

# What is epithelial-mesenchymal plasticity and how can it help us understand metastasis?

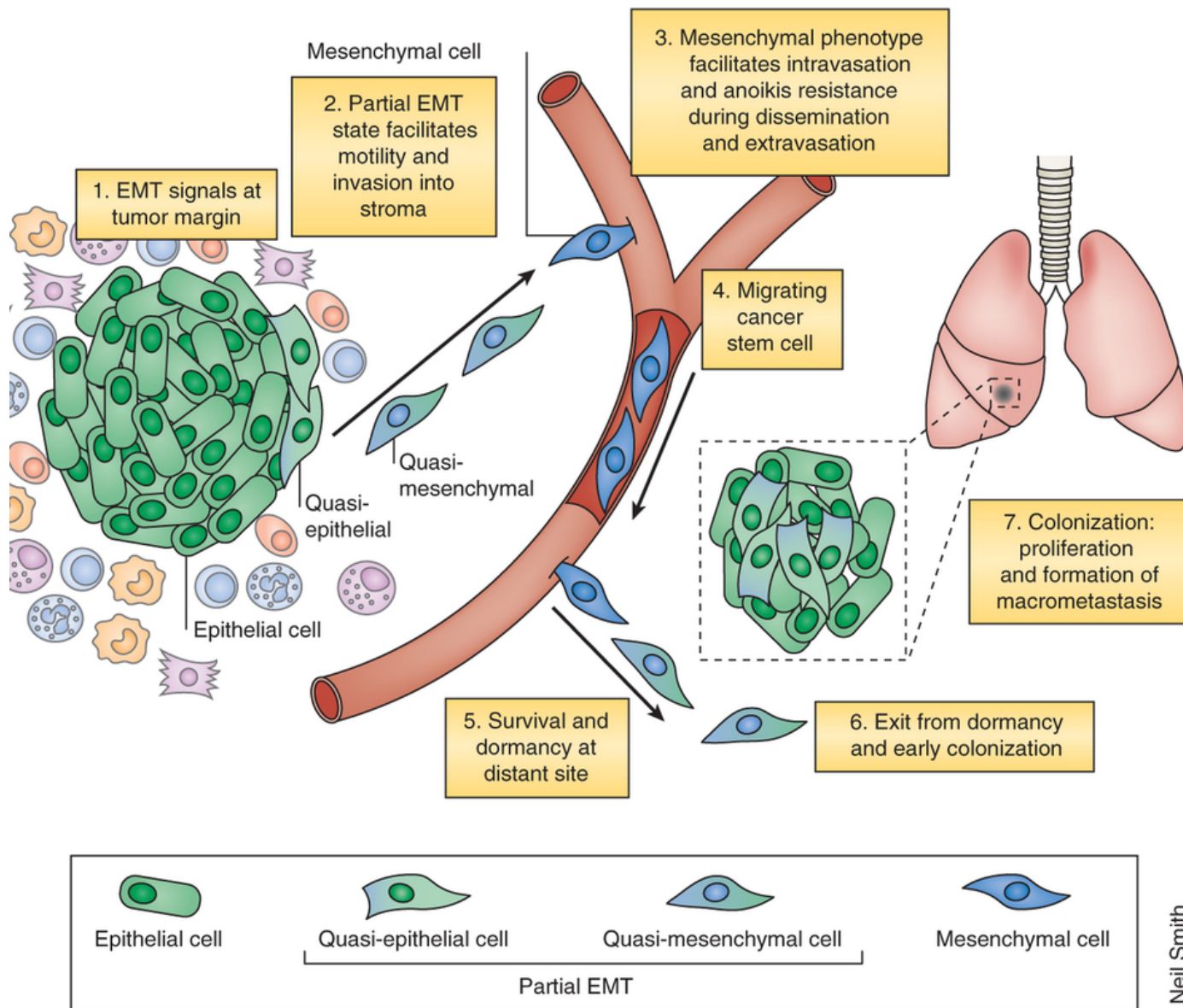
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# Epithelial plasticity – a hallmark of metastasis



# Questions to ponder

- What is the physics underlying cell motility as needed for cancer cell dispersal?
- How do cells dynamically change their “phenotype” from one state to another?
- Can understanding these issues help us better understand and treat cancer?

# Questions to ponder

- **What is the physics underlying cell motility as needed for cancer cell dispersal?**
  - Active Media, A New Branch of CMT
- How do cells change their “phenotype” from one state to another?
- Can understanding these issues help us better understand and treat cancer?



# The world of Active Media



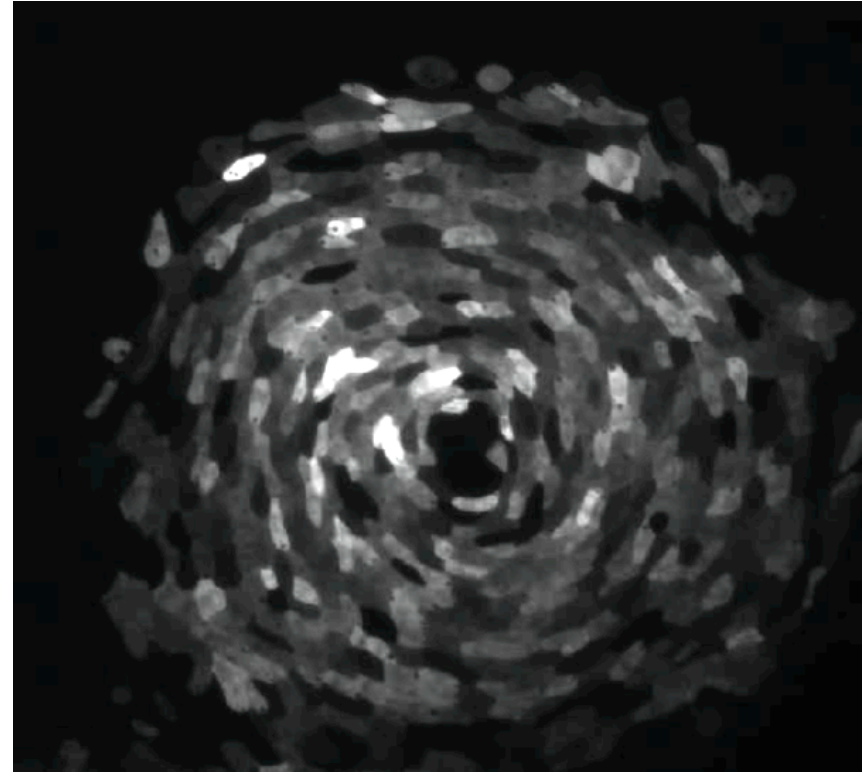
# Single cell dynamics



Here cell is polarized into protruding and contracting regions by an external chemical field – “chemotaxis”, a story unto itself

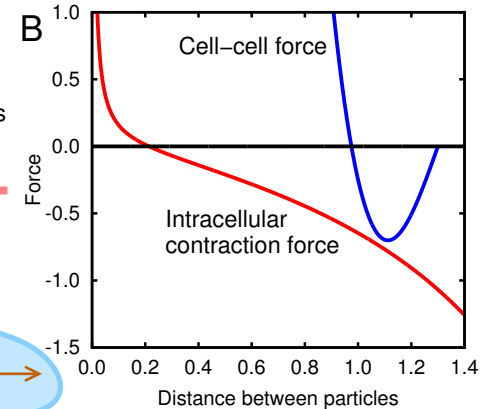
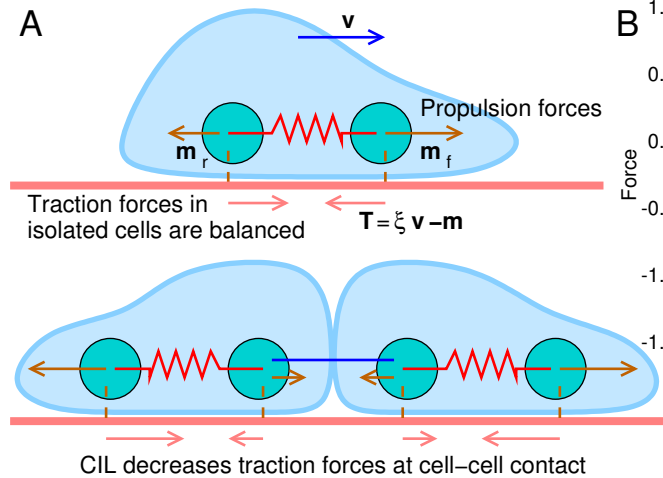
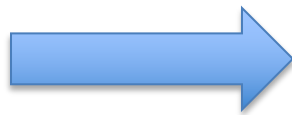
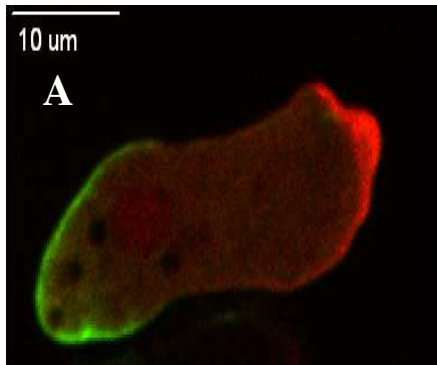
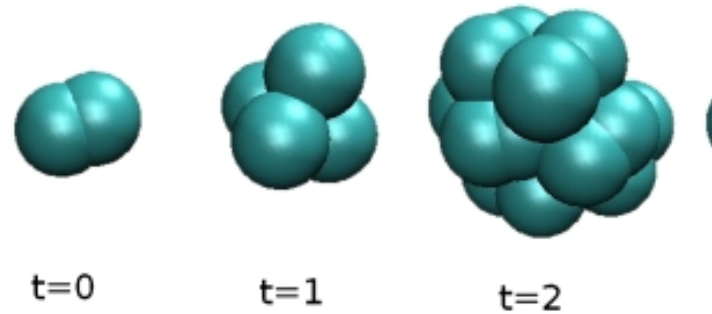
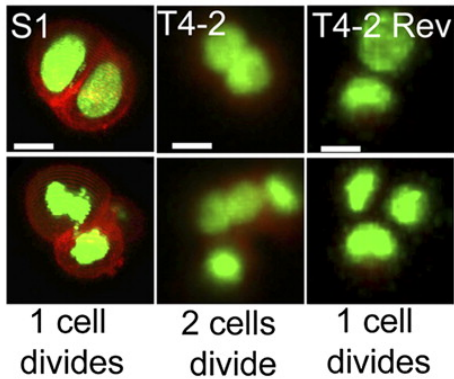
# Collective cell motility

- Cells have self-propulsion just like other living systems
- Direction of the propulsive forces is determined by cell polarization
- Here polarization is determined collectively by cell-cell interactions; cells “go with the flow”
- System can order even in 2d due to non-equilibrium effects; gave rise to the field of “active media”
- Seminal papers
  - [Vicsek, Ben-Jacob et al PRL \(1995\)](#)
  - [Toner and Tu, PRE \(1998\)](#)



