

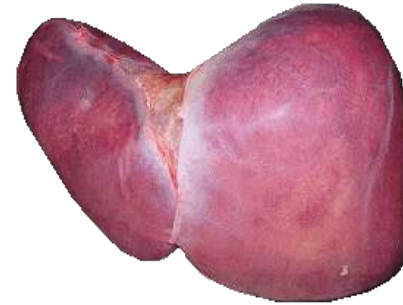
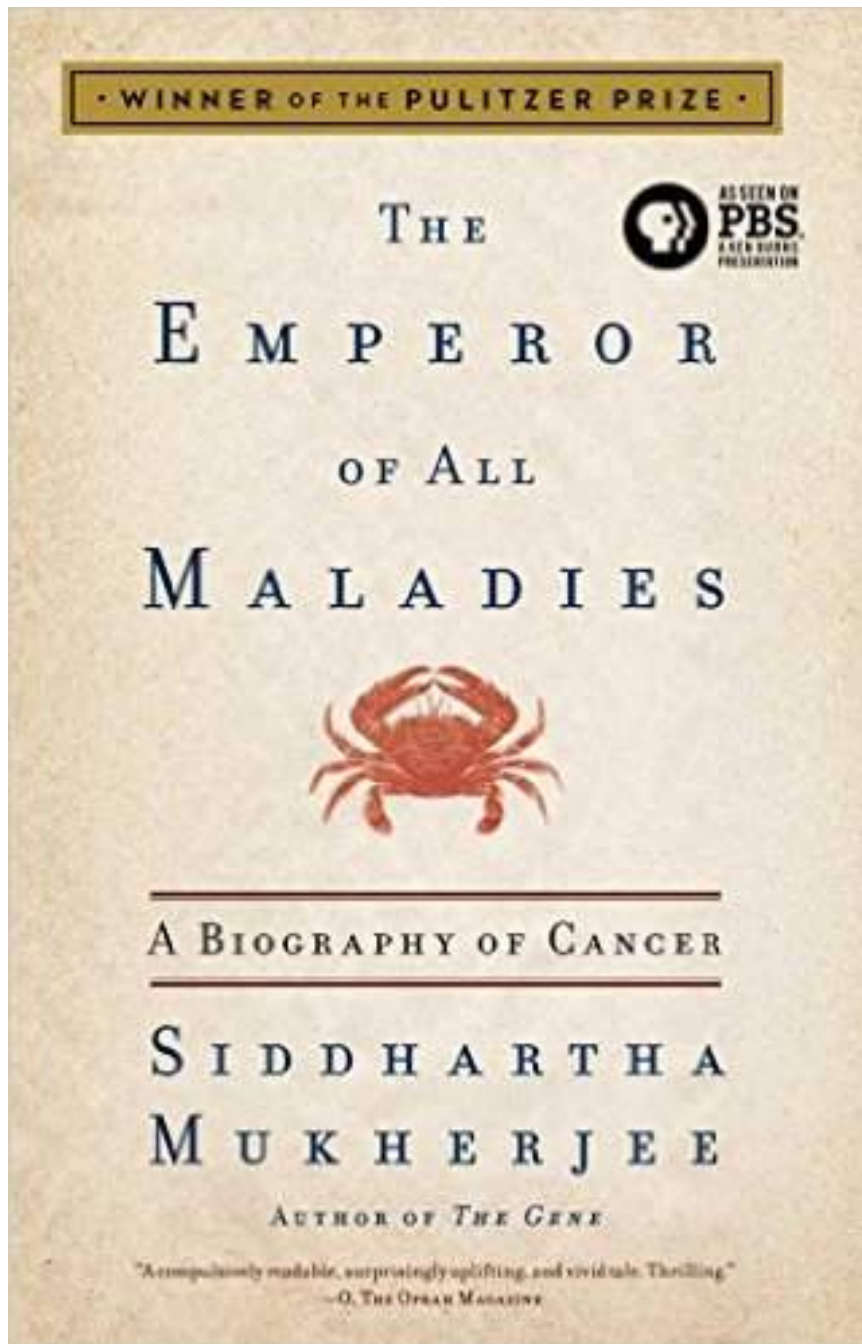
Dynamical systems biology of cancer metastasis

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DMPH 2019 | ICTS Bangalore

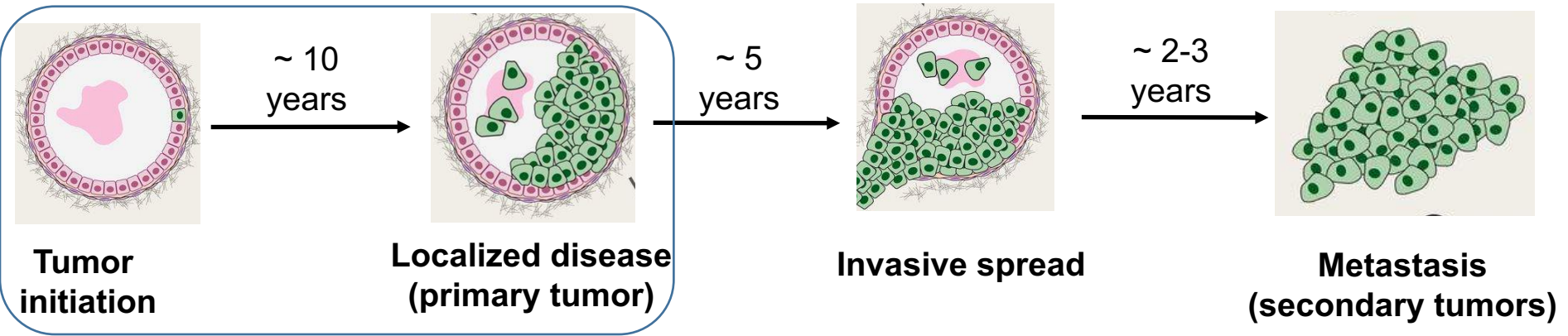




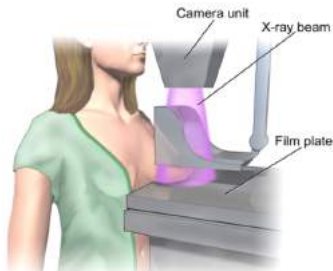
Uncontrolled
growth of
abnormal cells



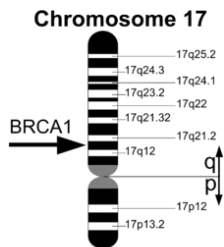
Stages of cancer progression



Remarkable progress made in:



