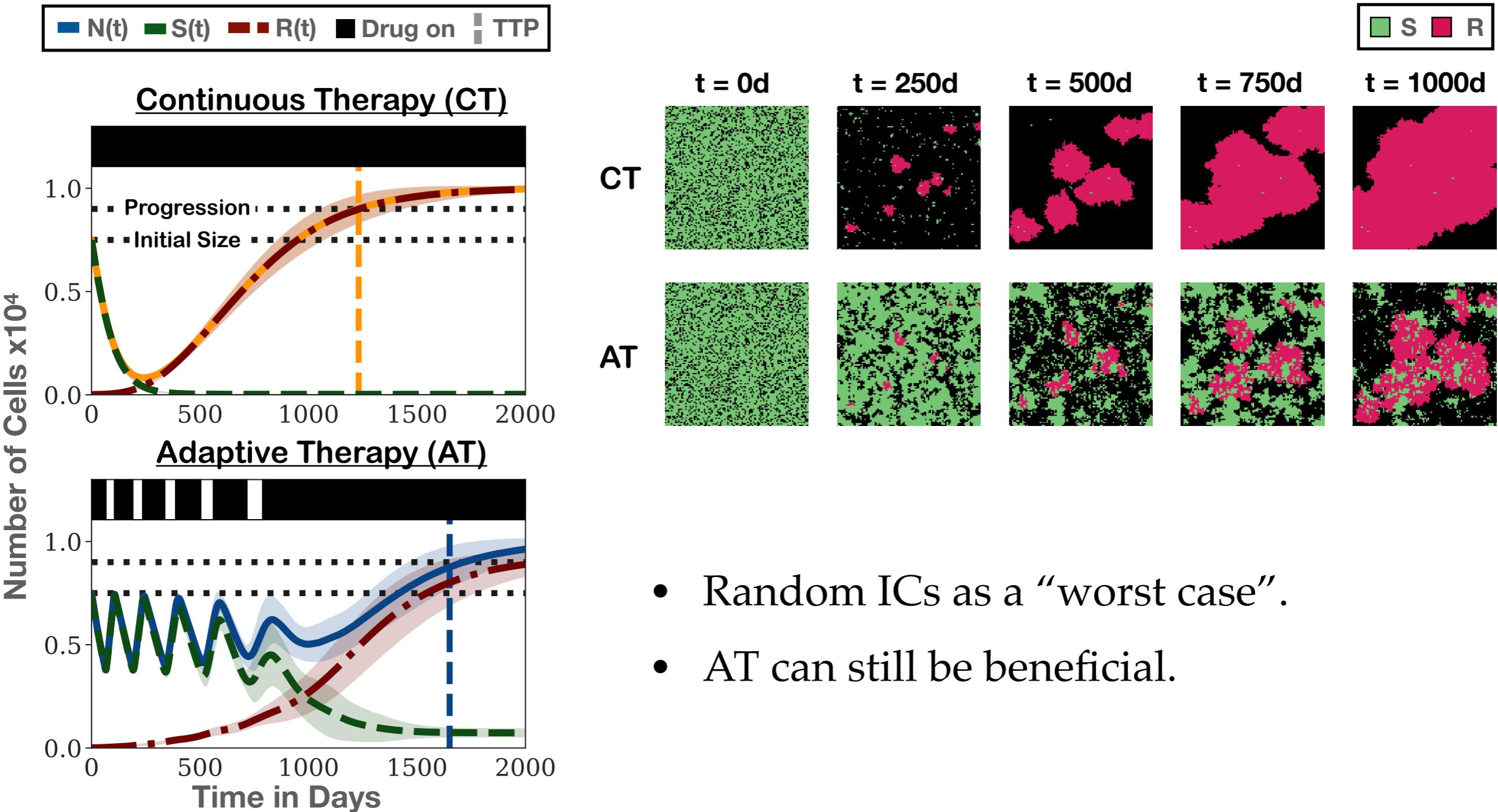
$$N(t) = S(t) + R(t),$$

# The Model

- Assumptions:**
  - 2-D, on-lattice ABM.
  - Sensitive and resistant cells.
  - Drug kills dividing cells.
- Drug Schedules:**
  - Continuous Tx:  $D(t) = D_{Max}$
  - Adaptive Tx from trial.
- Parameters:**
  - Previous AT modelling studies in prostate cancer.



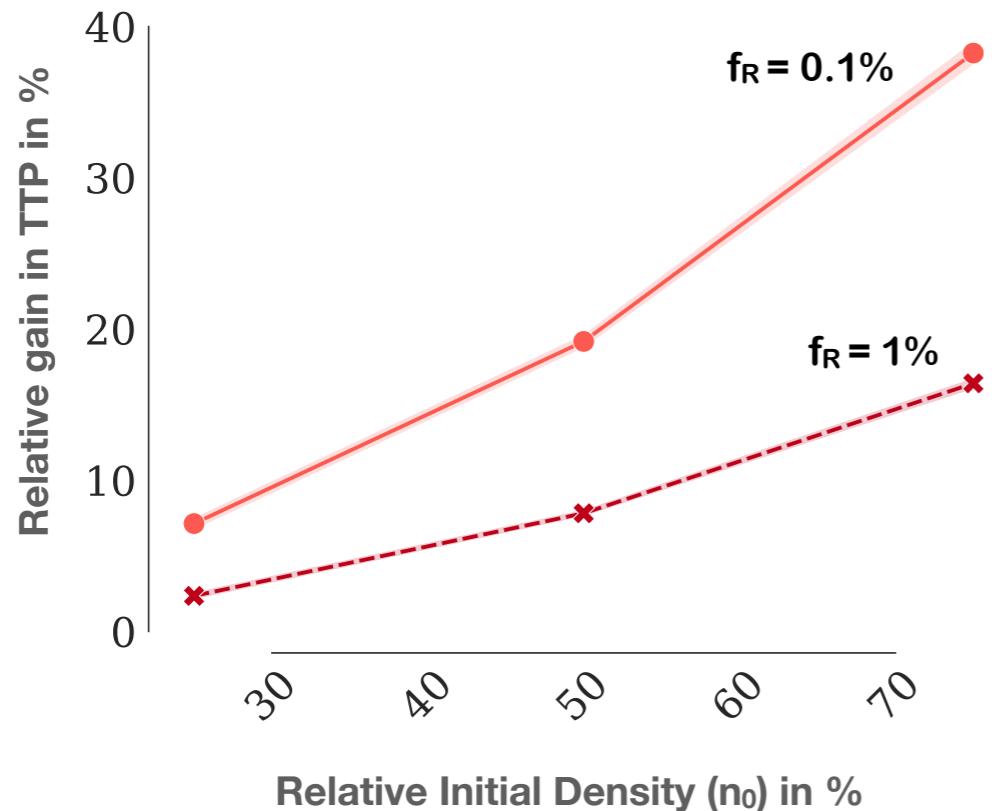
# Can AT improve over CT?



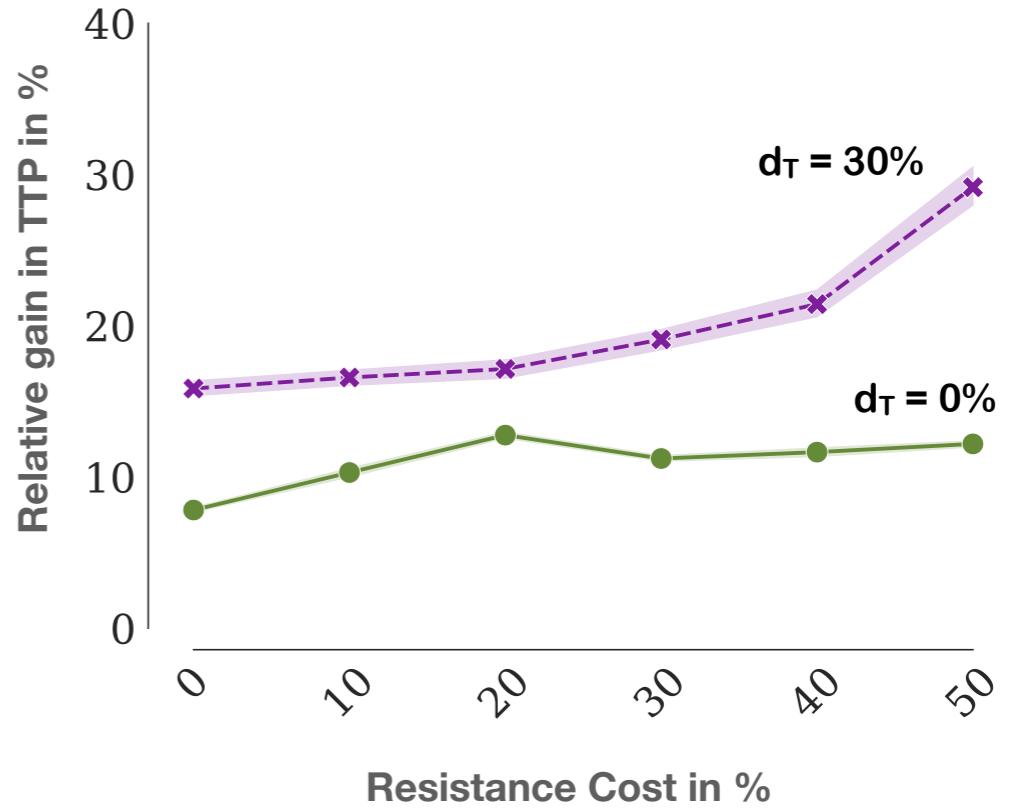
Parameters:  $n_0 = 75\%$ ,  $f_R = 0.1\%$