Dictyostelium rotating aggregate  
Rappel, Levine et al, PRL 1999

# The making of a motility model

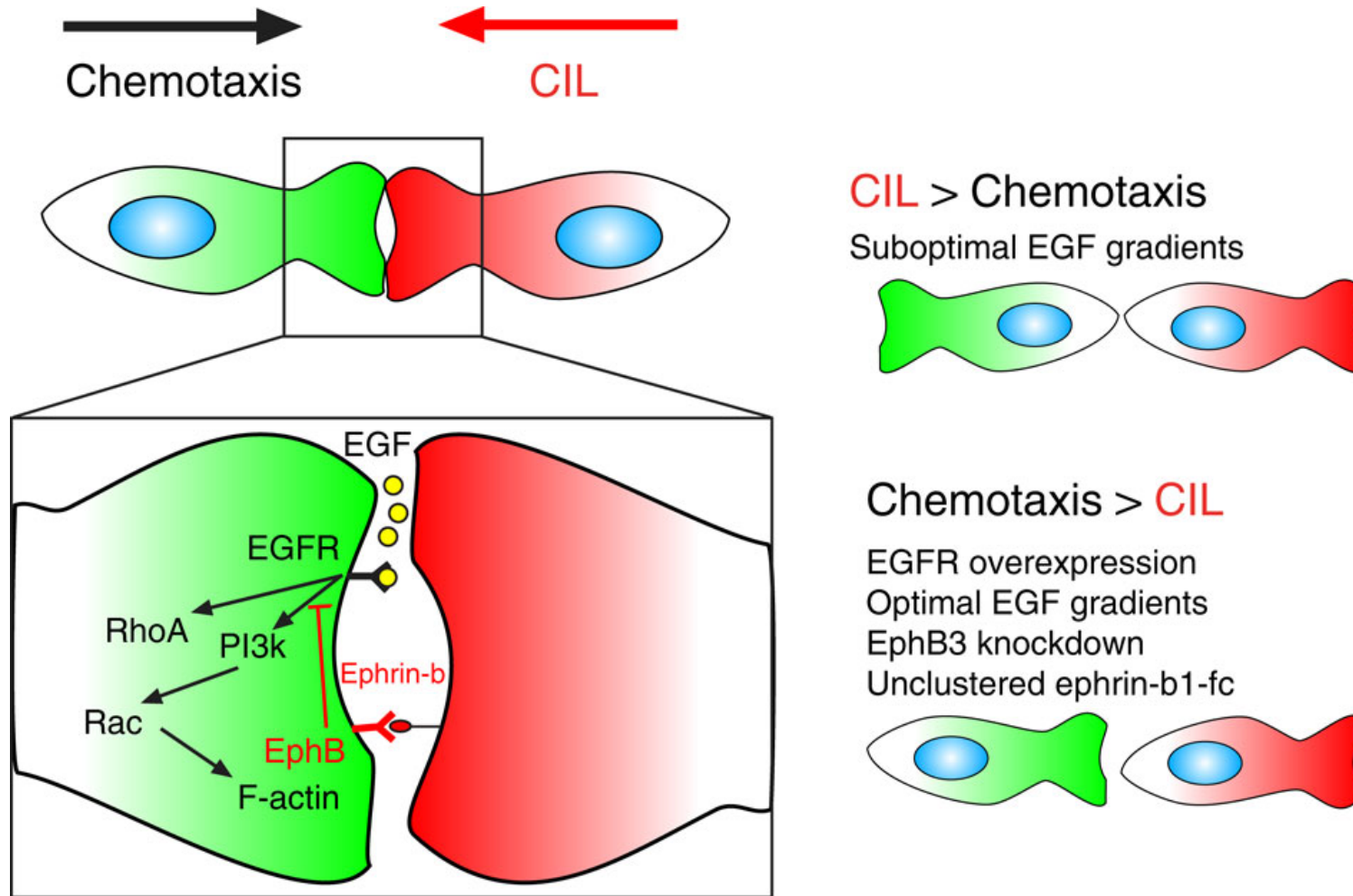


M. Basan et al PNAS (2013)

New version; Zimmerman PNAS (2016)

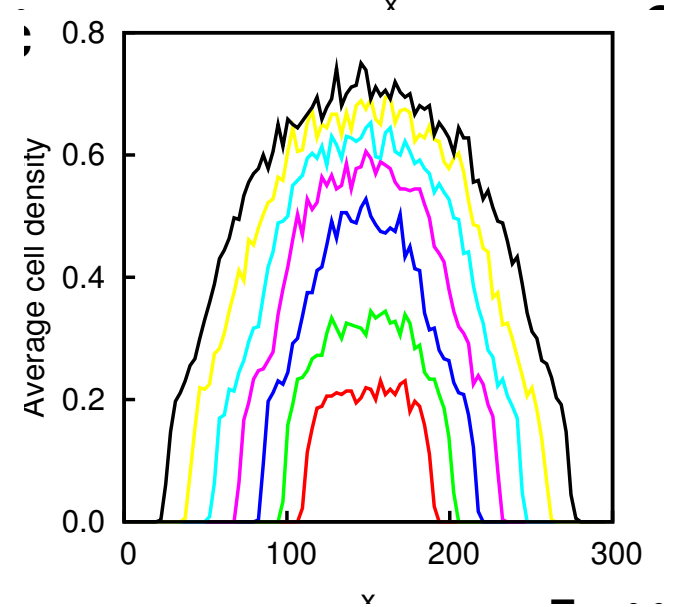
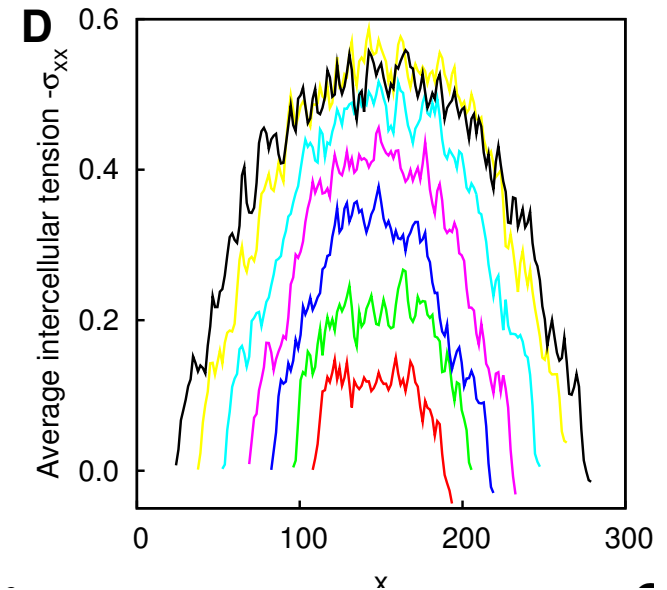
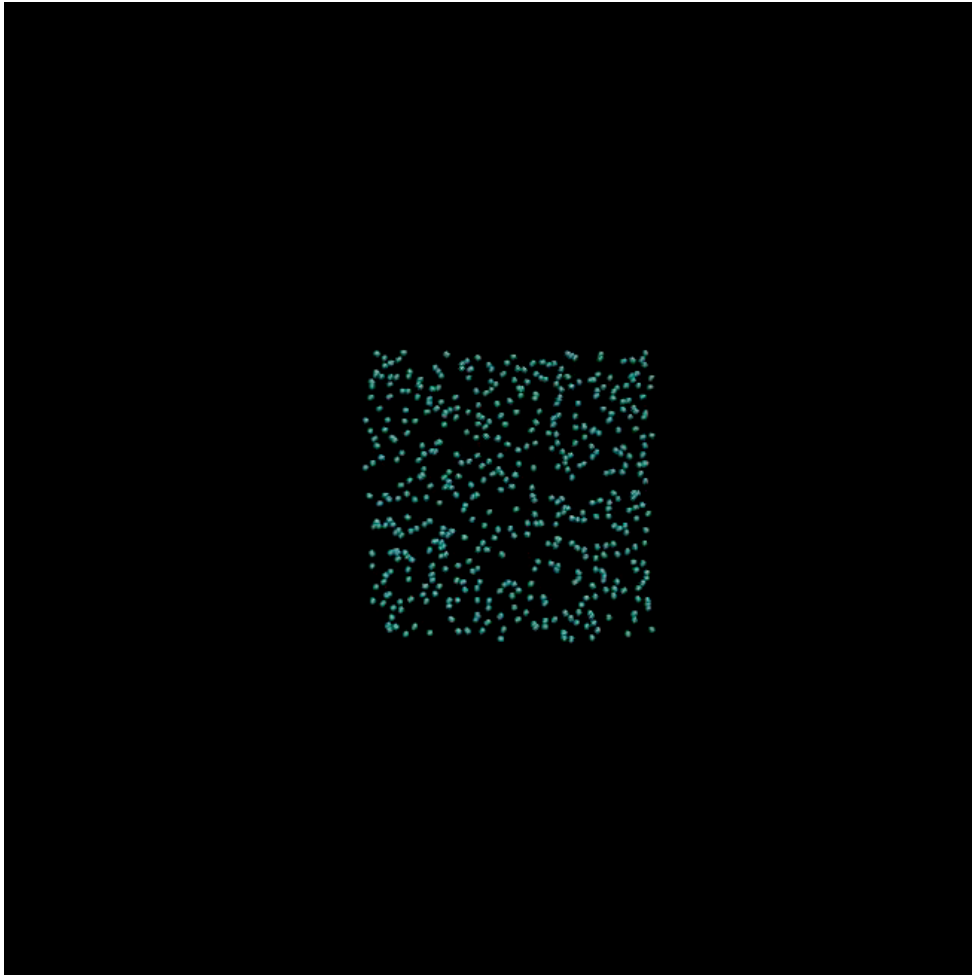


# Lin et al, Nat Comm (2014) – another guidance mechanism!

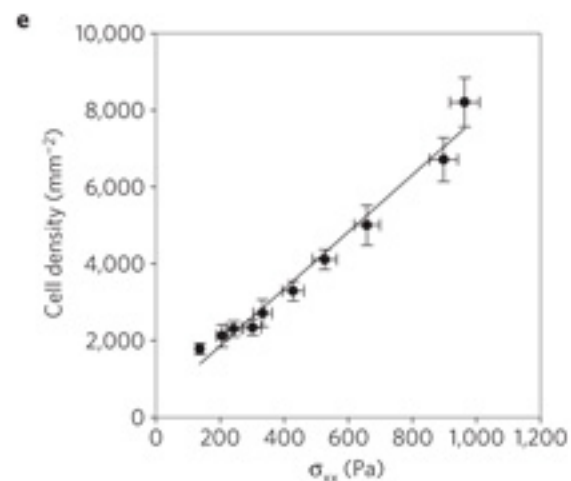
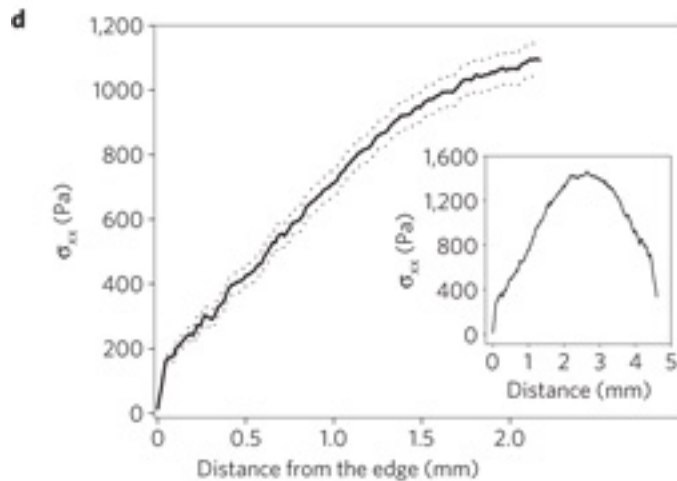
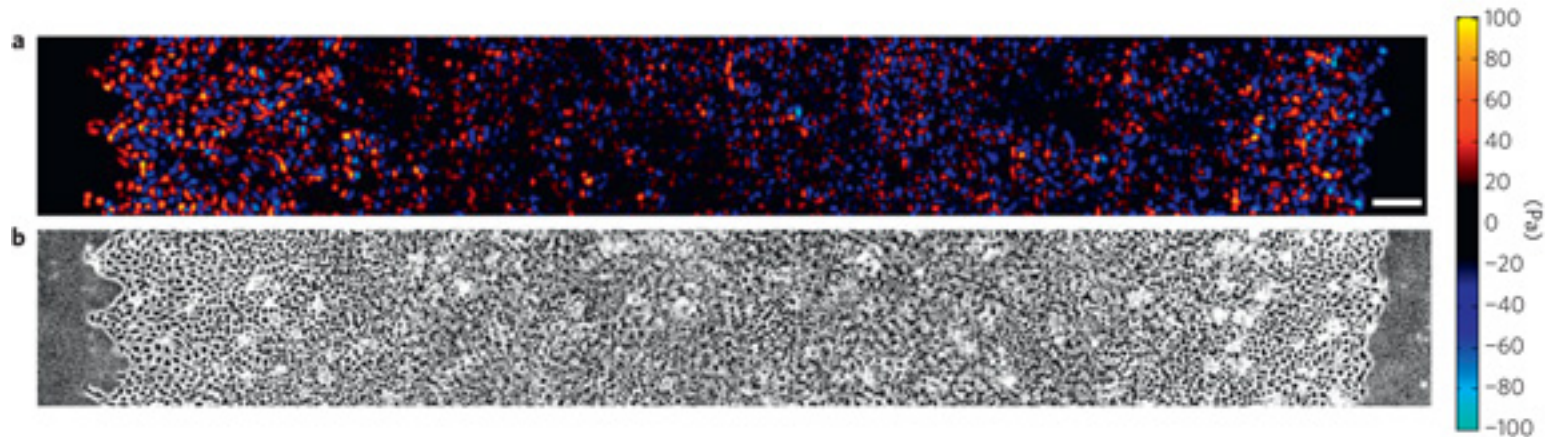


$$\partial_t \mathbf{p}^i = -\frac{1}{\tau} \mathbf{p}^i + \sigma \boldsymbol{\xi}^i(t) + \beta^i \sum_{j \sim i} \hat{\mathbf{r}}^{ij}$$