Diagnosing cancer early



Listing the genes involved

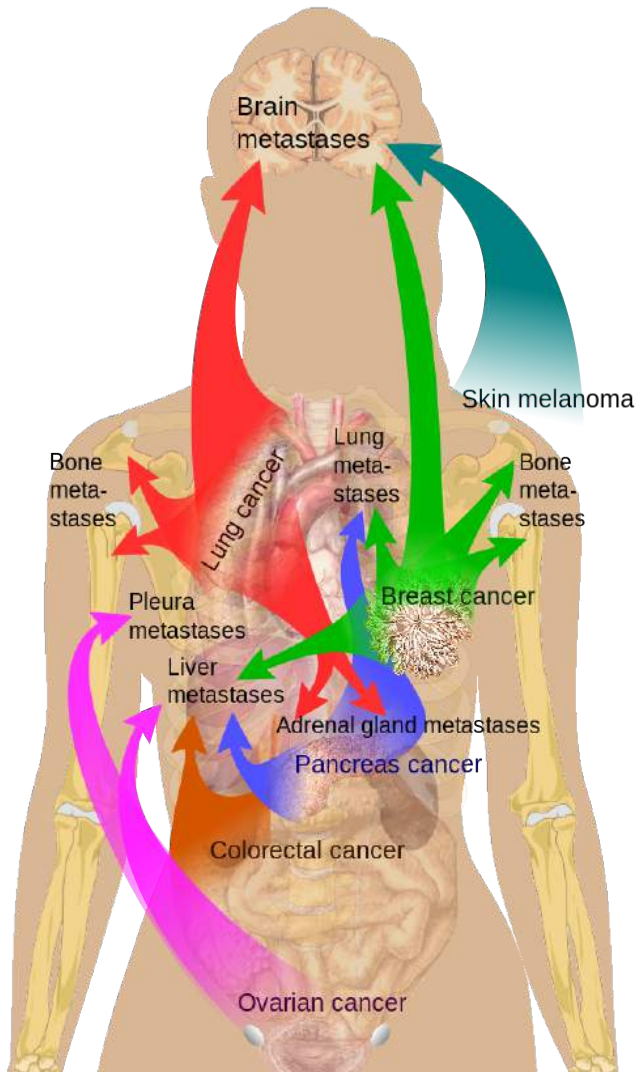


Identifying risk factors



Developing new therapies

Metastasis : the cause of 90% of all cancer deaths



More than 80% cancers happen in epithelial organs, i.e. cells that do NOT move/invade.



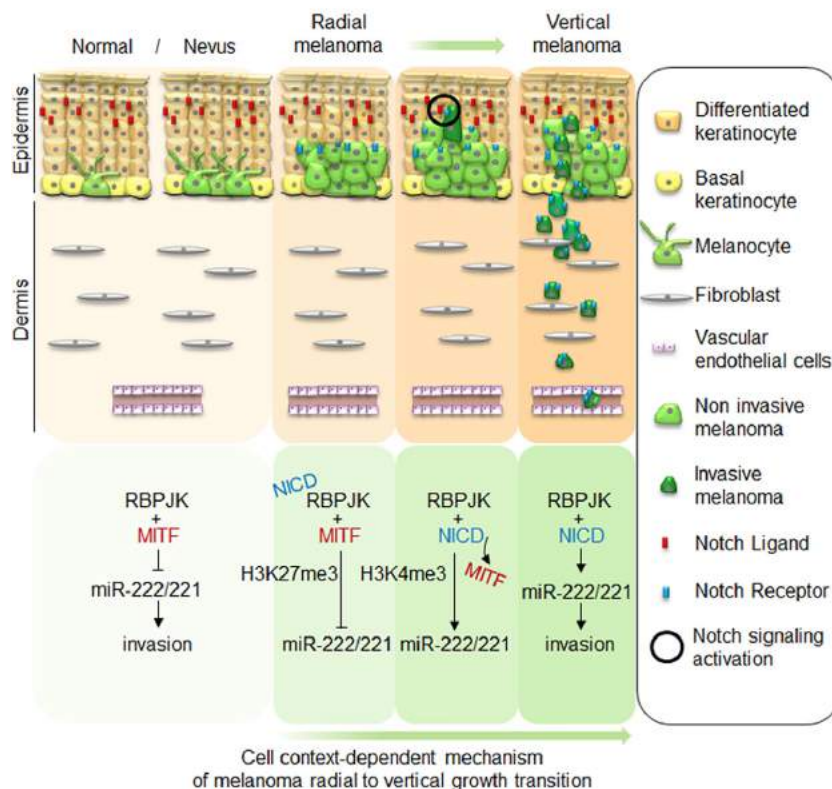
What traits cells need to successfully metastasize?