# The models agree qualitatively

Impact of Initial Conditions



Impact of Cost and Turnover



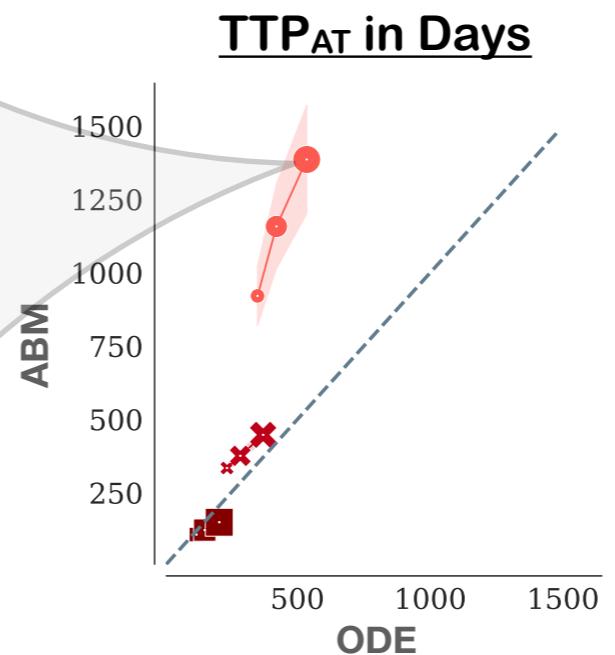
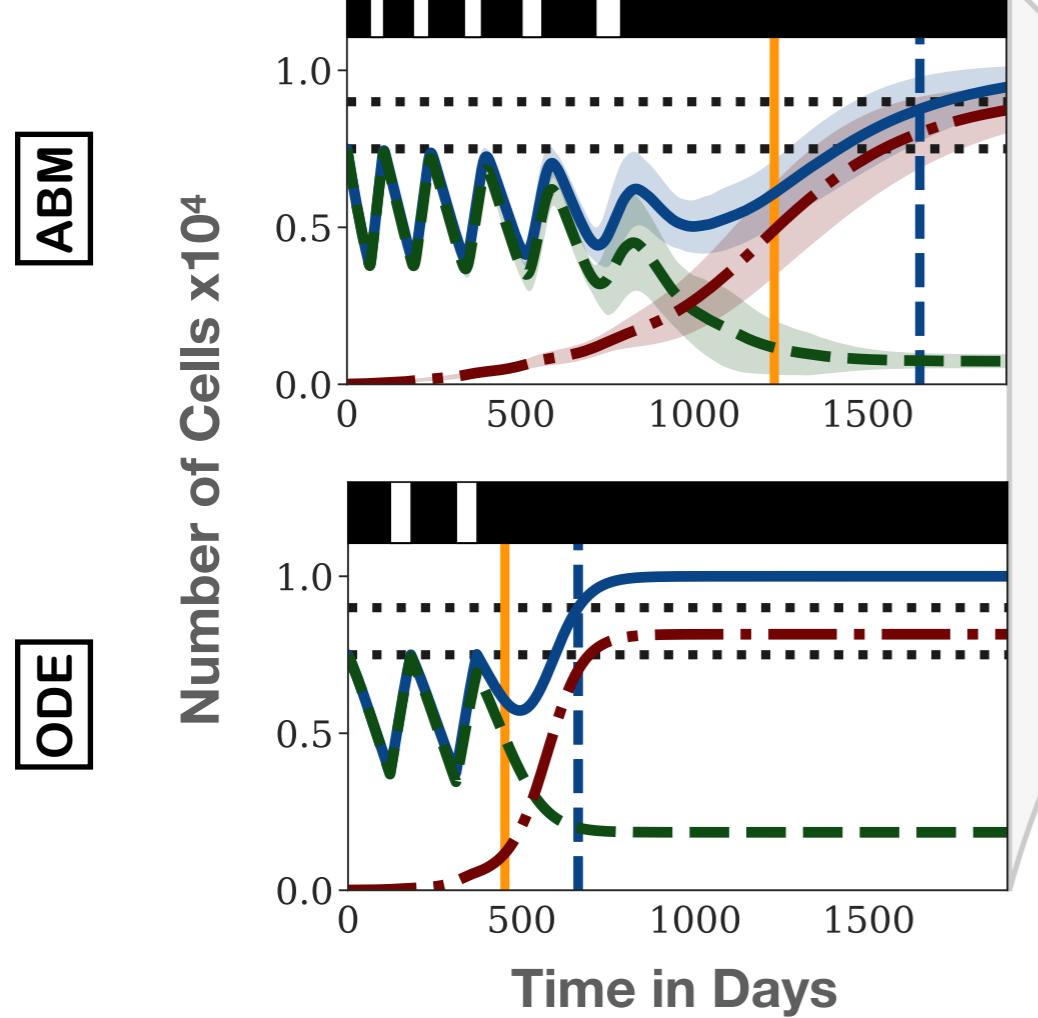
- Crowding and low resistance fraction benefit AT.
- Turnover aids AT and modifies the impact of resistance costs.

# But quantitative dynamics quite different

■  $N(t)$  under AT ■  $S(t)$  ■  $R(t)$  ■ Drug on | TTP<sub>CT</sub> ■ TTP<sub>AT</sub>

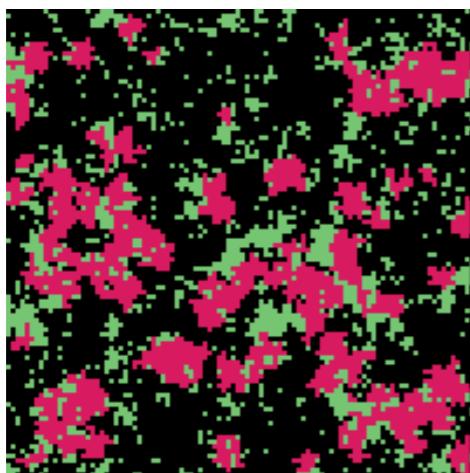
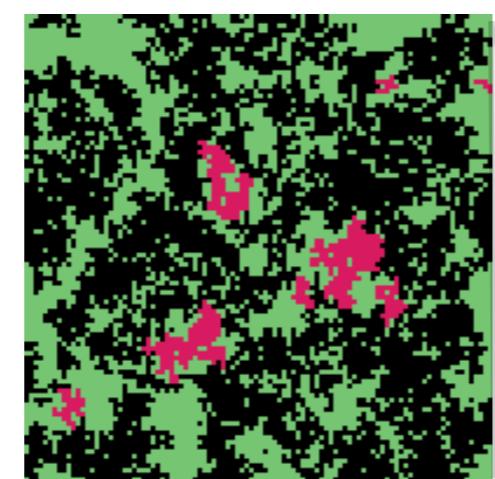
Initial Resistance ( $f_R$ ): ● 0.1% ✕ 1% ■ 10%  
 Initial Density ( $n_0$ ): ○ 35% □ 50% △ 65%

Simulations for the same parameters

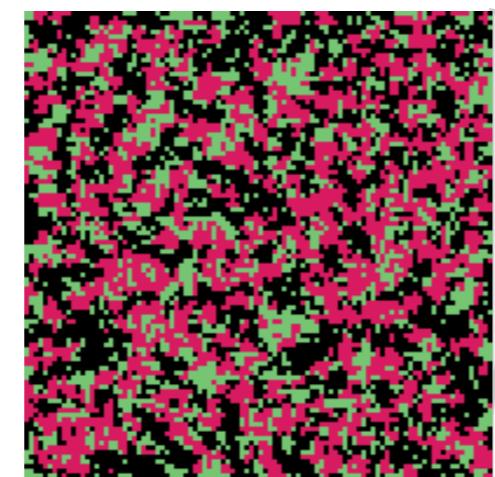


- The spatial model predicts different time dynamics, and generally **smaller** relative benefit.