# Theory of epithelial spreading

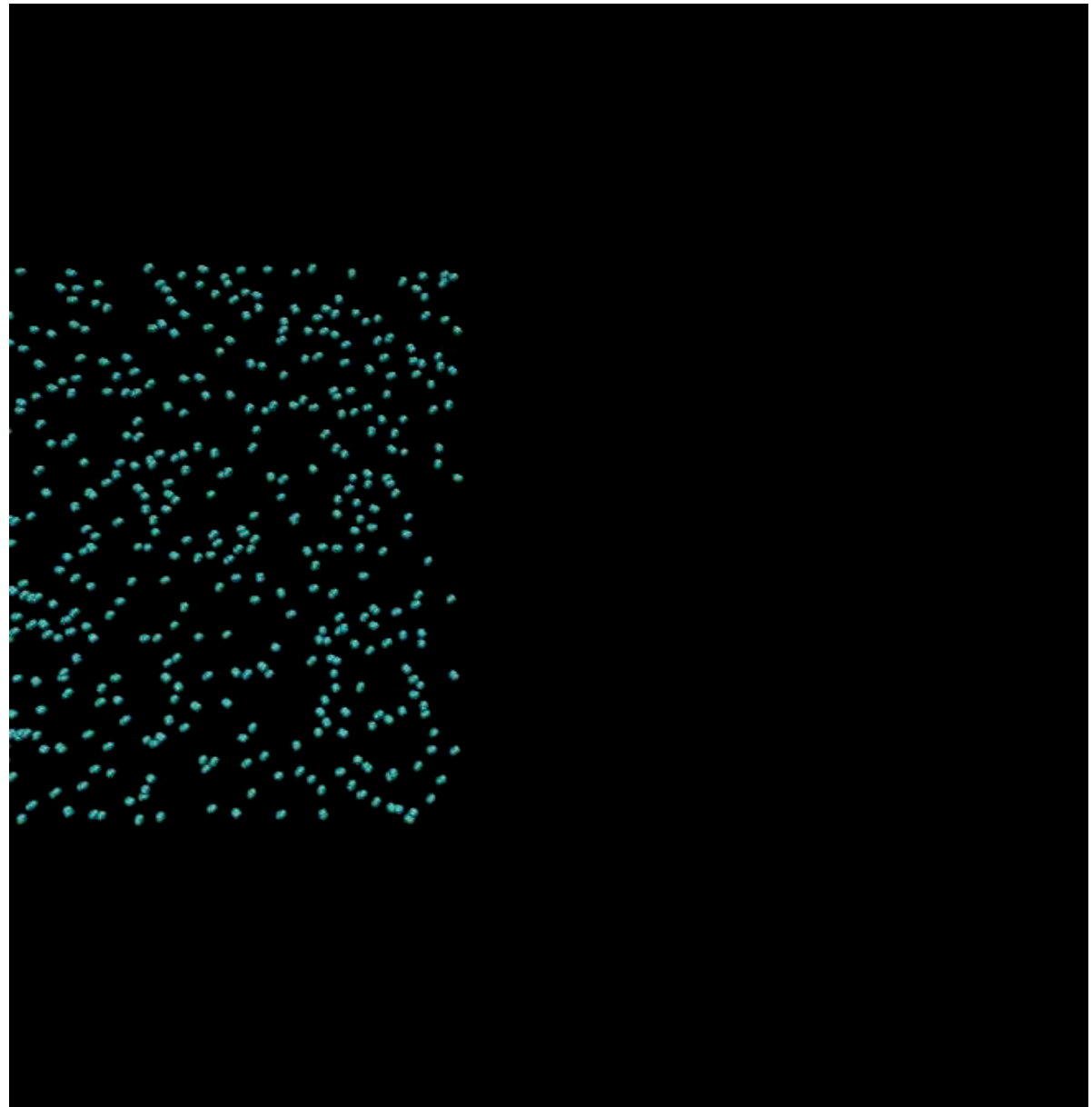


# Tissues under Tension (Trepapat et al)



Spreading  
around an  
obstacle

compare to  
Trepap  
experiment

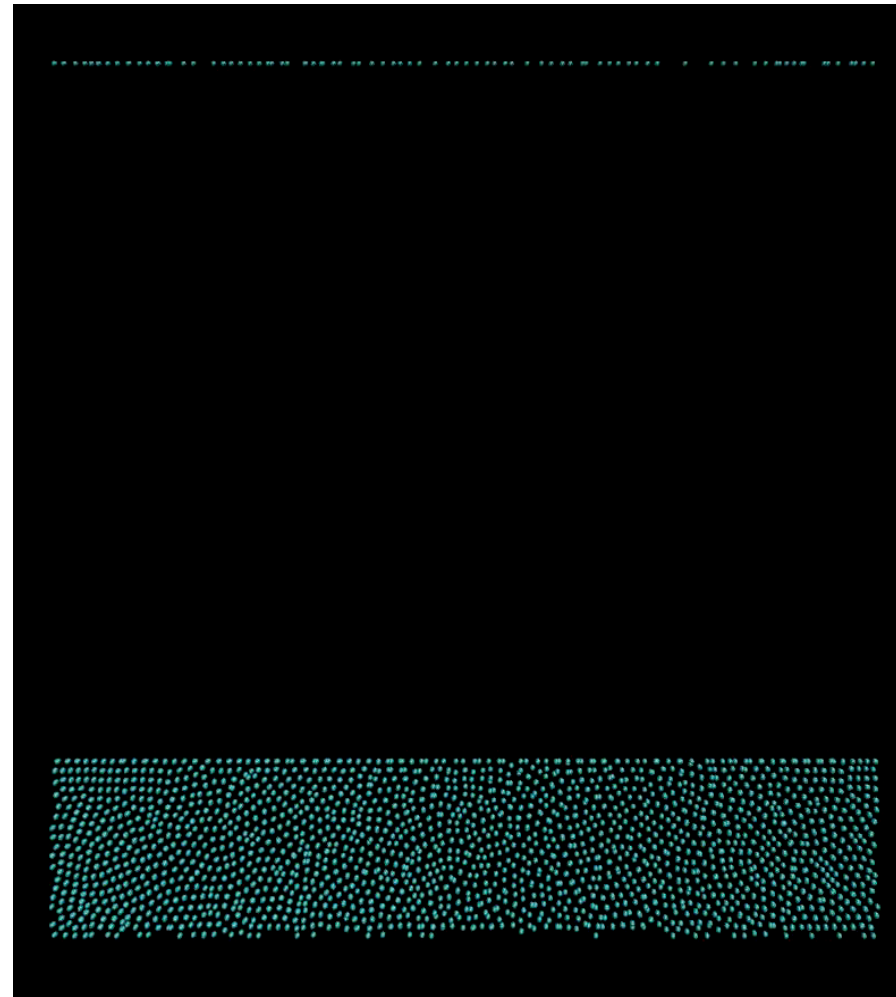
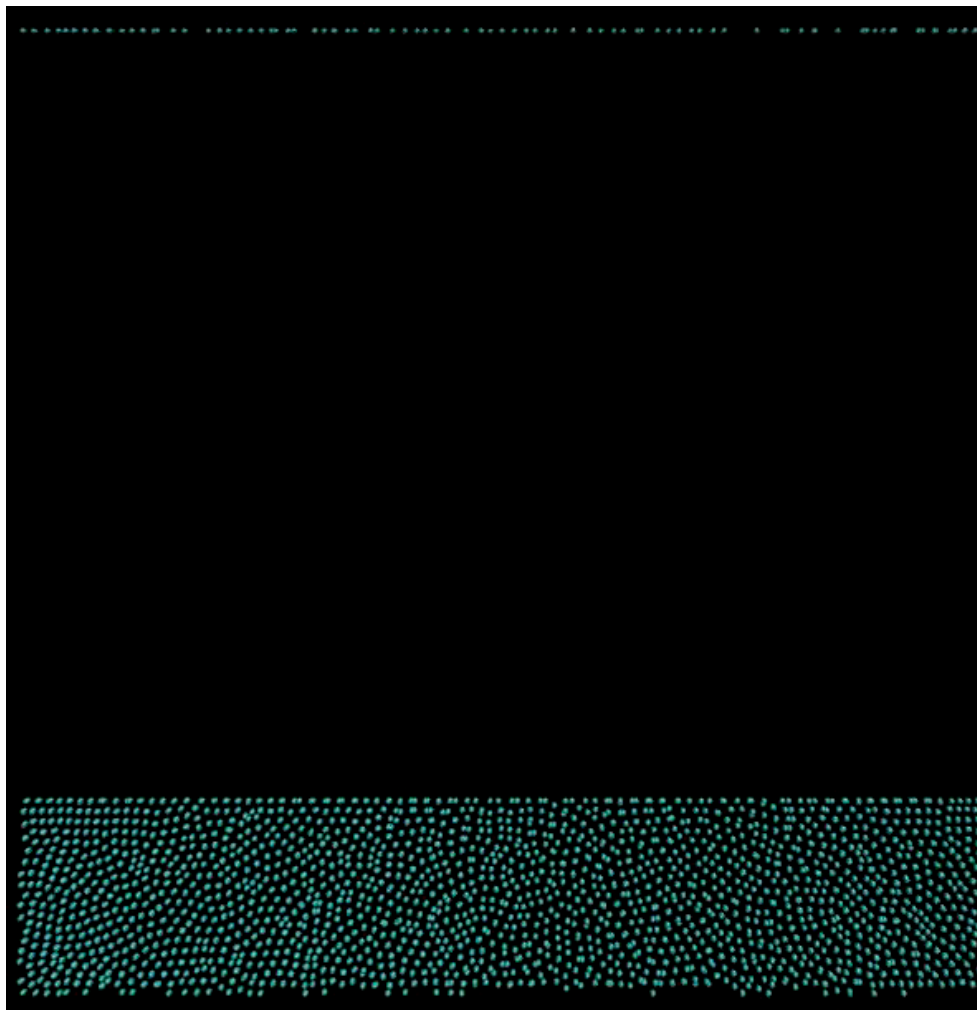




# Returning to tumors

- Cancer biologists have suggested that cells at the margin become motile, involving a reduction in cell-adhesion and remodeling of their internal cytoskeleton
- What does this type of active media motility model predict for the edge of a tumor when the cells have become motile?

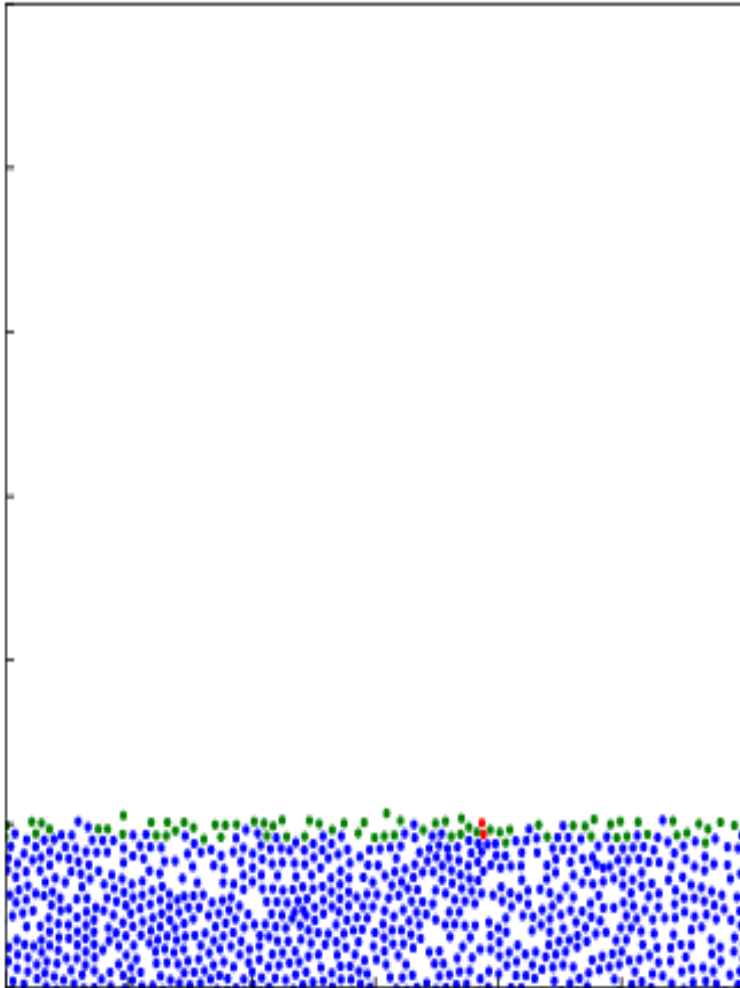
# Role of cadherin-based adhesion



Simulation of motility, with different proteomes of M vs E/M states

Based on Basan, et al PNAS (2013); Zimmerman et al, PNAS (2016)

Under some circumstances, collective motion can lead to fingers and streaming – Yang and Levine, Physical Biology, (2020)



- Linear instability of the moving front due to curvature dependence of leader cell emergence
- May be other mechanisms such as growth or orientational ordering but these have not yet been shown to lead to stable fingers