- Metastasis is a highly inefficient process.
- It requires dynamic/adaptive changes in:
 - ✓ Adhering to their neighbors
 - ✓ Ability to migrate and invade
 - ✓ Evading attacks by immune system
 - ✓ Settling down in a new organ and colonizing it
 - ✓ Resist multiple therapies/drugs given to patients

Thus, to restrict metastasis, we first need a dynamic and systems-level understanding of the process to identify how cells alter these multiple traits together

Is genetics the answer? Not always

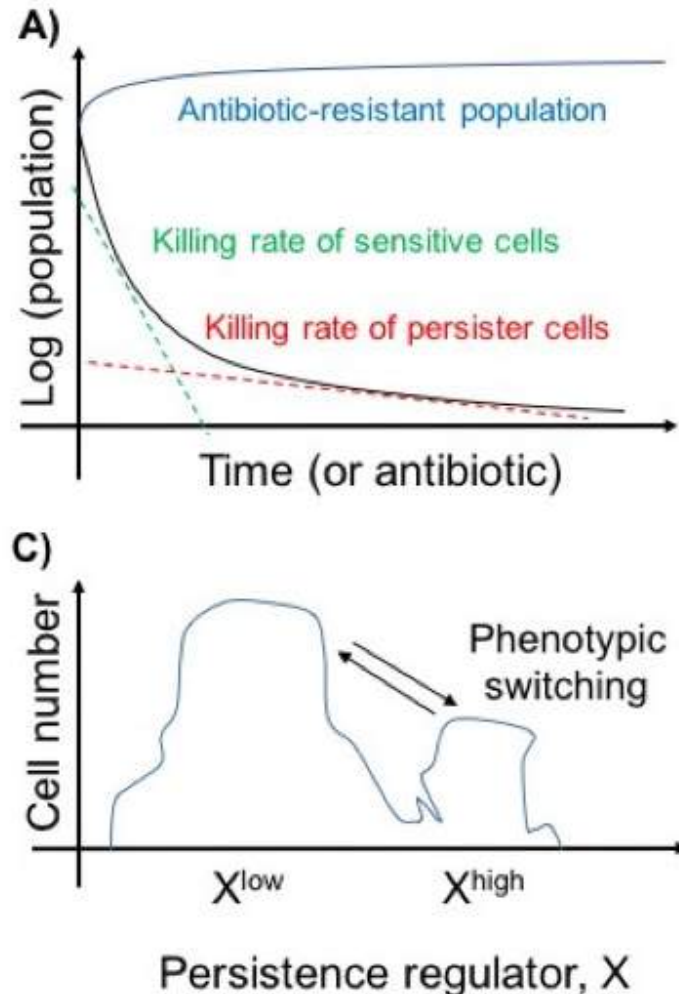
- Large amount of money spent on cancer genomics, but no unique signature has emerged for metastasis
- An example: Melanoma metastasis



Cells become metastatic competent by being exposed to a new chemical environment

Phenotypic transition is not caused by additional mutations

Can cancer proceed without mutations? Perhaps!



A Chromatin-Mediated Reversible Drug-Tolerant State in Cancer Cell Subpopulations

Sreenath V. Sharma,¹ Diana Y. Lee,¹ Bihua Li,¹ Margaret P. Quinlan,¹ Fumiyuki Takahashi,¹ Shyamala Maheswaran,¹ Ultan McDermott,¹ Nancy Azizian,¹ Lee Zou,¹ Michael A. Fischbach,¹ Kwok-Kin Wong,² Kathleyn Brandstetter,² Ben Wittner,¹ Sridhar Ramaswamy,¹ Marie Classon,^{1,3,*} and Jeff Settleman^{1,3,*}

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³These authors contributed equally to this work

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DOI 10.1016/j.cell.2010.02.027

Tumor cells can follow distinct evolutionary paths to become resistant to epidermal growth factor receptor inhibition

Aaron N Hata^{1,2,14}, Matthew J Niederst^{1,2,14}, Hannah L Archibald¹, Maria Gomez-Caraballo¹, Faria M Siddiqui¹, Hillary E Mulvey¹, Yosef E Maruvka^{1,3}, Fei Ji⁴, Hyo-eun C Bhang⁵, Viveksagar Krishnamurthy Radhakrishna⁵, Giulia Siravegna^{6,7}, Haichuan Hu¹, Sana Raoof^{1,2}, Elizabeth Lockerman¹, Anuj Kalsy¹, Dana Lee¹, Celina L Keating⁵, David A Ruddy⁸, Leah J Damon¹, Adam S Crystal^{1,13}, Carlotta Costa^{1,2}, Zofia Piotrowska^{1,2}, Alberto Bardelli^{6,7}, Anthony J Iafrate⁹, Ruslan I Sadreyev^{4,9}, Frank Stegmeier⁵, Gad Getz^{1,3,9,10}, Lecia V Sequist^{1,2}, Anthony C Faber^{11,12} & Jeffrey A Engelman^{1,2}

Rare cell variability and drug-induced reprogramming as a mode of cancer drug resistance

Sydney M. Shaffer^{1,2}, Margaret C. Dunagin¹, Stefan R. Torborg^{1,3}, Eduardo A. Torre^{1,2}, Benjamin Emert^{2,4}, Clemens Krepler⁵, Marilda Beqiri⁵, Katrin Sproesser⁵, Patricia A. Brafford⁵, Min Xiao⁵, Elliott Egan², Ioannis N. Anastopoulos², Cesar A. Vargas-Garcia⁶, Abhyudai Singh^{6,7}, Katherine L. Nathanson², Meenhard Herlyn⁵ & Arjun Raj^{1,8}

Non-heritable mechanisms of drug resistance observed in bacterial and viral populations, and more recently in cancer