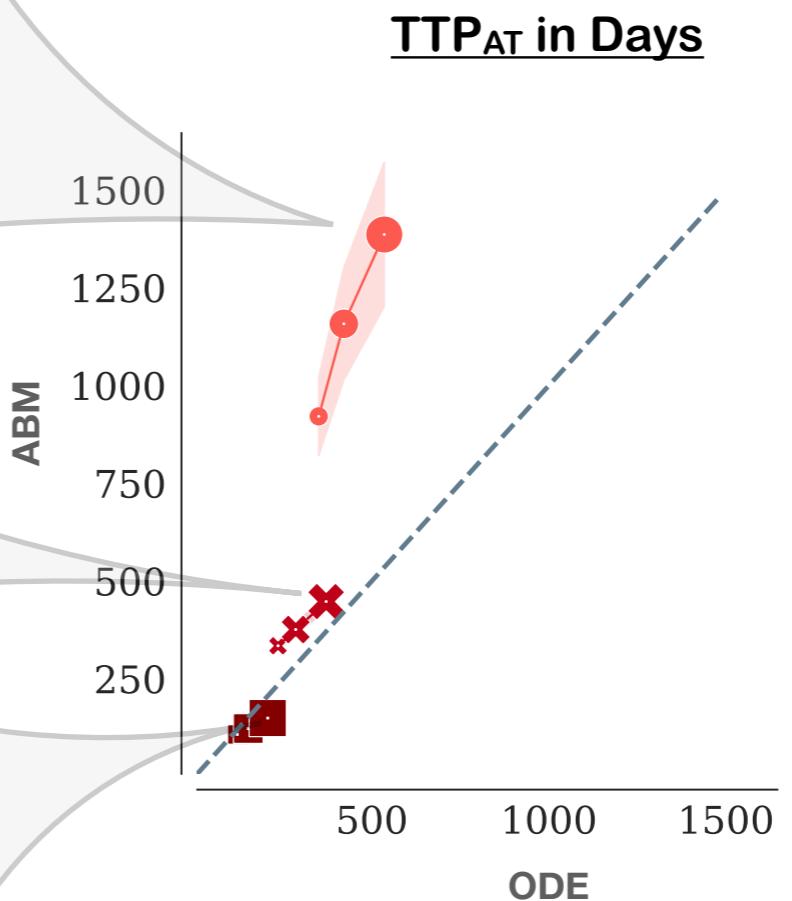
# Why do the models differ?



Increasing  
#Resistant Nests

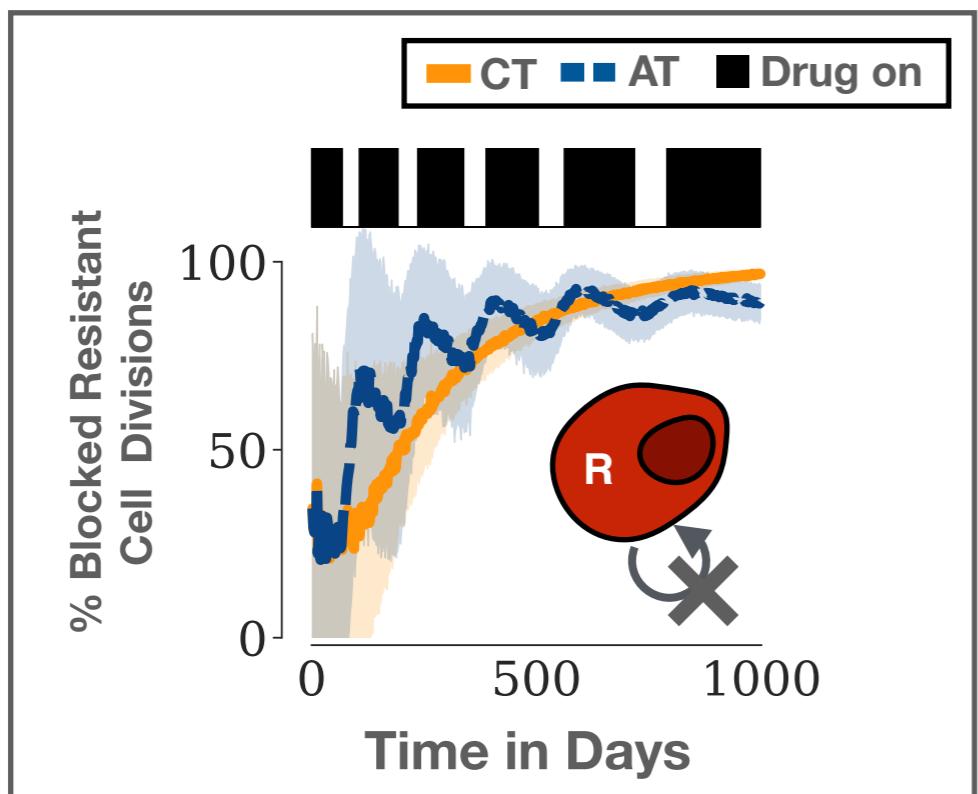


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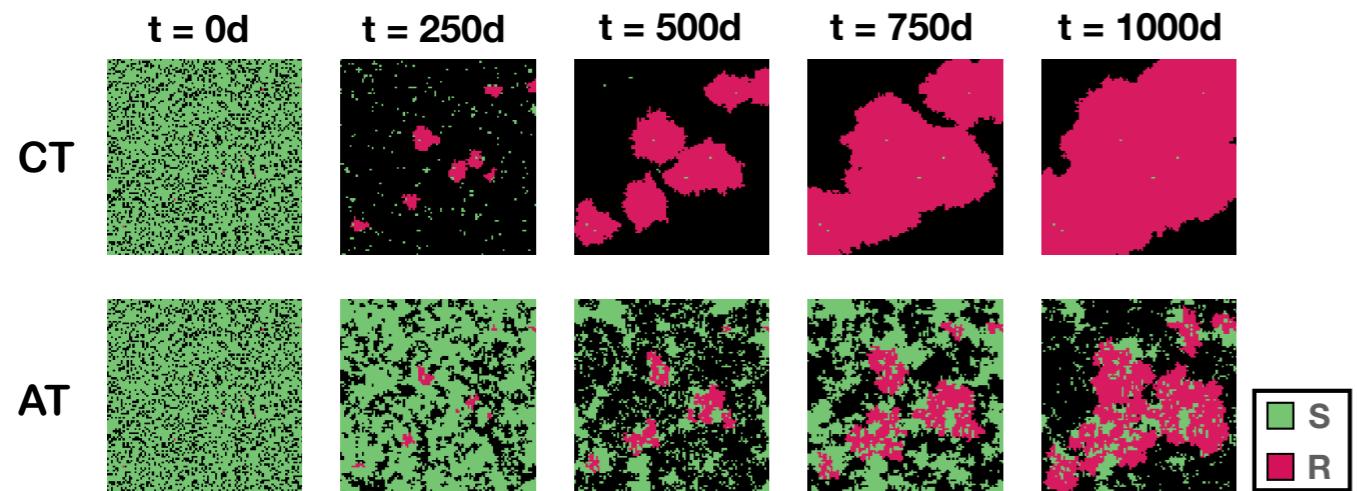
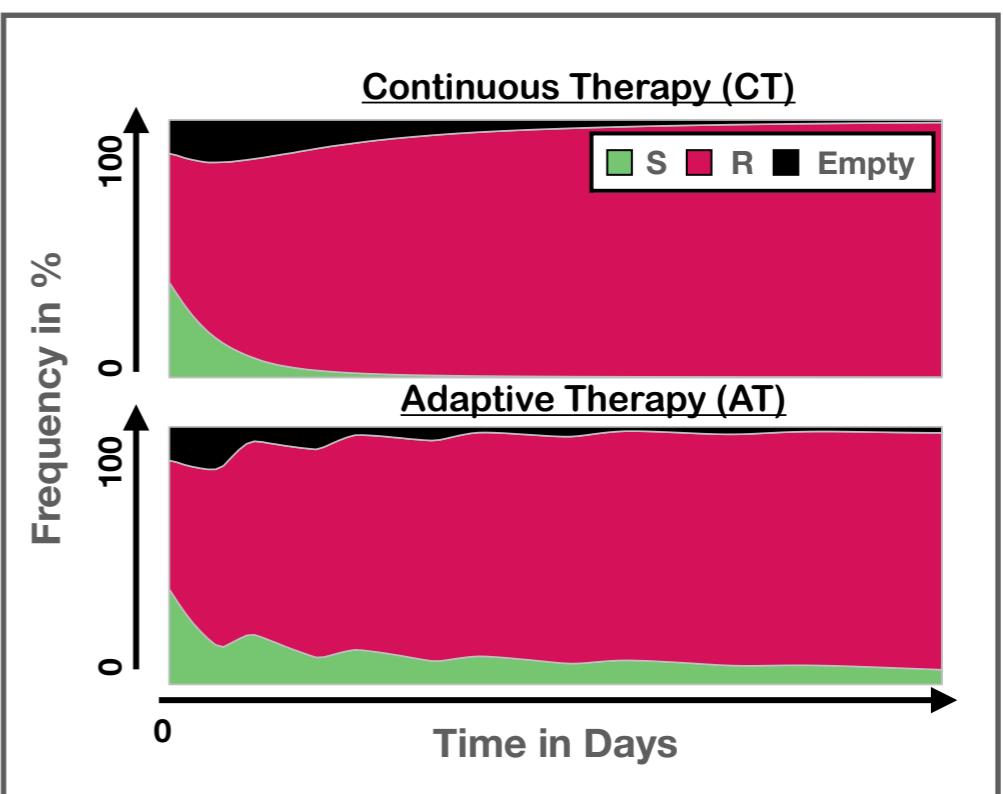