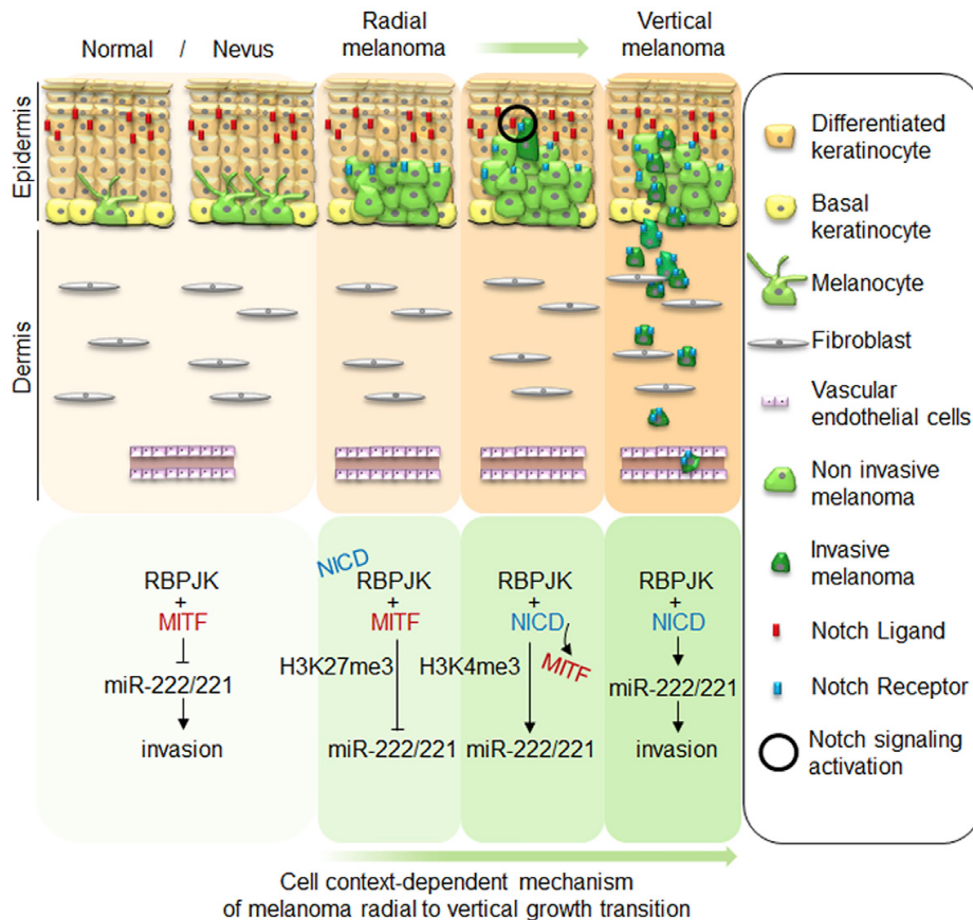
# Lessons so far

- Cells are self-propelled objects that can cooperatively organize their motion
- One can expect that some cells will move individually, other as collective objects
- This transition is controlled by biophysical parameters such as cell-cell adhesion versus the strength of self-propulsion forces

# Questions to ponder

- What is the physics underlying cell motility as needed for cancer cell dispersal?
- **How do cells change their “phenotype” from one state to another?**
  - Dynamical systems and bifurcation theory
- Can understanding these issues help us better understand and treat cancer?

# Focus on change in microenvironment



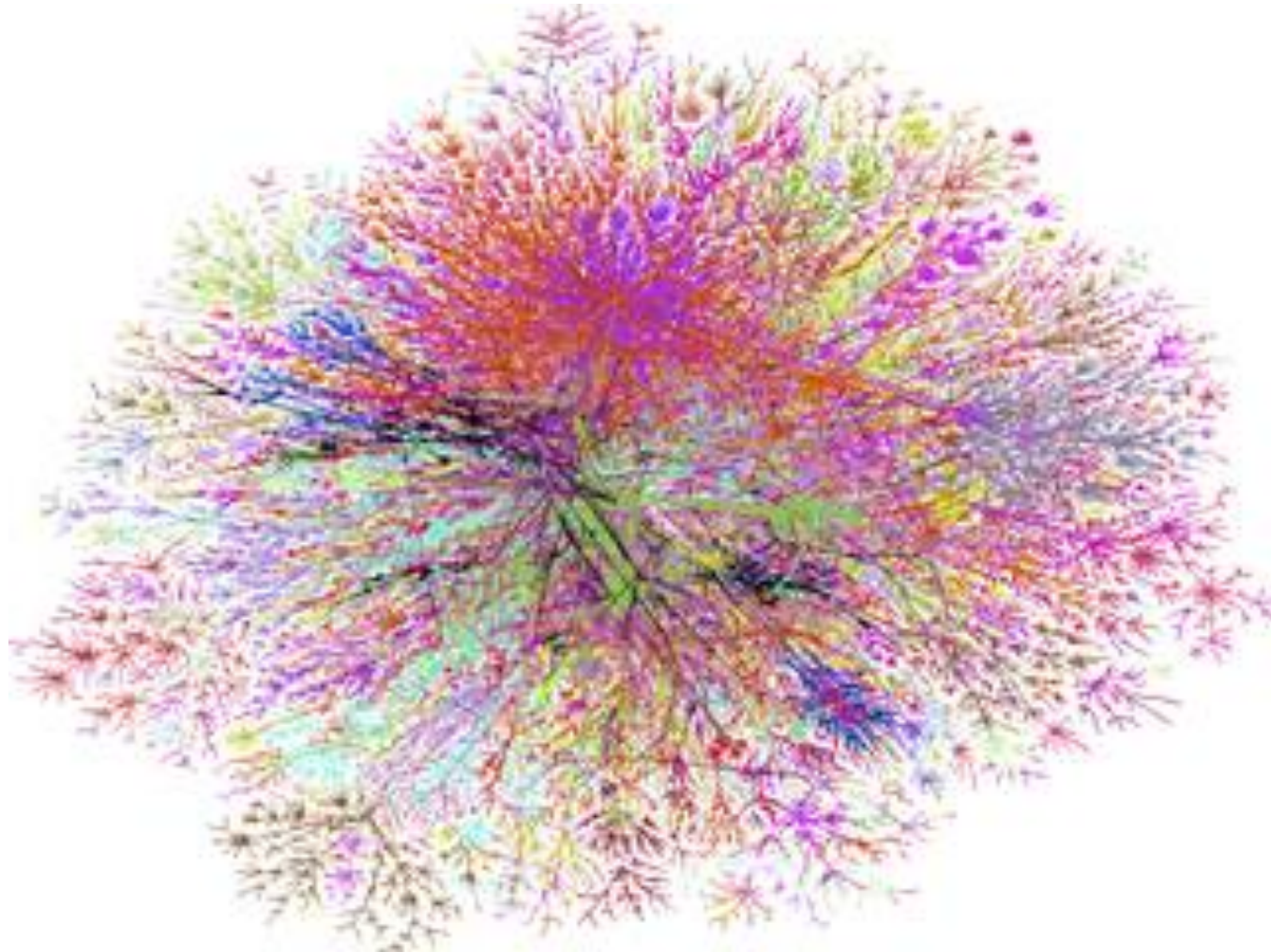
## Melanoma example Golan et al, Mol Cell (2015)

**Phenotypic transition is not caused by additional mutations**

**Cells become metastatic competent by being exposed to a new chemical environment; seems to be irreversible**

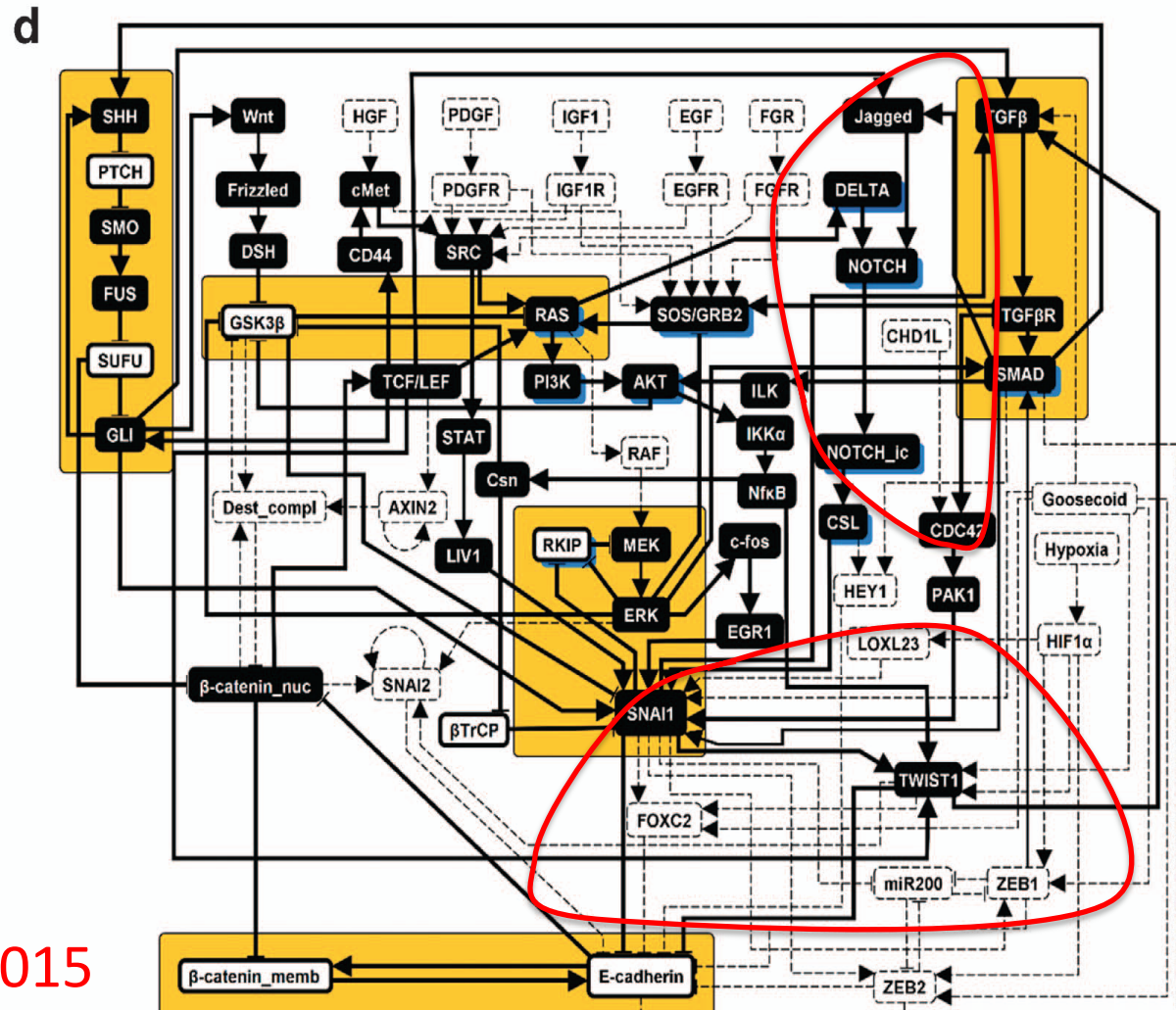
**Notch pathway plays the critical role in this transition**