Balaban *et al.* Science 2004

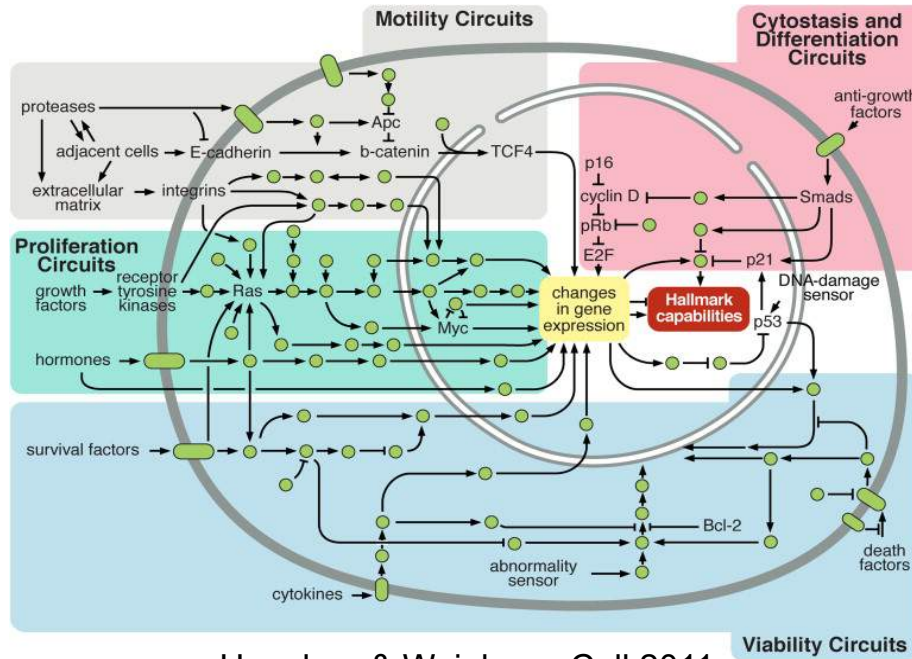
Shaffer *et al.* Nature 2017

Sharma *et al.* Cell 2010

Hata *et al.* Nat Med 2014

Padmanabhan & Dixit, Nat Comm 2015

Can a 'systems' view help 'understand' cancer?



Hanahan & Weinberg, Cell 2011

What information does it lack?

- Time/spatial scale(s)
- Strength of regulation
- Direct/indirect
- Nonlinearity of interaction
- Combinatorial effects

Assumptions are hidden in a “black box” and can have unpleasant surprises in the clinic (ex: anti-angiogenesis therapy)

“One day, we imagine that cancer biology and treatment.....will become a science with a conceptual structure and logical coherence that rivals that of chemistry or physics.”

- Hanahan & Weinberg, Cell 2000

“And, as before, we continue to foresee cancer research as an increasingly logical science, in which myriad phenotypic complexities are manifestations of a small set of underlying organizing principles.”

- Hanahan & Weinberg, Cell 2011

Example of 'systems' approach

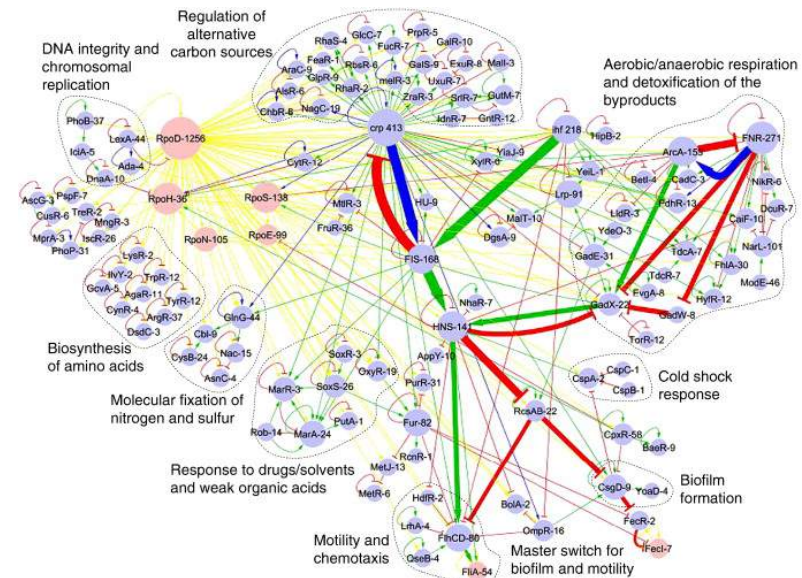
Engineered systems:

- 1000+ computers/chips
- 100s of feedback loops
- Design manual available
- Largely automated
- “Bottom-up” approach

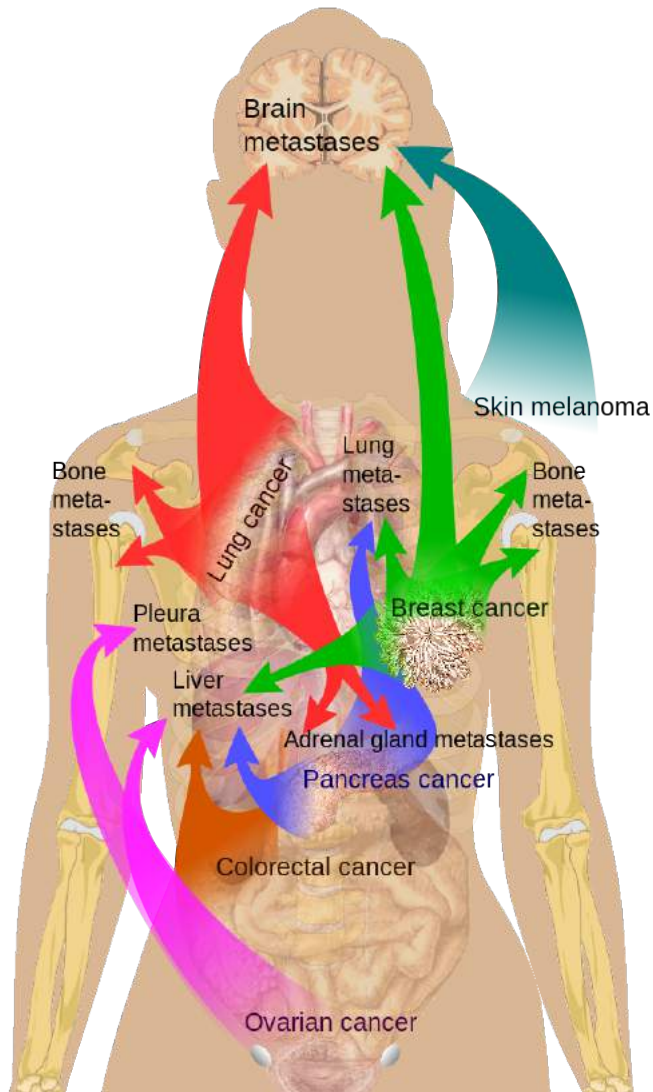


Biological systems (*E. coli*):

- 1000s of feedback loops
- No design manual available
- Evolved (not automated)
- How do we understand and “fix” such systems?