# Quantifying competition

## 1) How much competition is there?

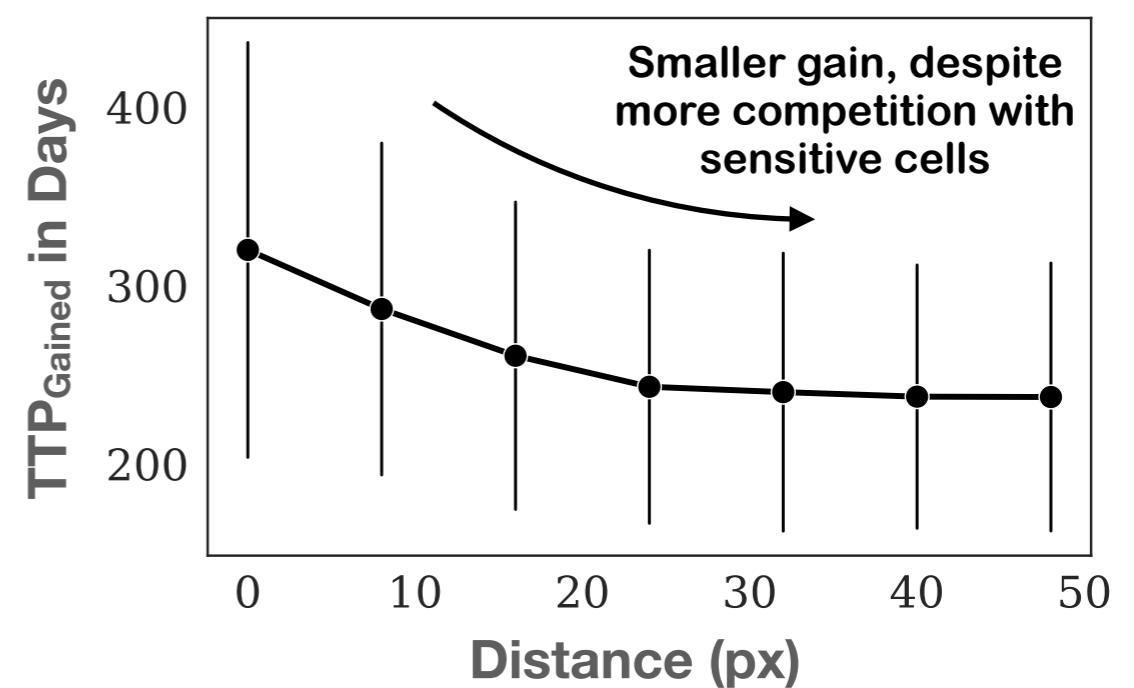
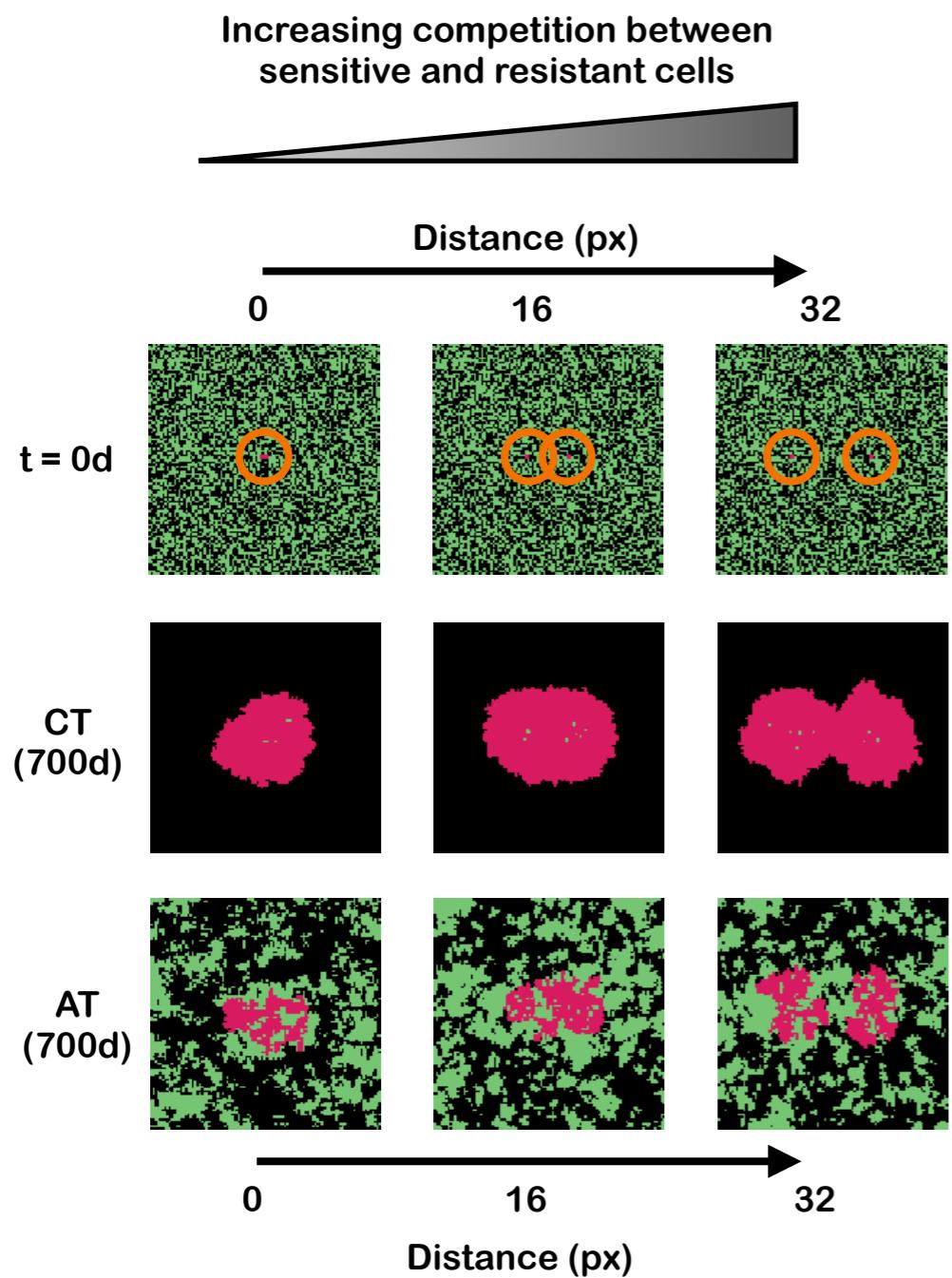


## 2) Who do resistant cells compete with?



- **Conclusions:**
  - Competition increases under AT.
  - But also under CT...
  - Most resistant cells compete with other resistant cells!

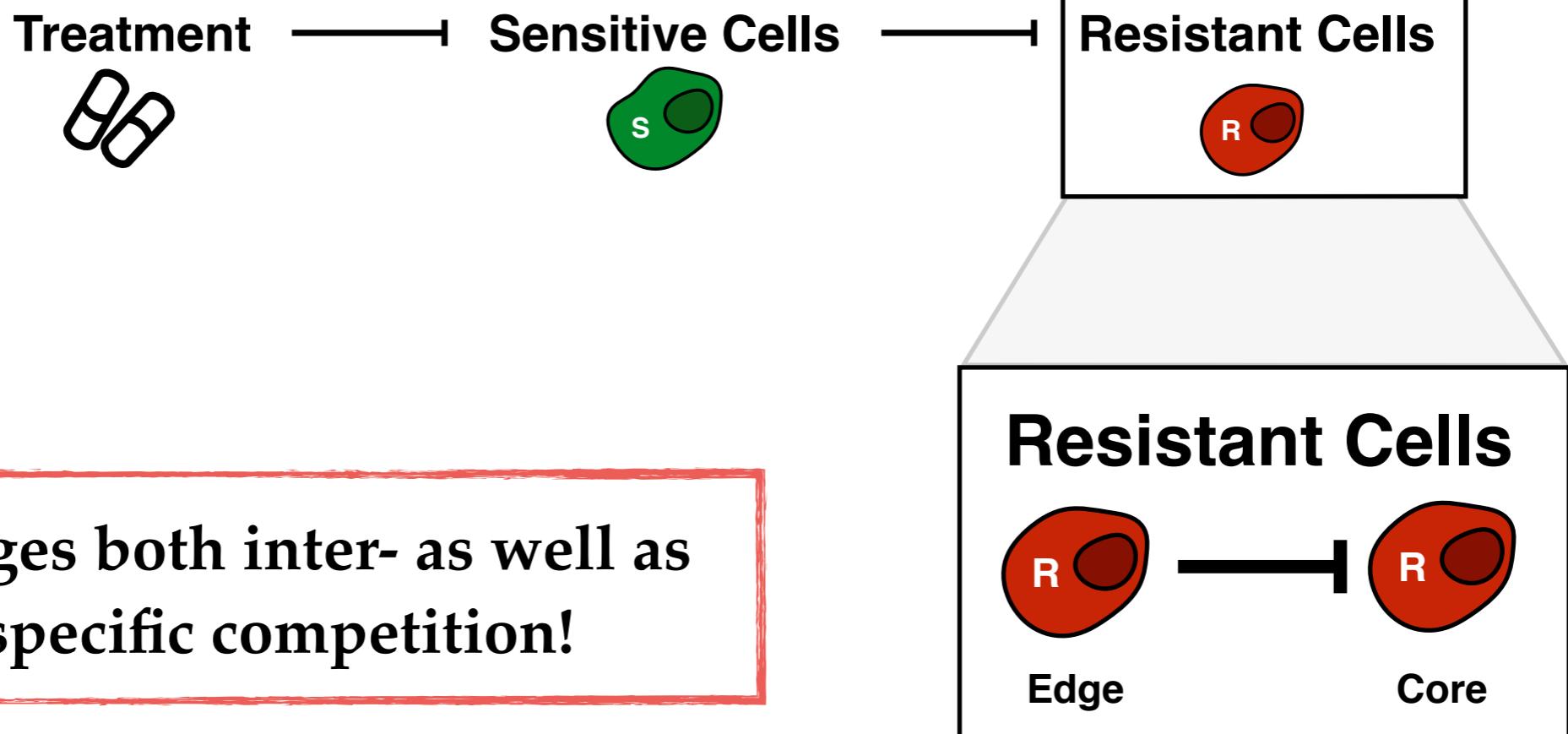
# A double-edged sword



- Competition with sensitive cells is a double-edged sword.
- That's why intra-specific competition is important.