# The World of Networks





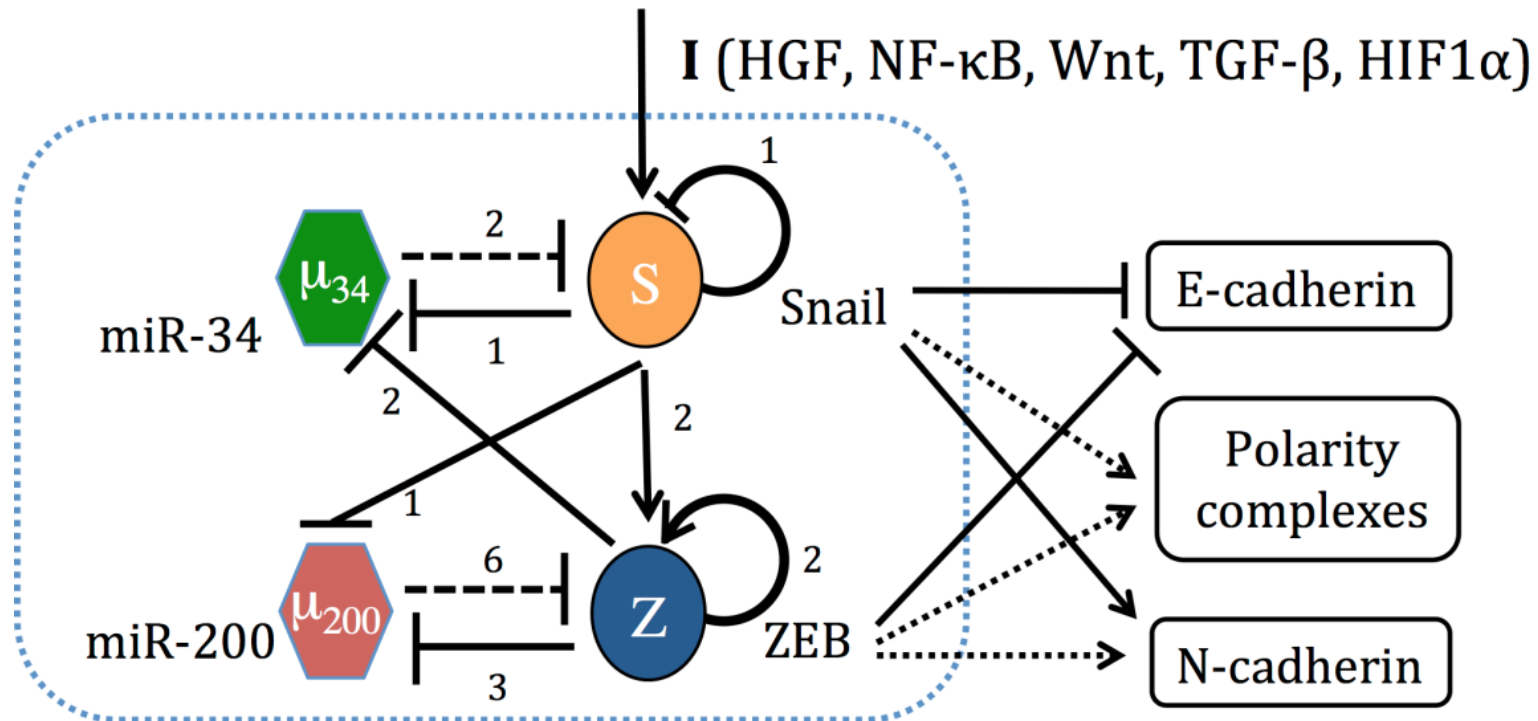
# simplified EMT circuit diagram



Albert group, 2015

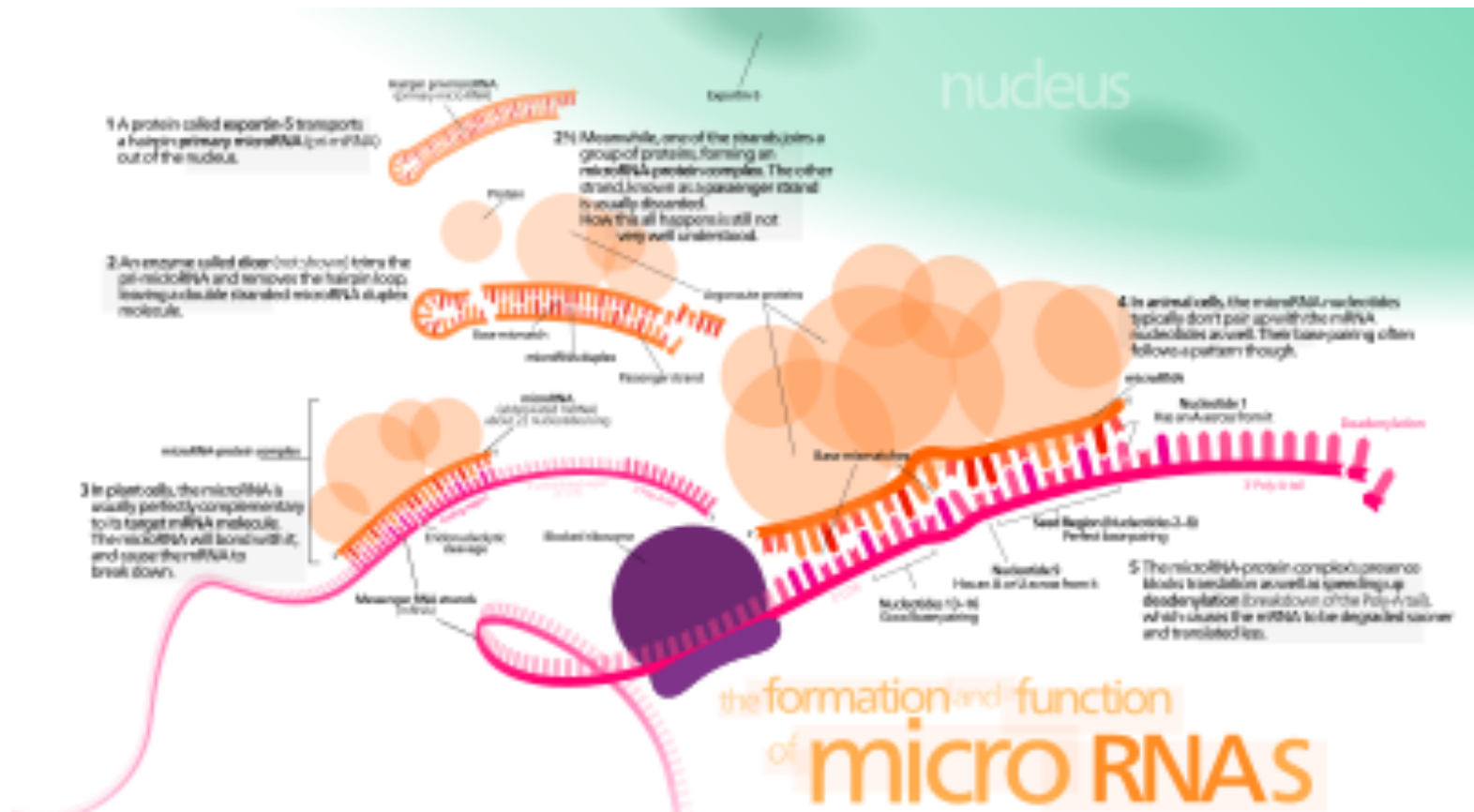


# The core EMT genetic circuit



- Each arrow is a quantitative relationship between the input and output levels
- This has been done for many transcription circuits, e.g. in microorganisms
- We needed to develop a new method for translation regulation


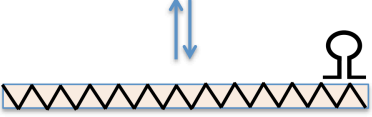
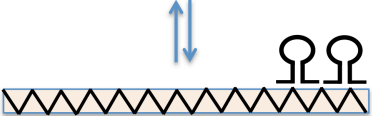

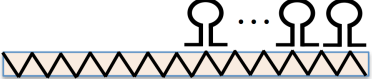

# Biology since I went to High School



Levine, Erel, Eshel Ben Jacob, and Herbert Levine. "Target-specific and global effectors in gene regulation by MicroRNA." *Biophysical journal* 93.11 (2007): L52-L54

Loinger, A., Shemla, Y., Simon, I., Margalit, H. and Biham, O., 2012. Competition between small RNAs: a quantitative view. *Biophysical journal*, 102(8), pp.1712-1721.

# Generalized equations

	Population	Degeneracy	Effective Translation	mRNA Active Degradation	microRNA Active Degradation
	$M_n^0(\mu)$	$C_n^0$	$l_0$	0	0
	$M_n^1(\mu)$	$C_n^1$	$l_1$	$\gamma_{m1}$	$\gamma_{\mu 1}$
	$M_n^2(\mu)$	$C_n^2$	$l_2$	$\gamma_{m2}$	$\gamma_{\mu 2}$
					
	$M_n^i(\mu)$	$C_n^i$	$l_i$	$\gamma_{m2}$	$\gamma_{\mu 2}$
					
<b>Total</b>			$\sum_{i=0}^n l_i C_n^i M_n^i$	$\sum_{i=1}^n \gamma_{mi} C_n^i M_n^i$	$\sum_{i=1}^n i \gamma_{\mu i} C_n^i M_n^i$

These sums define

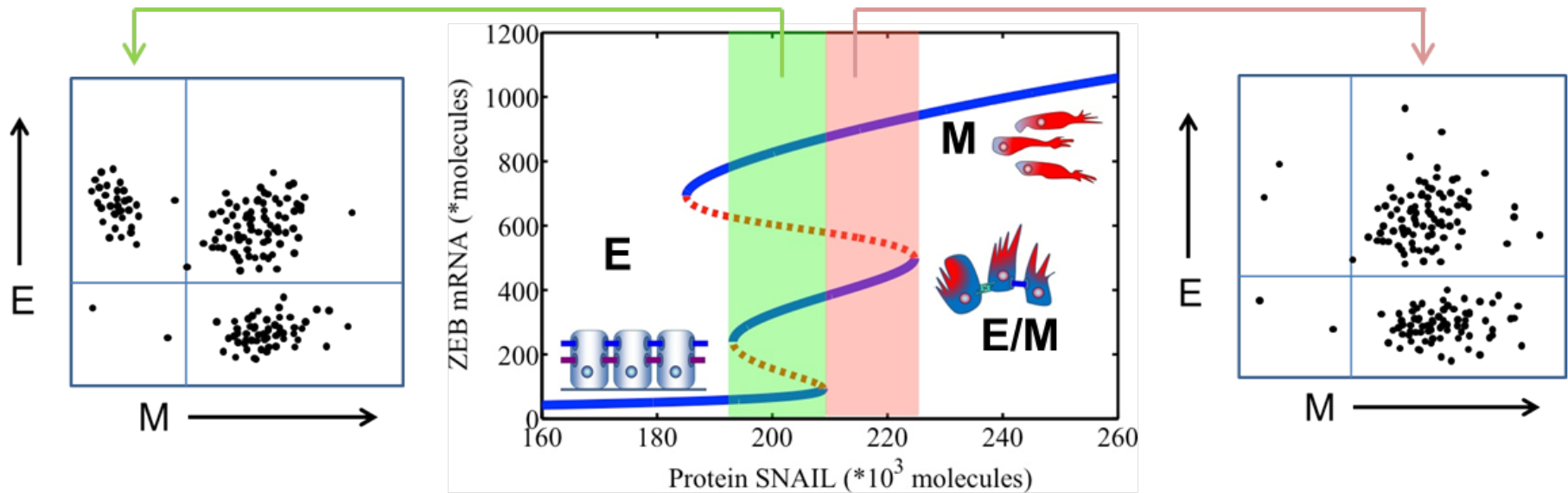
- $L$  = translation suppression
- $Y_{\mu}$  = degradation increase
- $Y_m$  = decay increase
- $H$  – standard Hill form for transcription regulation

$$\dot{\mu}_{200} = g_{\mu_{200}} H^S(Z, \lambda_{Z, \mu_{200}}) H^S(S, \lambda_{S, \mu_{200}}) - m_Z Y_{\mu}(\mu_{200}) - k_{\mu_{200}} \mu_{200}$$

$$\dot{m}_Z = g_{m_Z} H^S(Z, \lambda_{Z, m_Z}) H^S(S, \lambda_{S, m_Z}) - m_Z Y_m(\mu_{200}) - k_{m_Z} m_Z$$

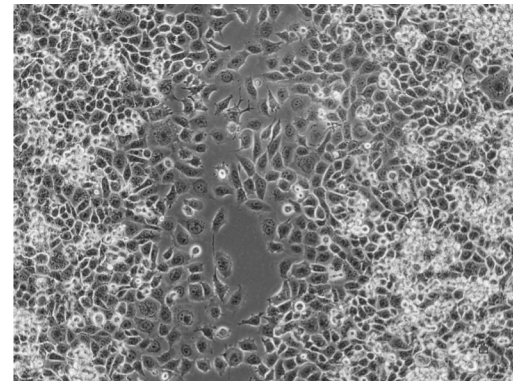
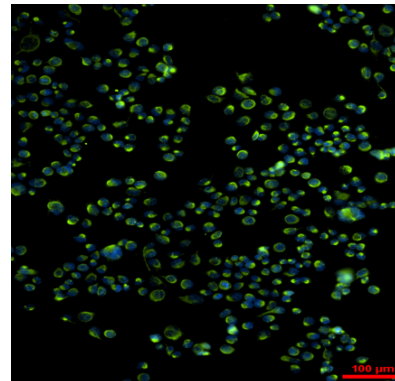
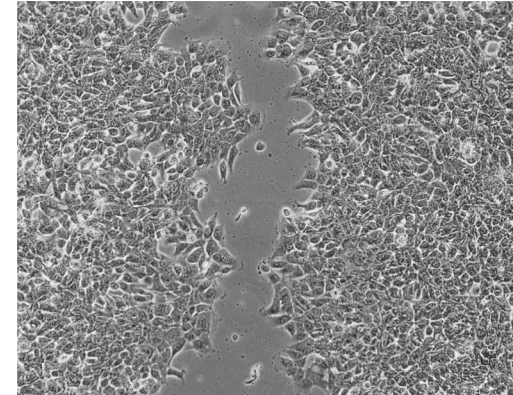
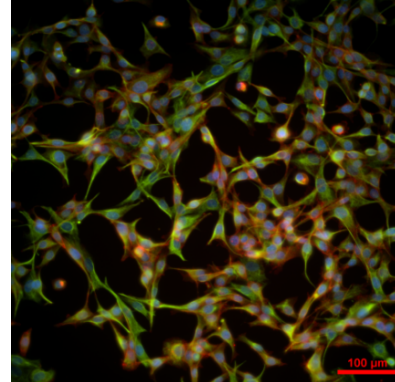
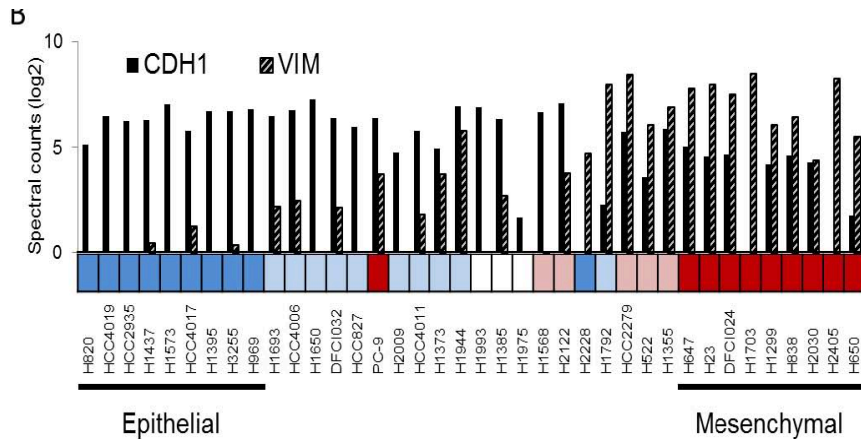
$$\dot{Z} = g_Z m_Z L(\mu_{200}) - k_Z Z$$