Metastasis : the cause of 90% of all cancer deaths



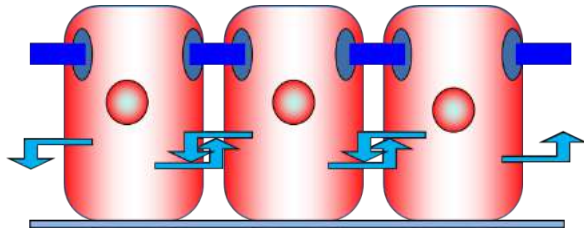
More than 80% cancers happen in epithelial organs, i.e. cells that do NOT move/invade.



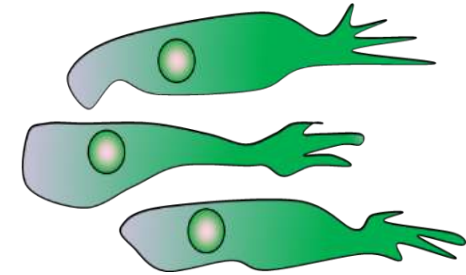
We are...

- **Not** inferring networks by data-mining from “omics” data
- **Not** focusing exclusively on one dataset or even on one type of cancer
- **We are** attempting to build a conceptual framework, a quantitative version of the framework that biologists build to help think through their data

EMT/MET: The engine of metastasis



Adhere to neighbors
Do NOT migrate or invade
Epithelial (E)



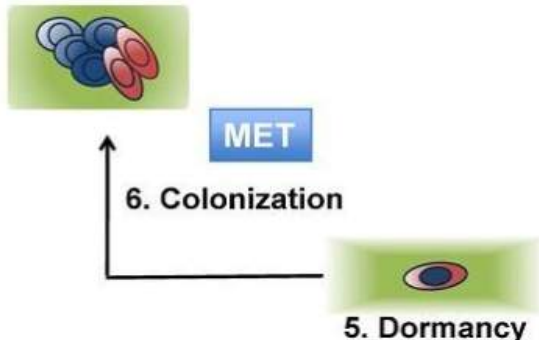
Do NOT adhere to neighbors
Migrate and invade
Mesenchymal (M)



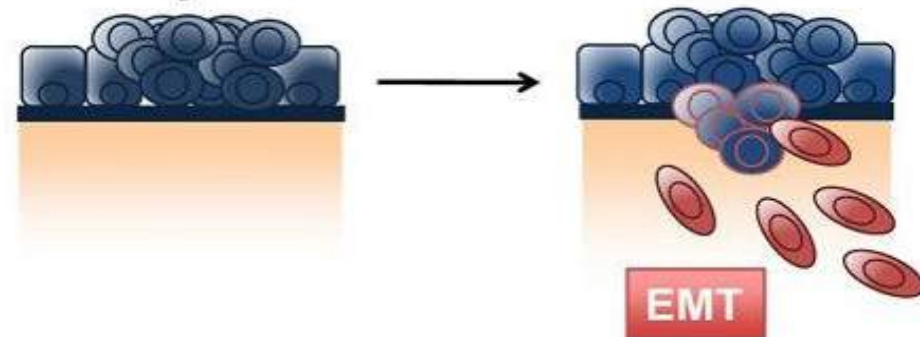
Mesenchymal-to-Epithelial
Transition (MET)

Epithelial-to-Mesenchymal
Transition (EMT)