# AT is not only about sensitive cells

## The “Classical” View of Adaptive Therapy



\*Diagram adapted from Carlo Maley

# The Bruchovsky (2006) et al data

## Final Results of the Canadian Prospective Phase II Trial of Intermittent Androgen Suppression for Men in Biochemical Recurrence after Radiotherapy for Locally Advanced Prostate Cancer

### Clinical Parameters

Nicholas Bruchovsky, MD, PhD<sup>1</sup>

Laurence Klotz, MD<sup>2</sup>

Juanita Crook, MD<sup>3</sup>

Shawn Malone, MD<sup>4</sup>

Charles Ludgate, MD<sup>5</sup>

W. James Morris, MD<sup>5</sup>

Martin E. Gleave, MD<sup>1</sup>

S. Larry Goldenberg, MD<sup>1</sup>

**BACKGROUND.** This prospective Phase II study was undertaken to evaluate intermittent androgen suppression as a form of therapy in men with localized prostate cancer who failed after they received external beam irradiation.

**METHODS.** Patients who demonstrated a rising serum prostate-specific antigen (PSA) level after they received radiotherapy and who were without evidence of distant metastasis were accepted into the study. Treatment in each cycle consisted of cyproterone acetate given as lead-in therapy for 4 weeks, followed by a combination of leuprolide acetate and cyproterone acetate, which ended after a total of 36 weeks.

# The Bruchovsky (2006) et al data

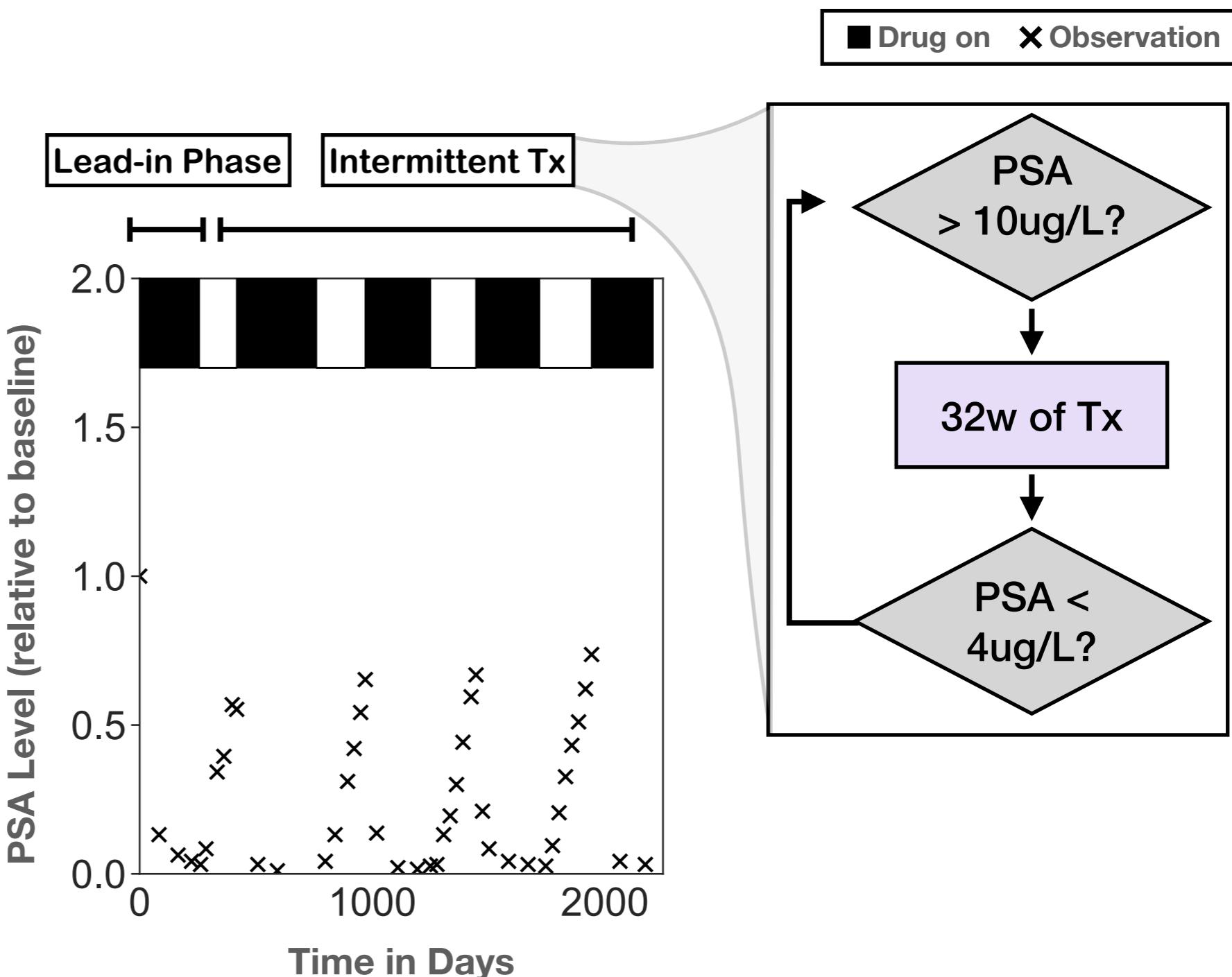
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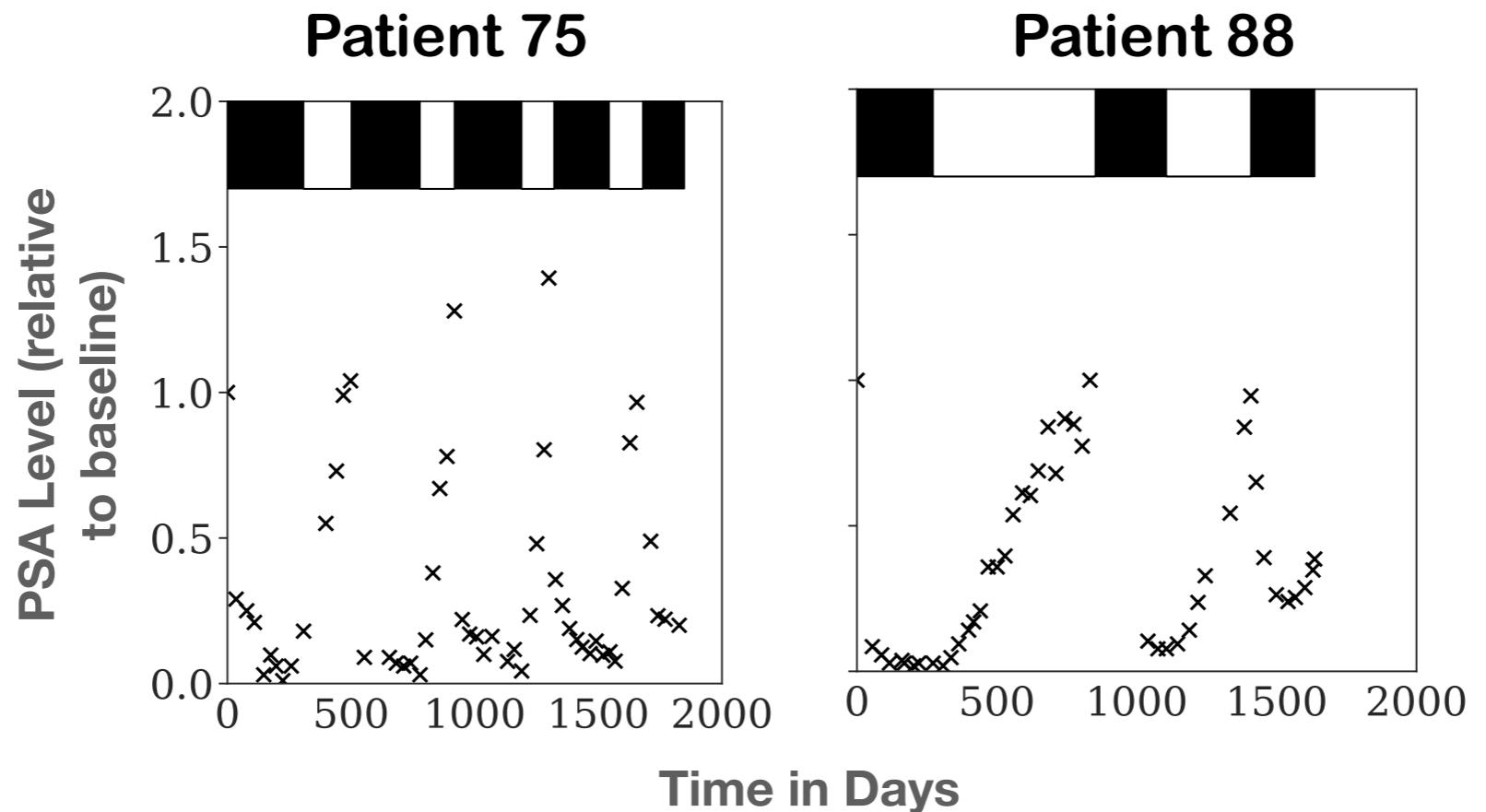
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- Data from 67 patients undergoing intermittent androgen deprivation therapy.