# Coexistence of multiple phenotypes



- Note that at intermediate EMT driving, population with this network is expected to be multimodal
- Other cell lines with other modulating factors (e.g. GRHL2) can create unimodal hybrid states

# What kind of cells move collectively

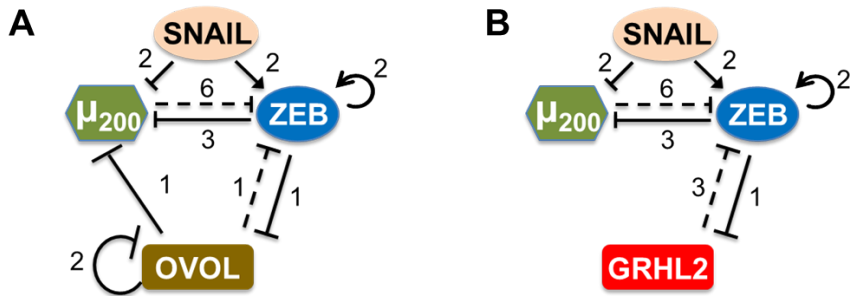


- Three types identified; E, M and E/M
- Correlates with motility
- Can be de-stabilized by knockdown of predicted stability factors

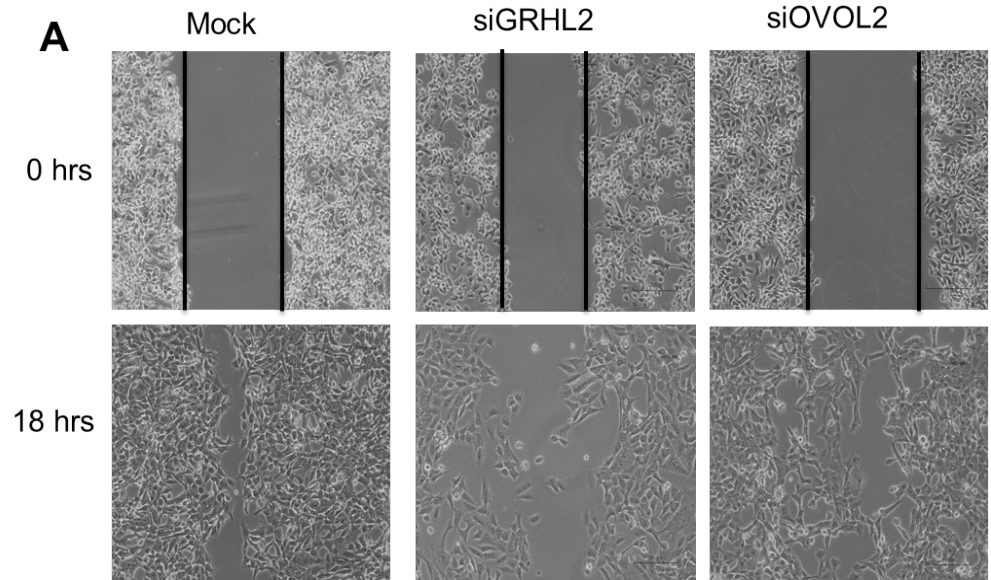
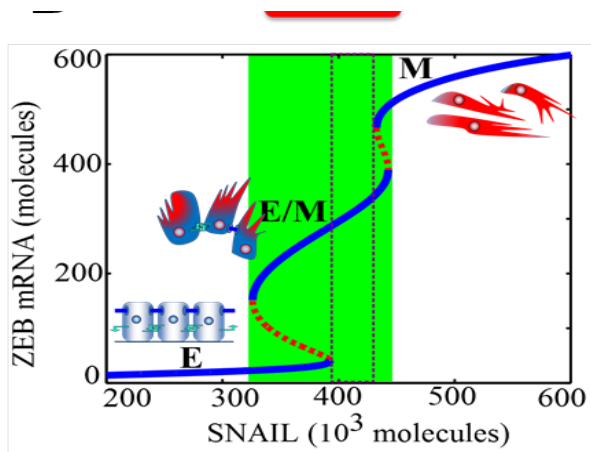
With Hanash group, MD Anderson Cancer Center



# Phenotypic stability factors

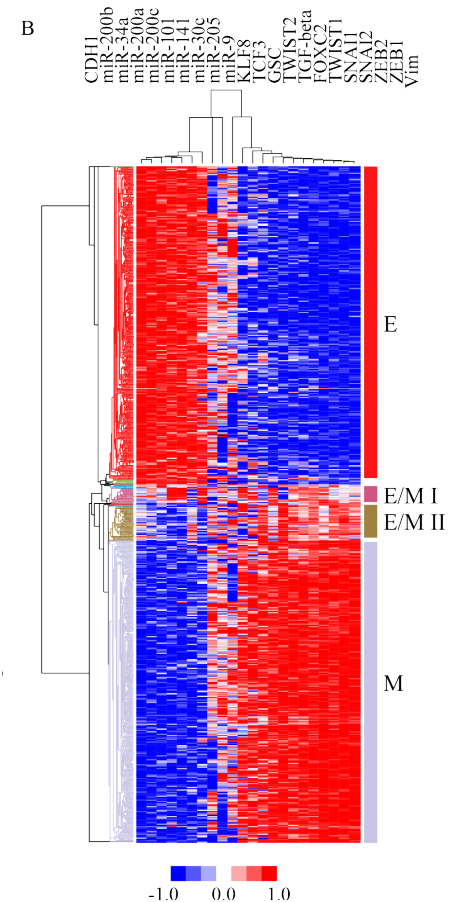
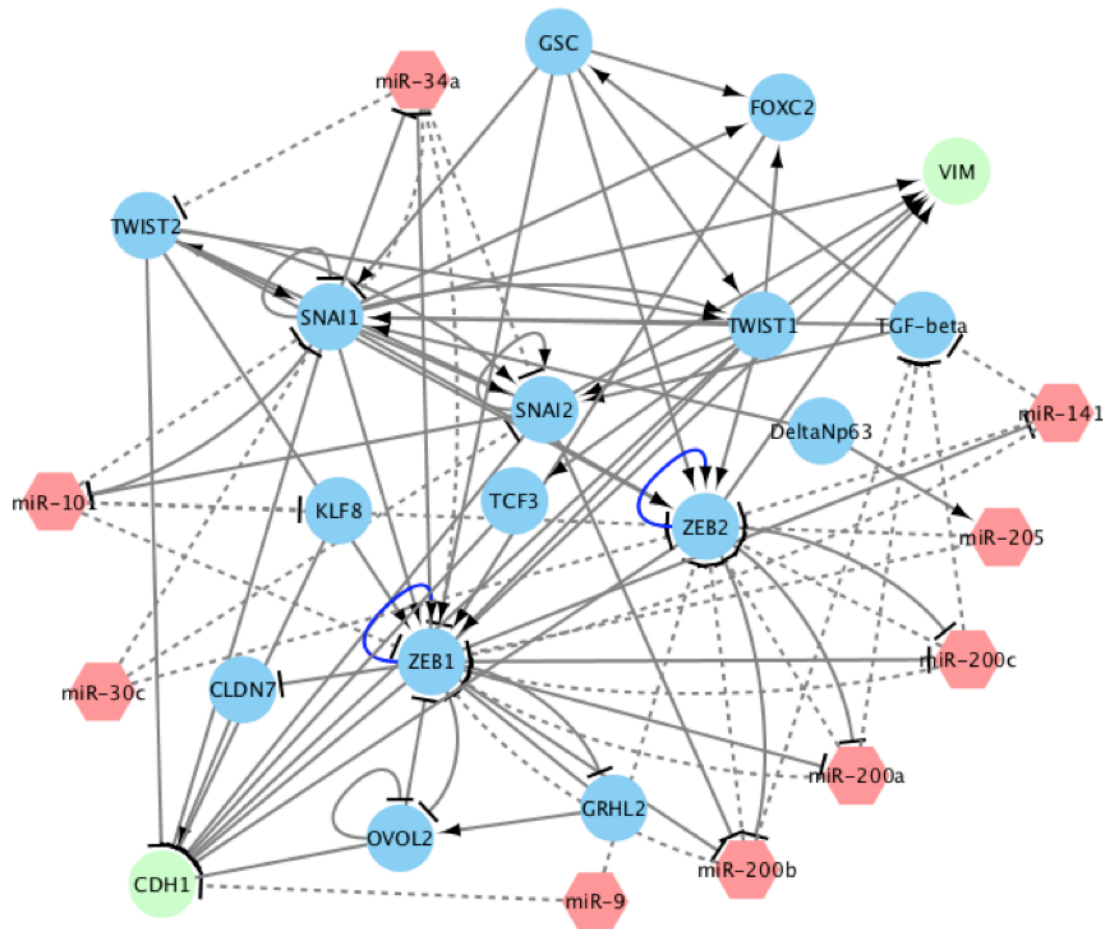


- Form of coupling to baseline circuit can predict effect of specific perturbations
- Key is increased frustration

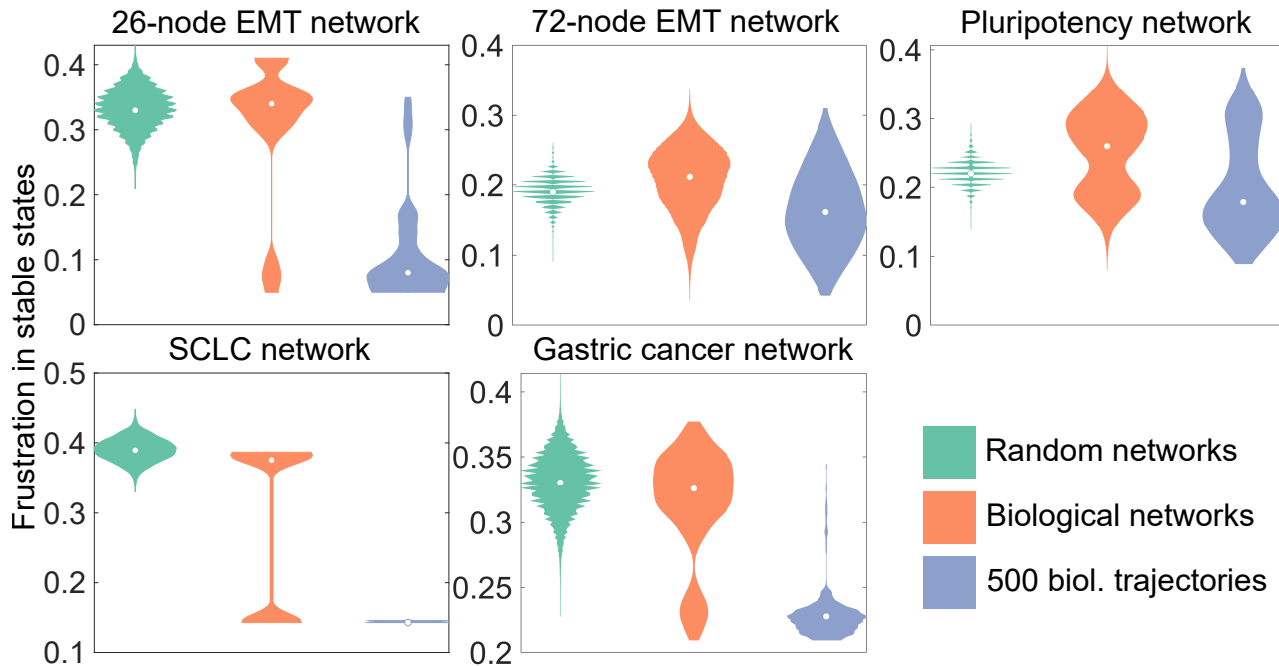


With Hanash, MDACC; Pienta (JHU) – (Oncotarget, 2016)