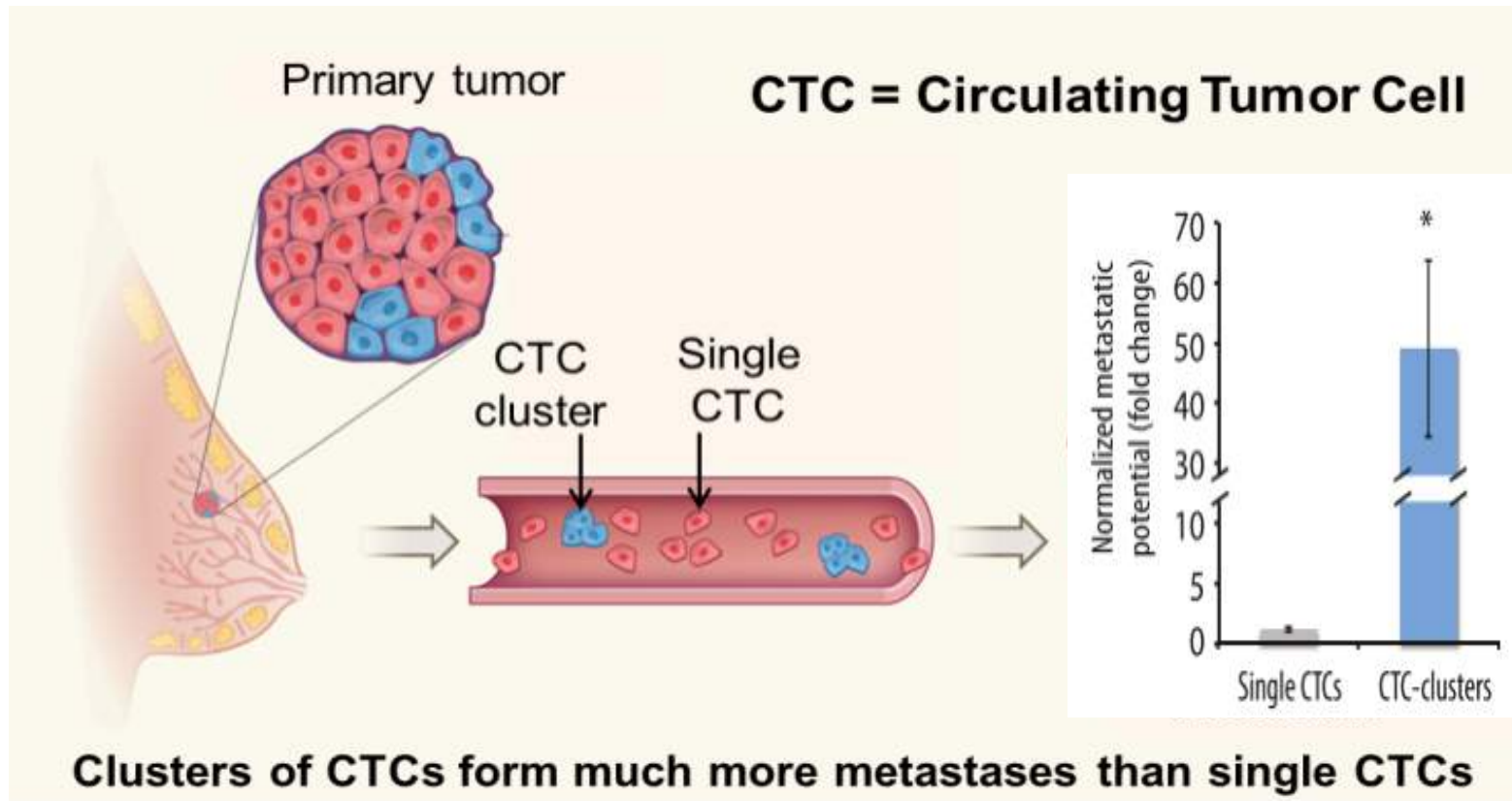
Secondary tumor



Primary tumor



Metastasis: a journey taken in groups

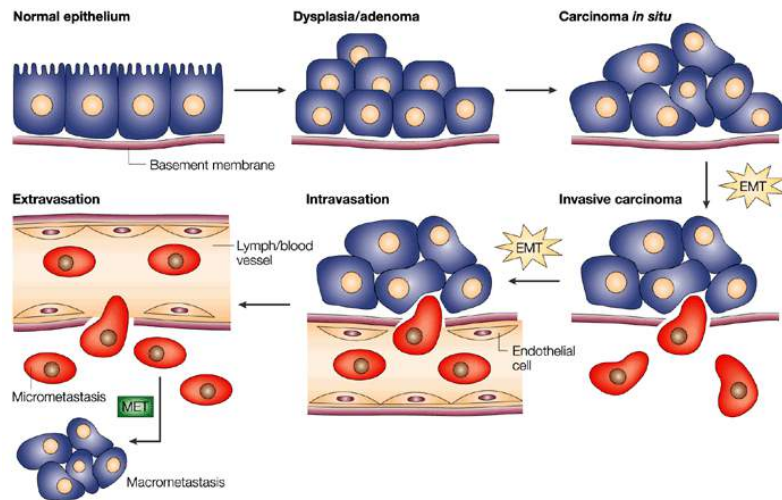


Clusters of CTCs:

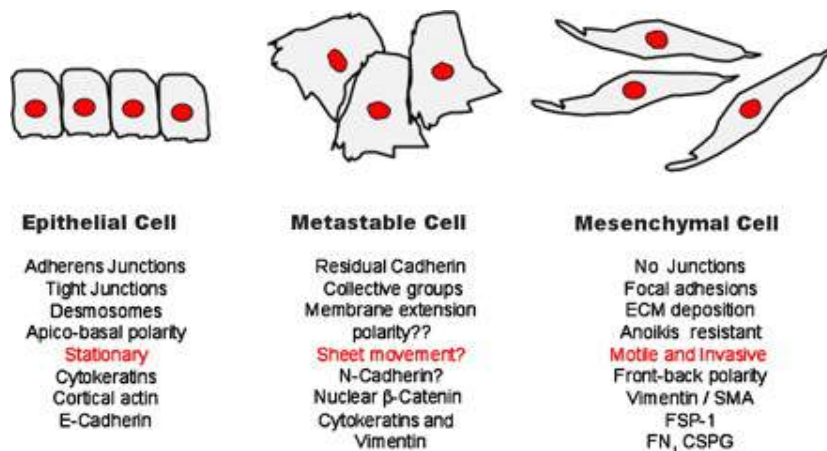
- Comprise of 5-8 cells
- Associate with worse patient survival
- Resist cell death in circulation
- Are formed before entering the circulation

Aceto *et al.* Cell 2014
Bottos & Hynes, Nature 2014
Cheung *et al.* PNAS 2016

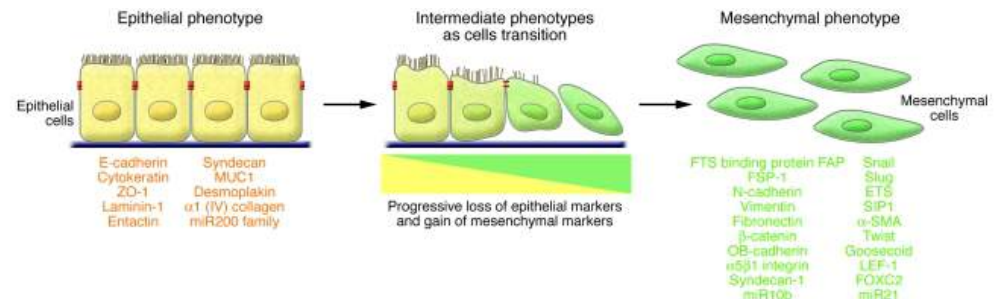
How do clusters reconcile with (binary) EMT?