# Fast and slow cyclers display different spatial organisation

■  $N(t)$  under IMT ■  $S(t)$  ■■  $R(t)$  ■ Drug on × Observation



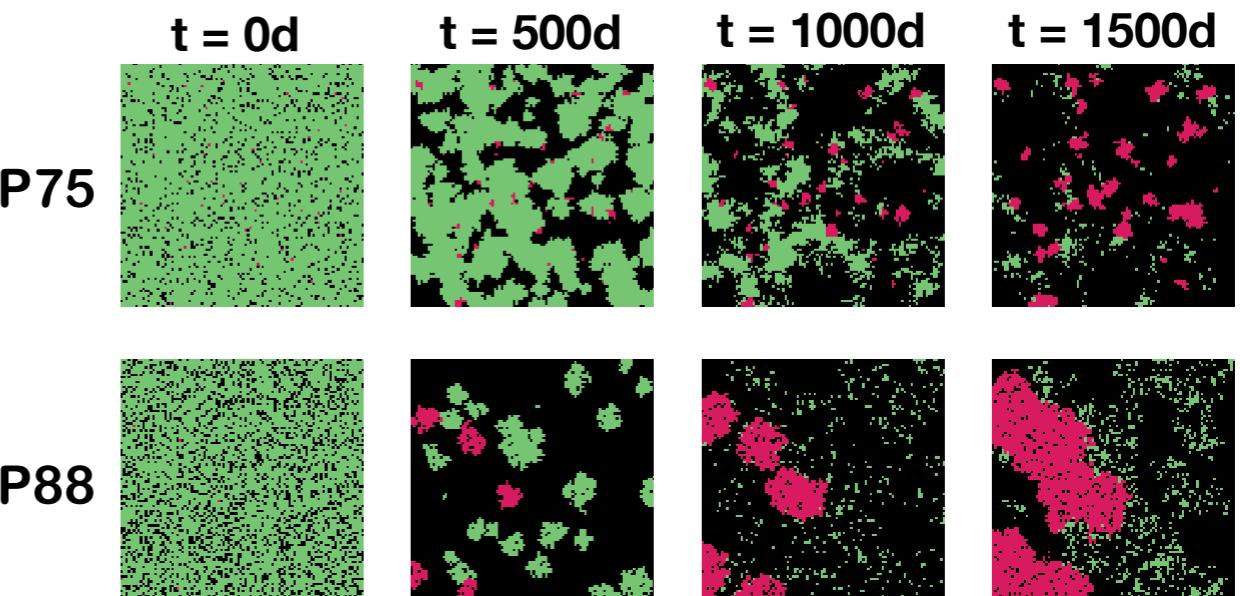
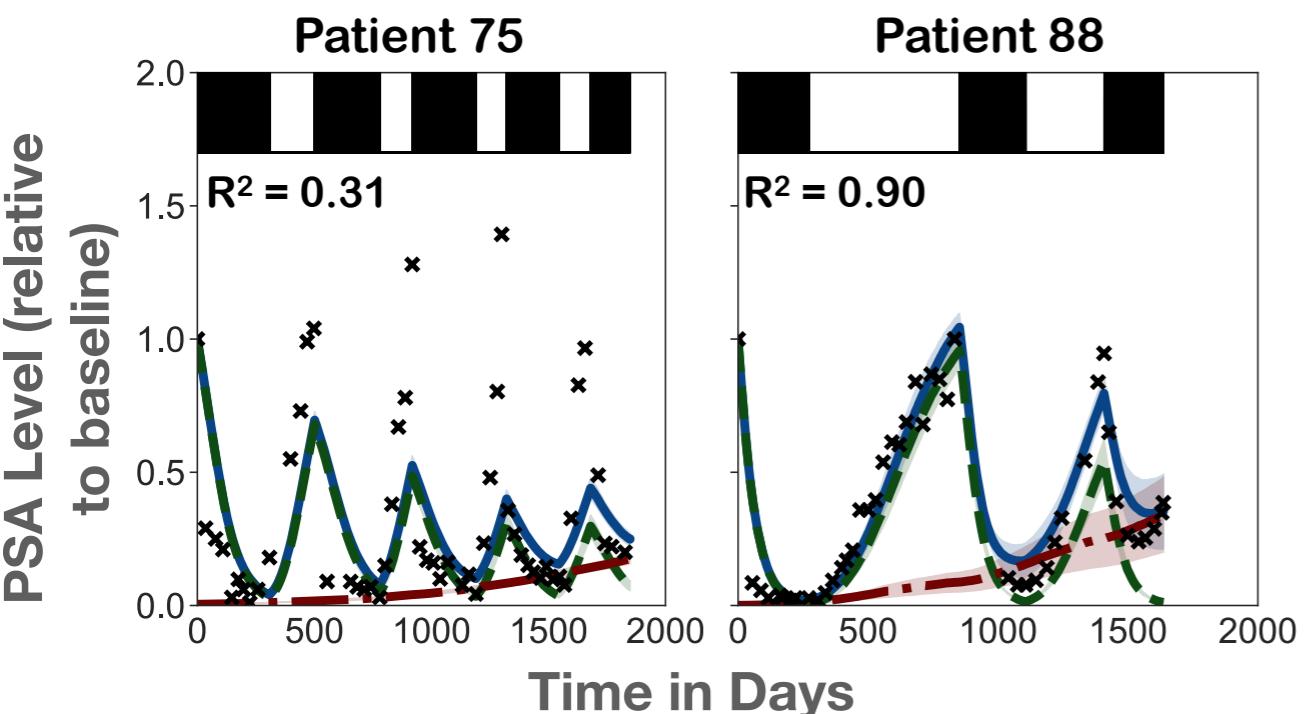
- The ABM can fit the data.

Free parameters:  $n_0$ ,  $f_R$ , cost, turnover.

# Fast and slow cyclers display different spatial organisation

■  $N(t)$  under IMT ■  $S(t)$  ■  $R(t)$  ■ Drug on × Observation

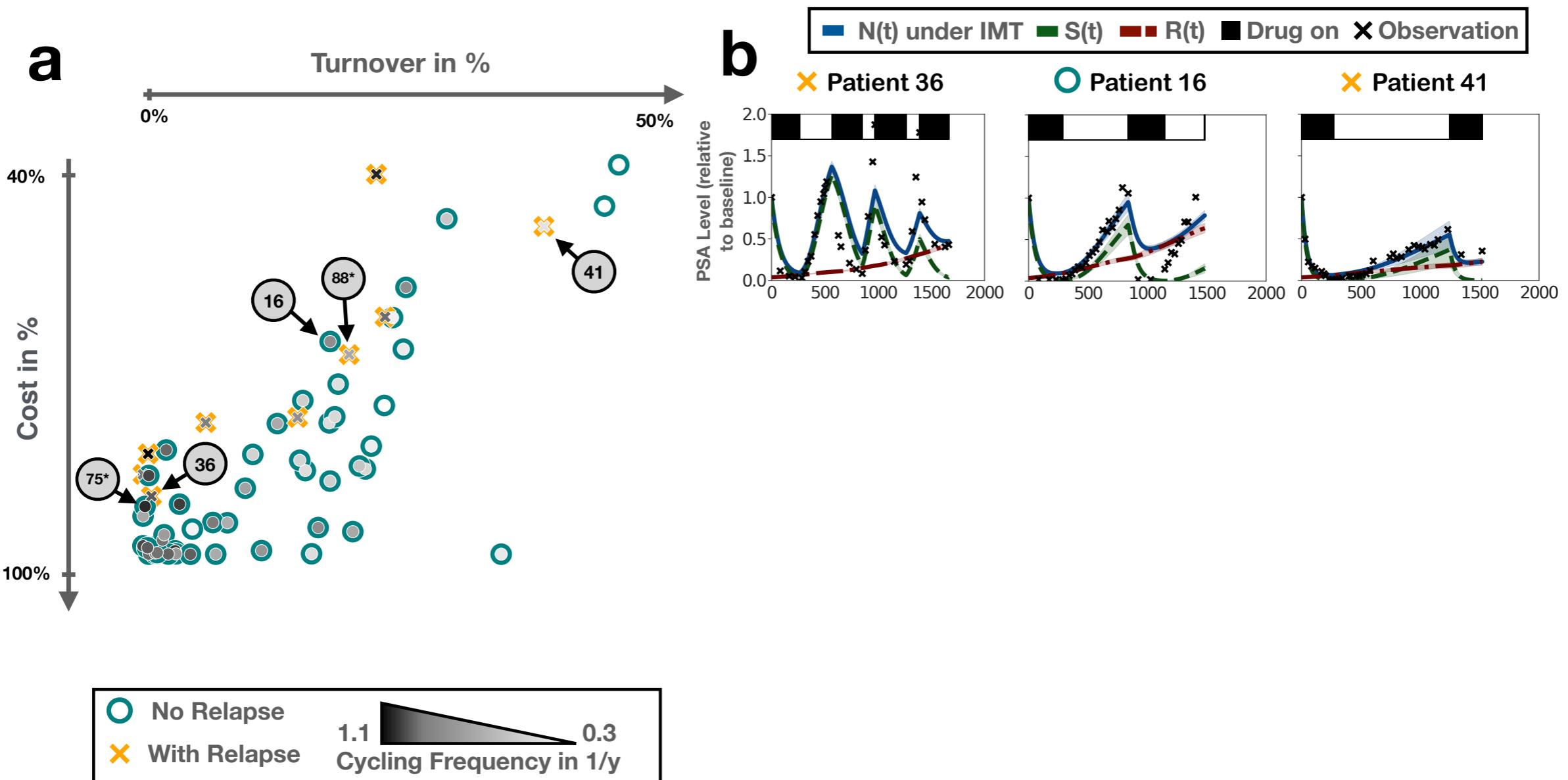
■ S ■ R



- The ABM can fit the data.
- Spatial organisation differs between fast and slow cyclers.