# Results are robust upon going to more complete EMT circuit



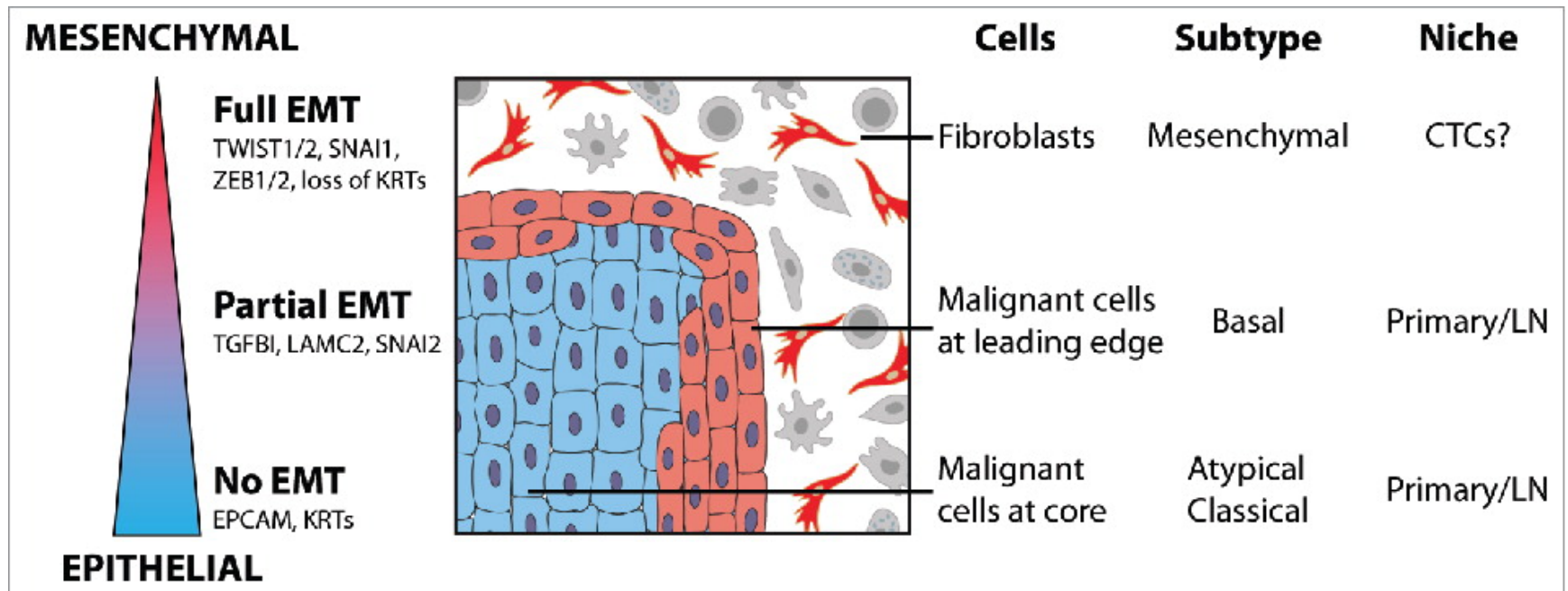
# Most recent ideas



- Physiological networks are designed to have small number of "phenotypes" with large basins of attraction
- Hybrid states specifically require expression of phenotypic stability factors. i.e. added frustration, for stabilization
- See Tripathi, Kessler and Levine, PRL (2020)

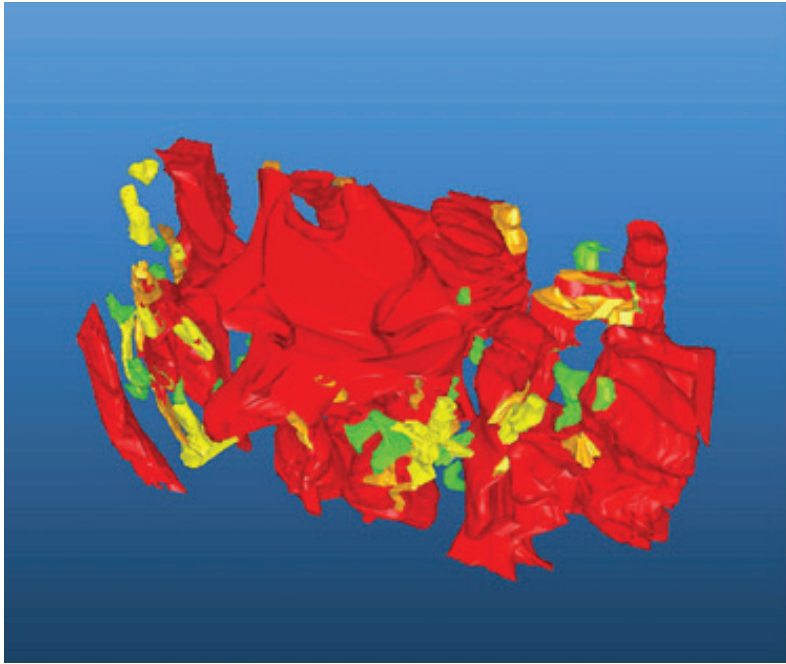


# From sequencing of head and neck tumors classification based on scRna-seq



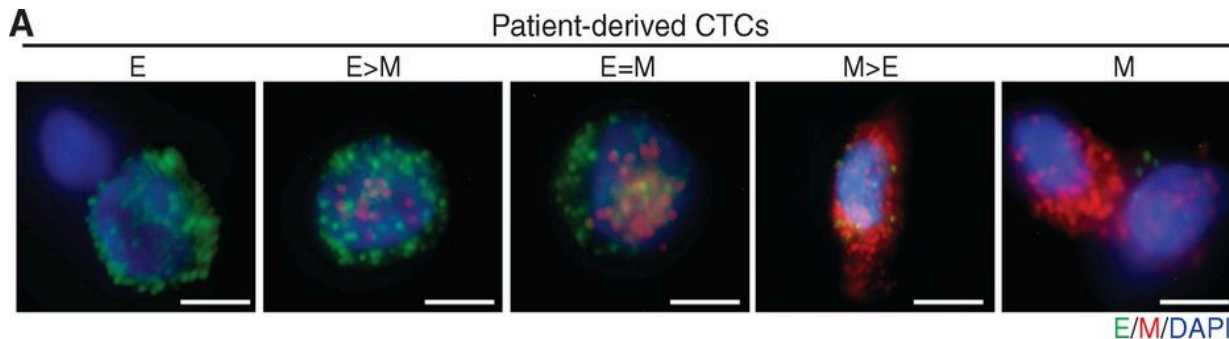
Sidharth V. Puram, Anuraag S. Parikh & Itay Tirosh (2018) Single cell RNA-seq highlights a role for a partial EMT in head and neck cancer, *Molecular & Cellular Oncology*, based on *Cell* paper (2017)

# Collective motility leads to clusters



- Clusters are typically composed of several cells
- Cells in cluster express ZEB1, reduced membrane resident E-cadherin
- Hypothesized to be partial EMT phenotype

Main tumor = red, multicellular buds = green, from Bronsert et J. Path (2014))



Yu *et al.* Science 2013

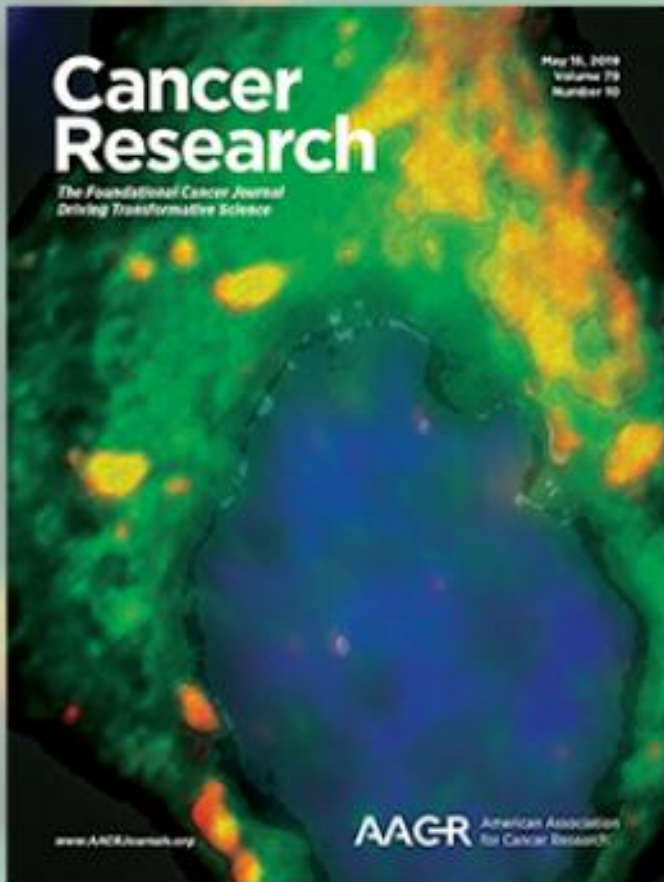
# At this point in the story ...

- Cells can undergo motility transformation at the edge of the tumor
- This can create individually moving cells (full EMT) or collectively moving cells (partial EMT)
- Evidence that partial EMT is common and leads to the formation of clusters of metastasizing cells

# Questions to ponder

- What is the physics underlying cell motility as needed for cancer cell dispersal?
- How do cells change their “phenotype” from one state to another?
- **Can understanding these issues help us better understand and treat cancer?**
  - Key insight relates to “tumor initiation potential”

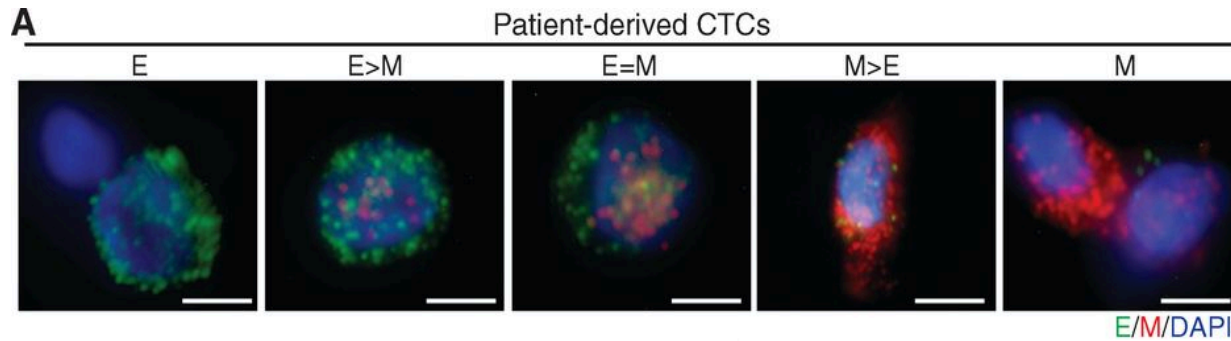
# The World of Cancer Research



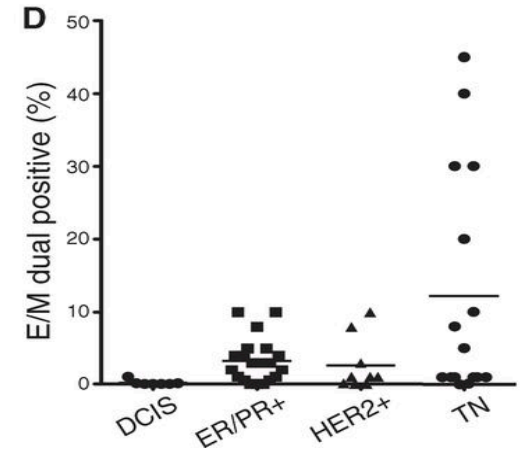
THE UNIVERSITY OF TEXAS  
~~MD Anderson~~  
Cancer Center