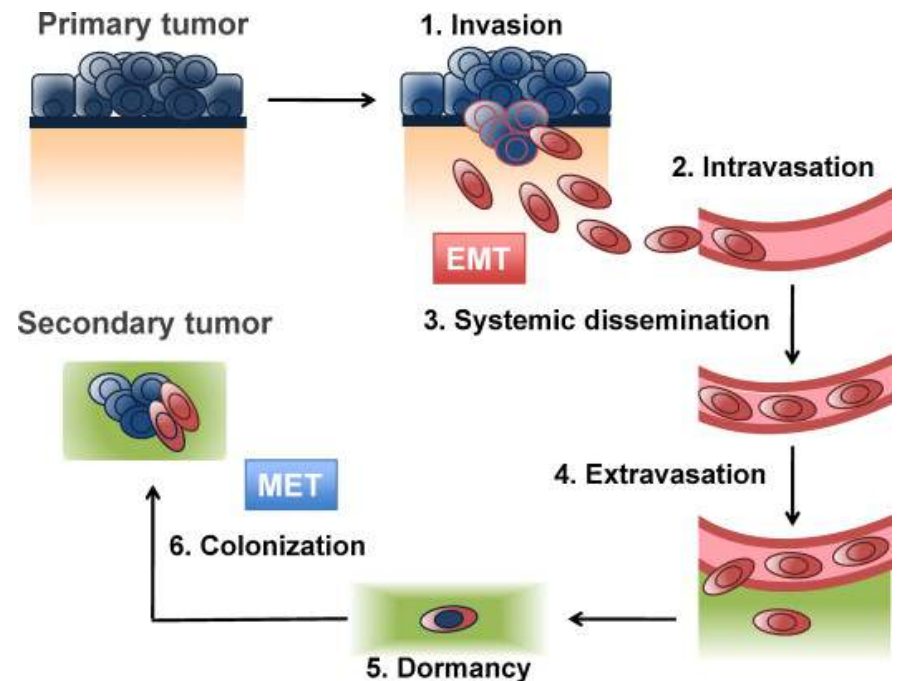
Thiery JP, Nat Rev Cancer 2002



Lee *et al.* J Cell Biol 2006



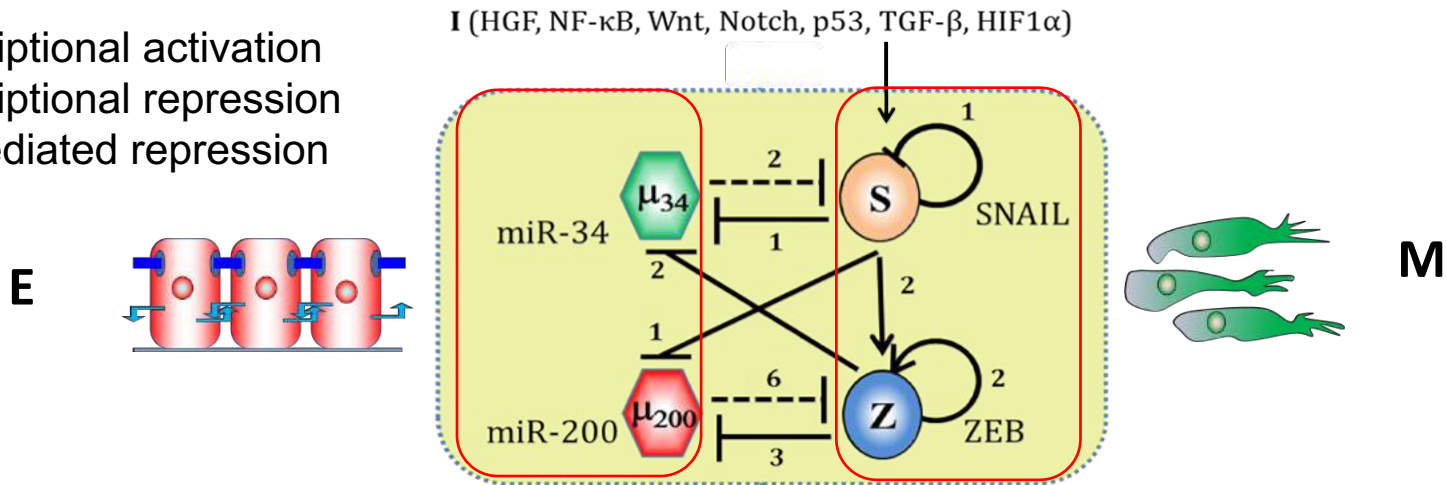
Kalluri & Weinberg, J Clin Invest 2009



Scheel & Weinberg, Semin Cancer Biol 2012

Systems biology model for EMT/MET

- Transcriptional activation
- | Transcriptional repression
- | miR-mediated repression



Lu*, Jolly* *et al.* PNAS 2013

- 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

Toggle switch: A systems biology model

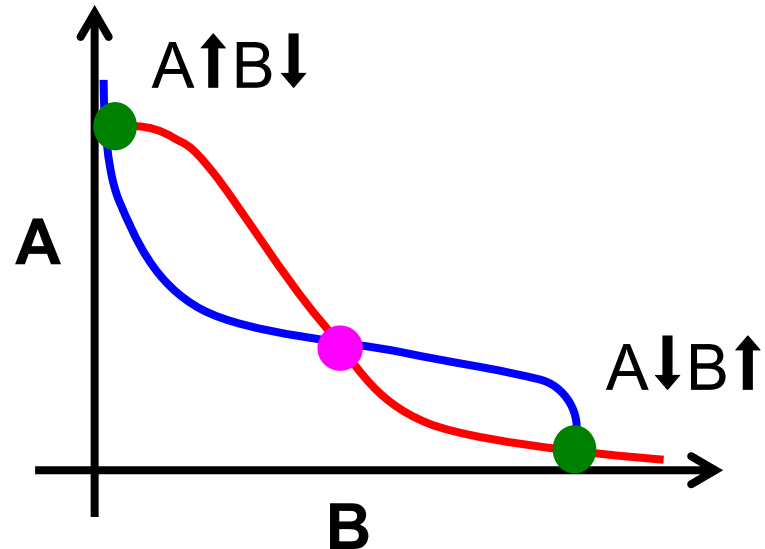


Bistability

(A, B) = (high, low)