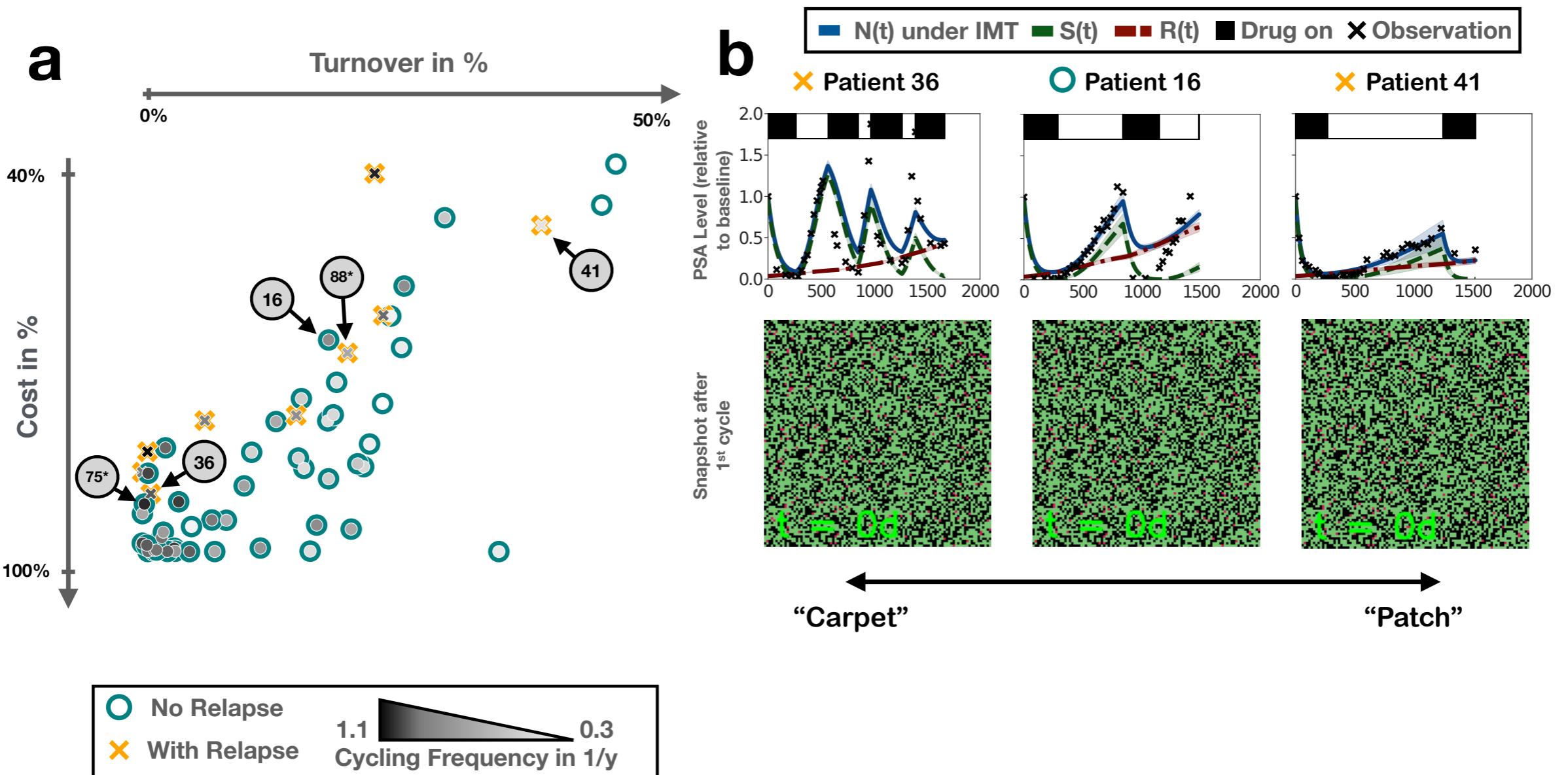
Free parameters:  $n_0$ ,  $f_R$ , cost, turnover.

# The Carpet-Patch Hypothesis



Free parameters: cost, turnover.

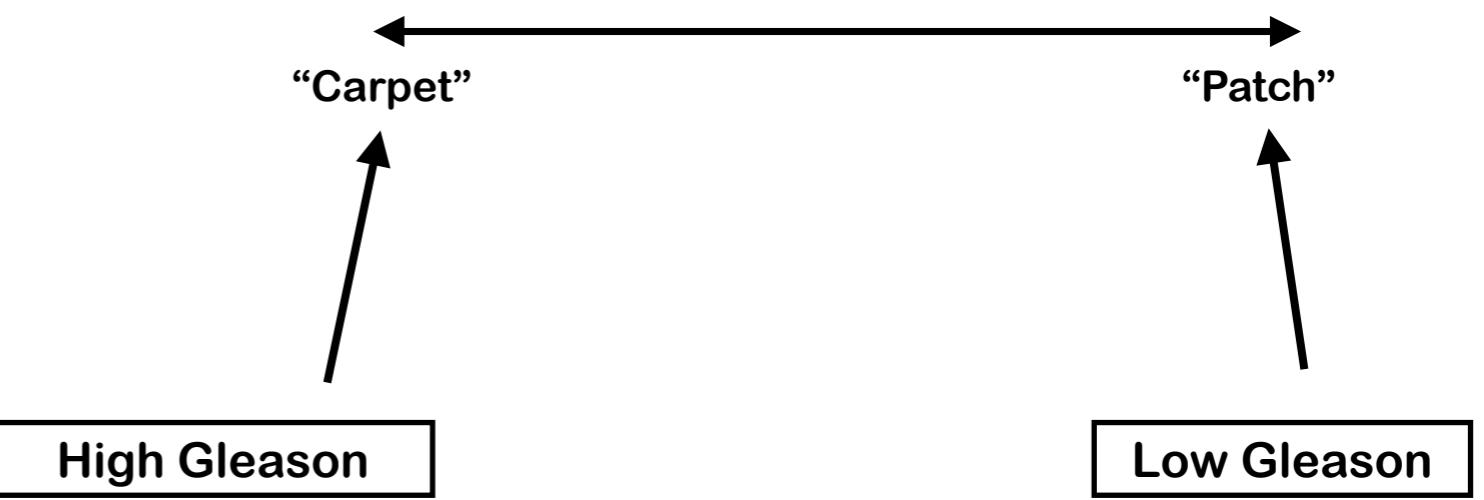
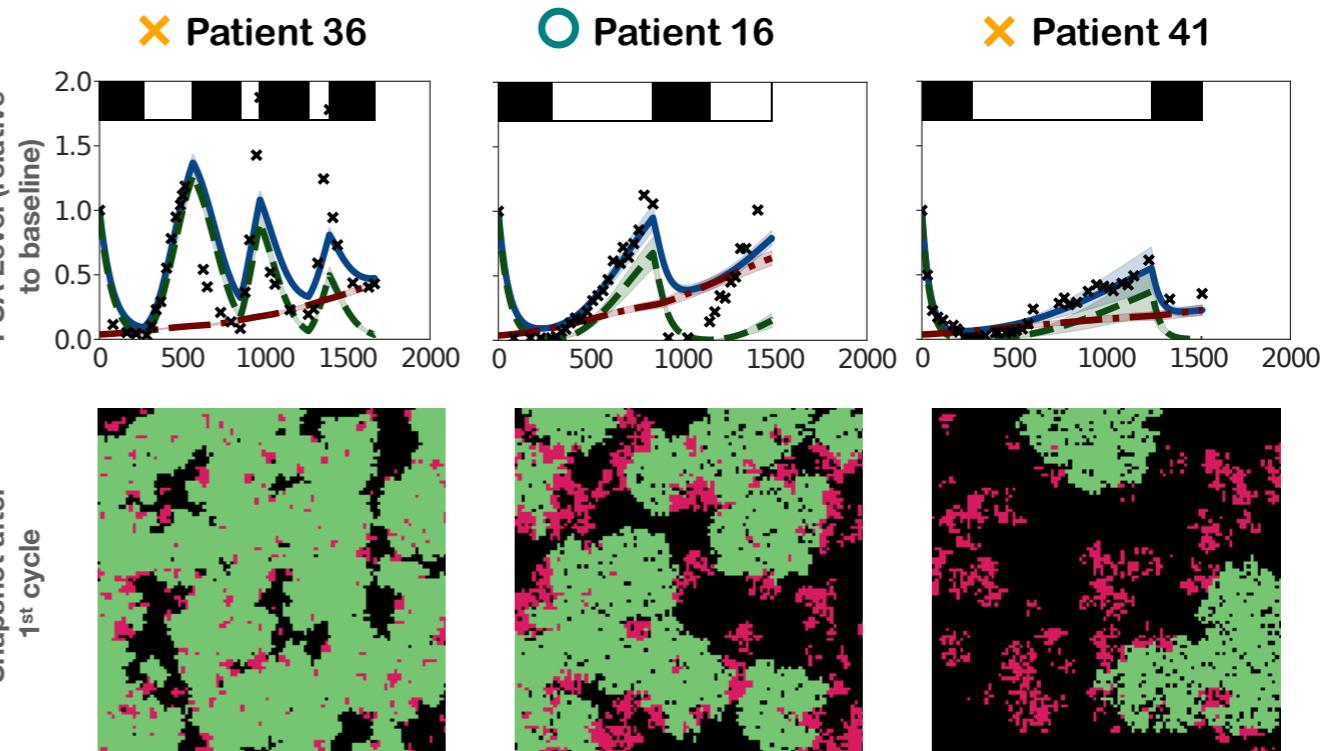
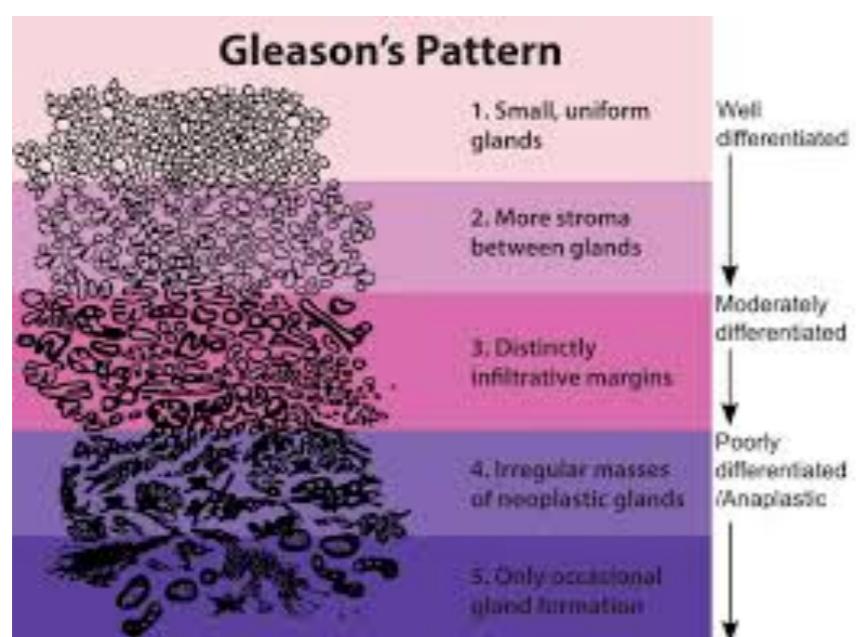
# The Carpet-Patch Hypothesis