Making Cancer History®

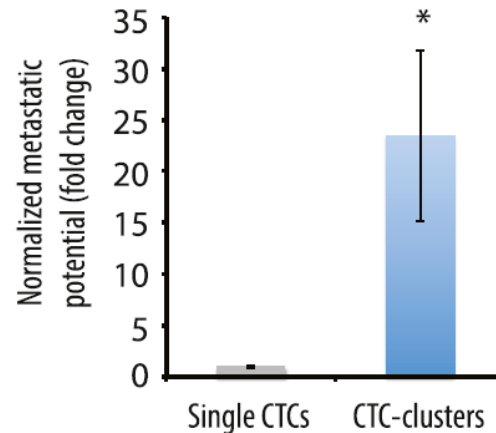
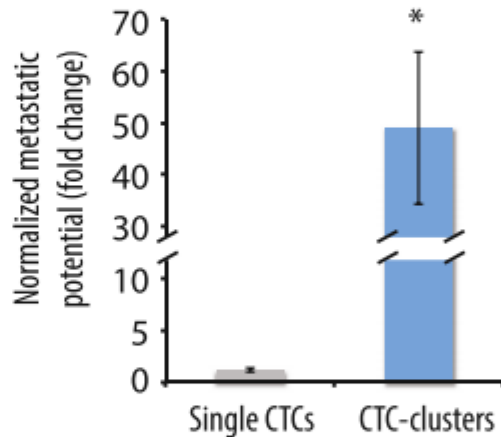
# Hybrid Clusters Seem to be More Metastatic



Clusters of CTCs co-express epithelial and mesenchymal features



Yu *et al.* Science 2013



Clusters of CTCs are associated with poor prognosis, have more metastatic potential and are more apoptosis-resistant

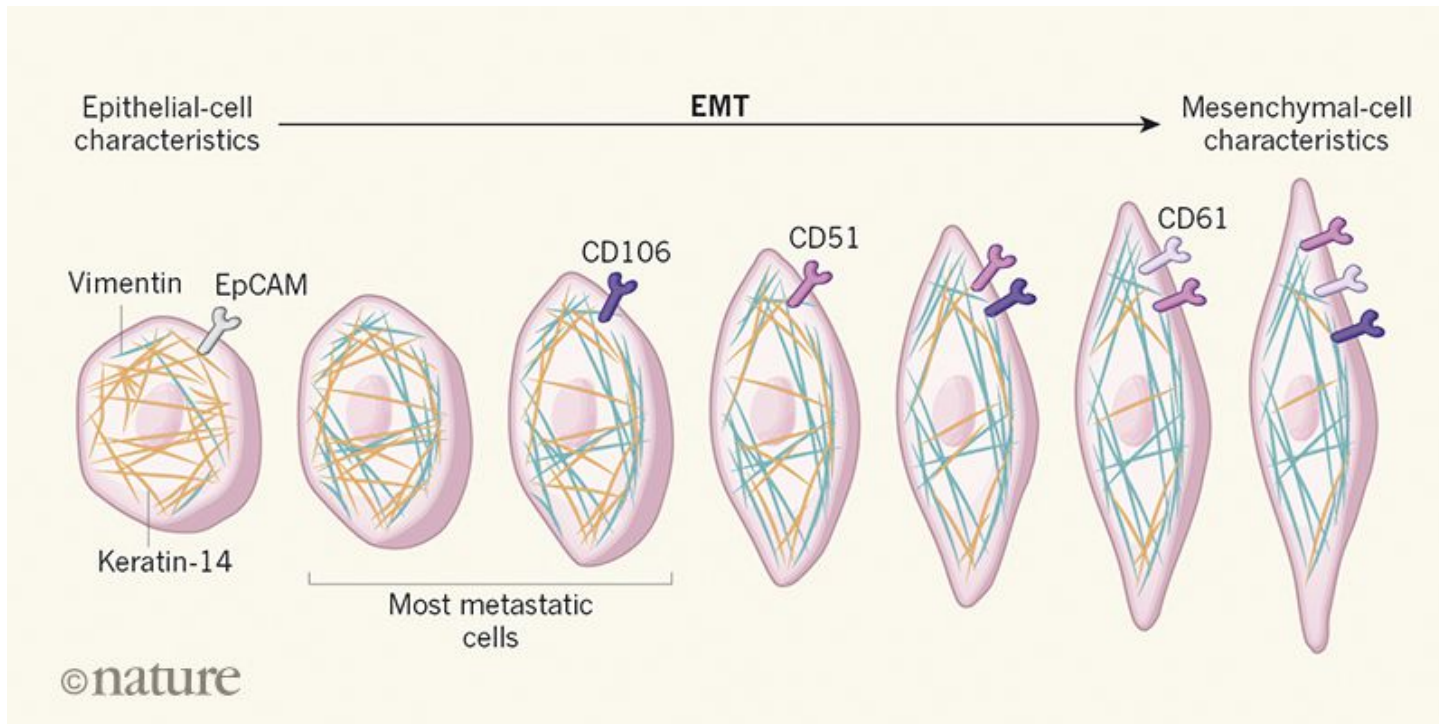
Aceto *et al.* Cell 2014

Ewald group, PNAS 2016

# More recent evidence

## Identification of the tumour transition states occurring during EMT

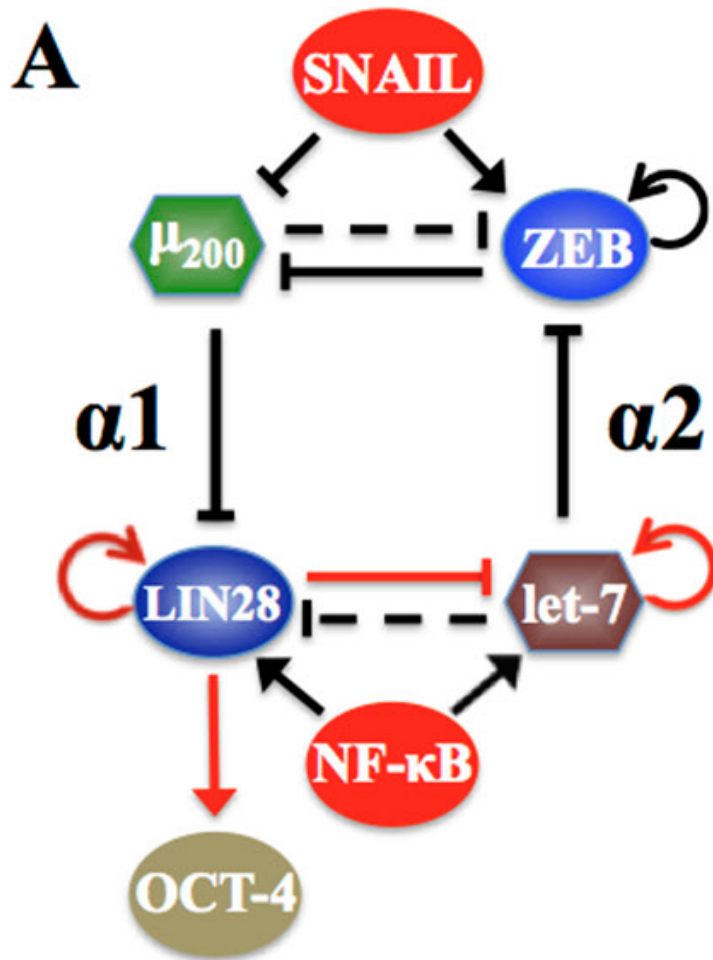
Pastushenko et al, Nature 556, 463 (2018) – GEM model of SCC



"It was particularly exciting to observe that, in contrast to what one would expect, the tumor cells in the early stage of **EMT with intermediate epithelial and mesenchymal hybrid phenotype**, rather than tumor cells that underwent complete EMT, are the most metastatic populations," comments Ievgenia Pastushenko, the first author of the study.



# EMT coupling to “stemness”; the breakdown of modularity

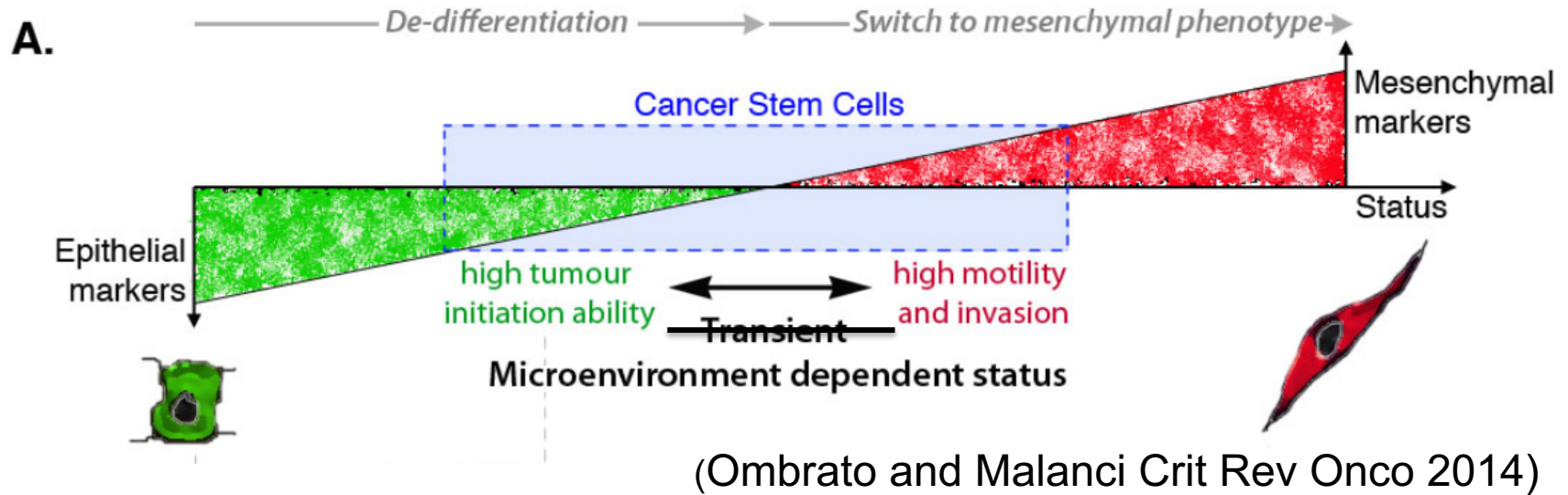


- The E/M state can be more likely to become stem-like than either the E or M states
- This is strongly dependent on state of the network
- Can evaluate statistical correlation between different states

Jolly et al, J. Roy Soc Interface (2014),  
Oncotarget (2015); with Mani group,  
MDACC; Pienta group at JHU



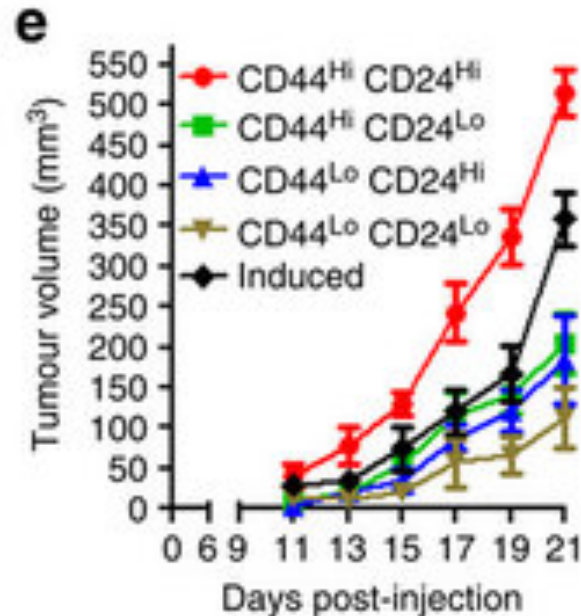
# Why are hybrid cell clusters more metastatic?



Coupling the modules of EMT and stemness: A tunable 'stemness window' Jolly et al, Oncotarget (2015); JR Interface (2014)

“....growing evidence that a cell that has only undergone partial EMT is best positioned to acquire stem cell properties.”

Pattabiraman and Weinberg 2016



Hybrid cells can initiate more tumors in vitro

Goldman *et al.*  
Nat Comm 2015

# Results keep on coming

## **Acquisition of a hybrid E/M state is essential for tumorigenicity of basal breast cancer cells**

Cornelia Kröger, Alexander Afeyan, ... and R. A. Weinberg

PNAS published ahead of print March 25, 2019

<https://doi.org/10.1073/pnas.1812876116>

Showed that hybrid subpopulation of HMLER cells the most tumorigenic and this cannot be matched by mixing E and M cells; plasticity at the single cell level is absolutely the key.

**New paradigm: Treatments must target hybrid, plastic cells in order to prevent metastasis. This is hard because these cells are naturally resistant to many different types of treatment.**

# The take-home message

- Dynamical network models predict new types of cell phenotypes, hybrid E/M states
- These cells move collectively in vitro and in vivo lead to metastasizing clusters, as seen in pathology images and in the bloodstream
- These clusters can be a major contributor to the growth of new secondary tumors and hence are a priority for proposed treatments

# Summary

- “Many worlds” interpretation of how to make progress in this type of problem
  - Soft-matter physics + information processing via networks + cancer biology
- This talk: role of hybrid phenotypes in getting the right combination of properties to effectively metastasize
- Have we made progress?
  - At a scientific level, yes
  - At a clinical level, ???



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