Free parameters: cost, turnover.

# Is this idea plausible?

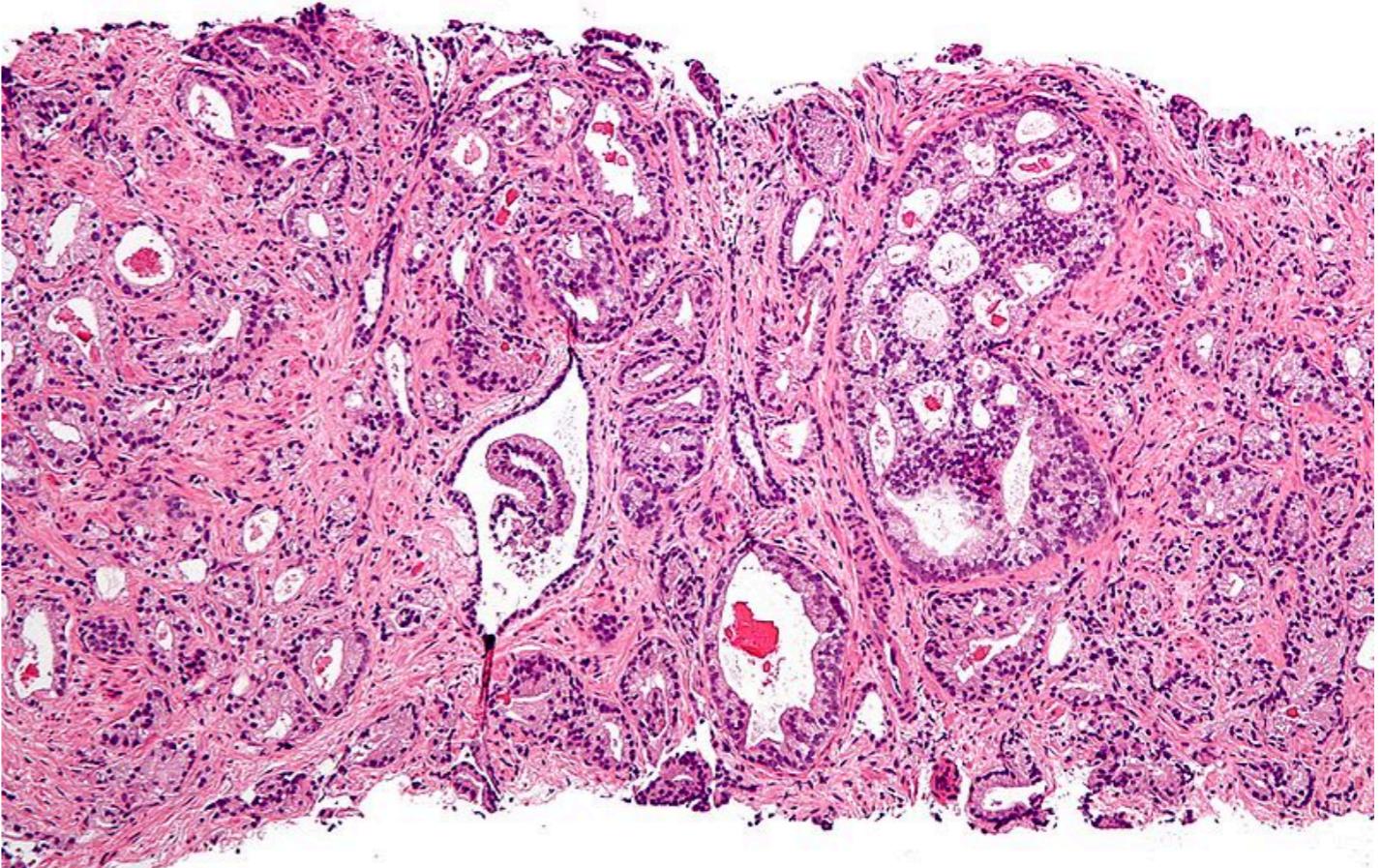
- Bruchovsky et al:  
*"suggestive trend that a Gleason score <6 may be associated with a slightly longer time off treatment in the initial 2 cycles."*



Free parameters: cost, turnover.

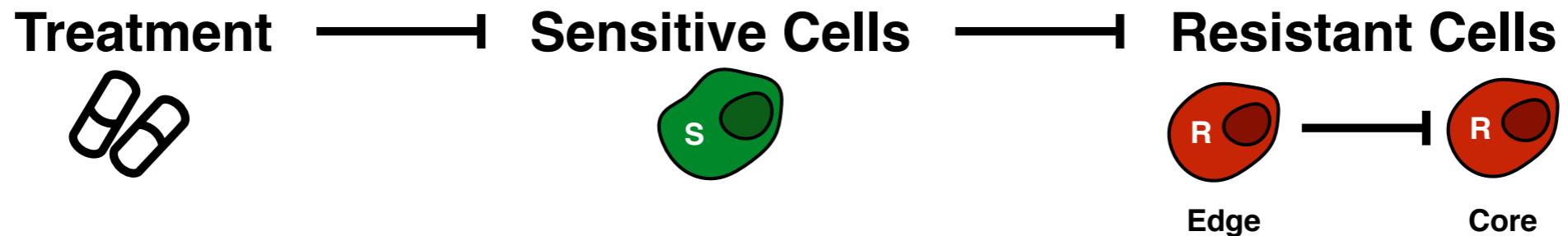
# Where next?

- Look beyond Lotka-Volterra:
  - Spatial structure
  - Resource competition
- The role of normal tissue.
- Role of stochasticity?



# Summary

— Inhibits



- **Intra-specific competition** is an important factor in AT.
- Need to incorporate **where** and **how often** resistance arises to judge benefit of AT.
- Patient **cycling dynamics** may tell us about spatial structure, and how we should adapt therapy.

# Acknowledgements

## Collaborators/Mentors



- Jill Gallaher



- Jeffrey West



- Mark Robertson-Tessi



- Mehdi Damaghi



- Yannick Viossat



- Joel Brown



- Robert Gatenby



- Philip Maini



- Sandy Anderson

## For more details:



*Strobl et al (2020). Spatial structure impacts adaptive therapy by shaping intra-tumoral competition. bioRxiv*



*Strobl et al (2020). Turnover modulates the need for a cost of resistance in adaptive therapy. Cancer Research.*



**Mathonco Blog post: K for carrying capacity.**

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# Appendix