(A, B) = (low, high)

Huang, PloS Biology 2013
Gardner *et al.* Nature 2000



$$\frac{dA}{dt} = \underbrace{g_A}_{\text{Production}} \frac{(B_0)^{n_B}}{(B_0)^{n_B} + B^{n_B}} - \underbrace{k_A A}_{\text{Regulation}}$$

$$\frac{dB}{dt} = \underbrace{g_B}_{\text{Production}} \frac{(A_0)^{n_A}}{(A_0)^{n_A} + A^{n_A}} - \underbrace{k_B B}_{\text{Regulation}}$$

Production
 Regulation
 Degradation

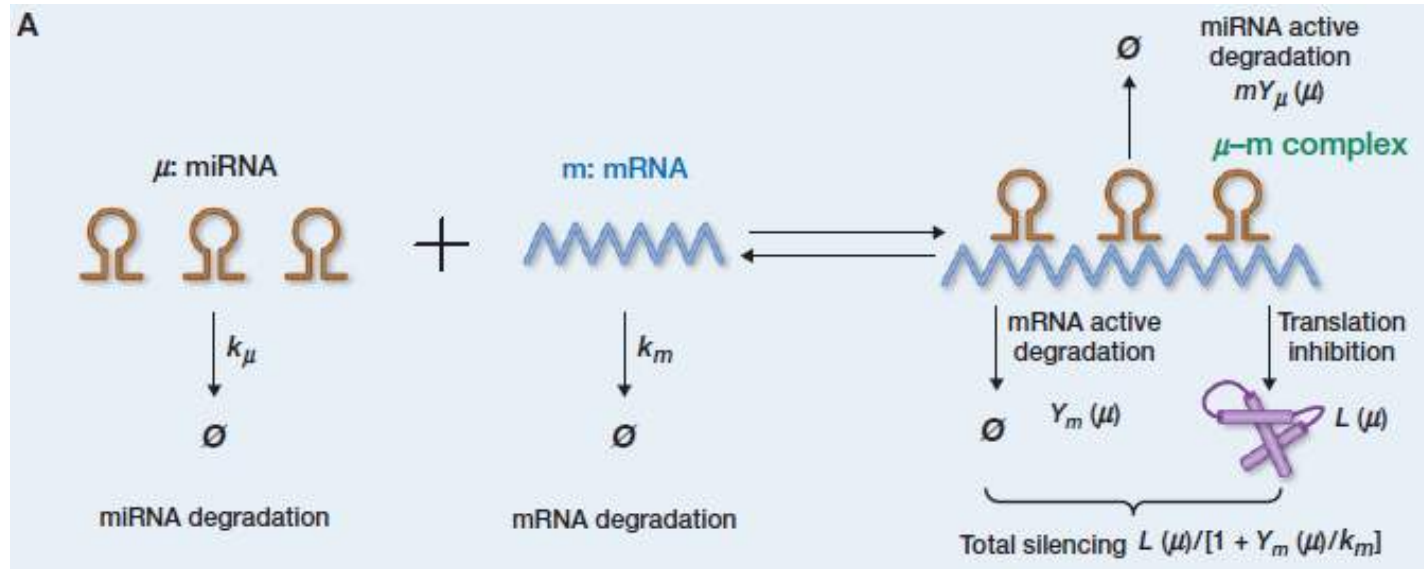
A_0, B_0 = Threshold concentrations

Steps involved:

- Solving ODEs, plotting nullclines
- Stability analysis (Jacobian Matrix)
- Sensitivity analysis
- Bifurcation analysis
- Phase diagrams

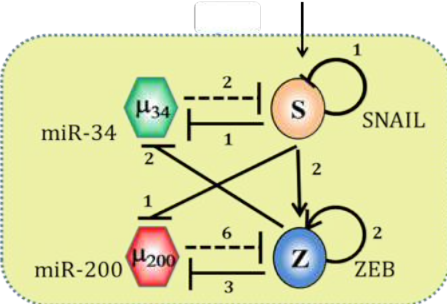
- Hallmark of cell-fate decision making during embryonic development
- One of the first synthetic bio circuits designed

Theoretical framework for miRNA-based circuits



Lu*, Jolly* *et al.* PNAS 2013

I (HGF, NF- κ B, Wnt, Notch, p53, TGF- β , HIF1 α)



Production

Degradation

miR regulation

TF regulation

$$\frac{d\mu_{200}}{dt} = g_{\mu_{200}} H^S(Z, \lambda_{Z, \mu_{200}}) H^S(S, \lambda_{S, \mu_{200}}) - m_Z Y_\mu(\mu_{200}) - k_{\mu_{200}} \mu_{200} \quad \text{miR-200}$$

$$\frac{dm_Z}{dt} = g_{m_Z} H^S(Z, \lambda_{Z, m_Z}) H^S(S, \lambda_{S, m_Z}) - m_Z Y_m(\mu_{200}) - k_{m_Z} m_Z \quad \text{ZEB mRNA}$$

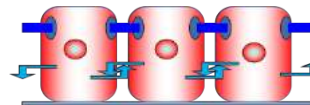
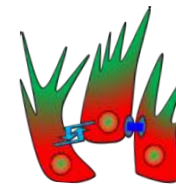
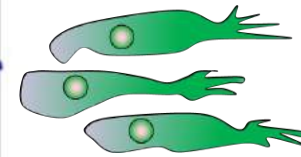
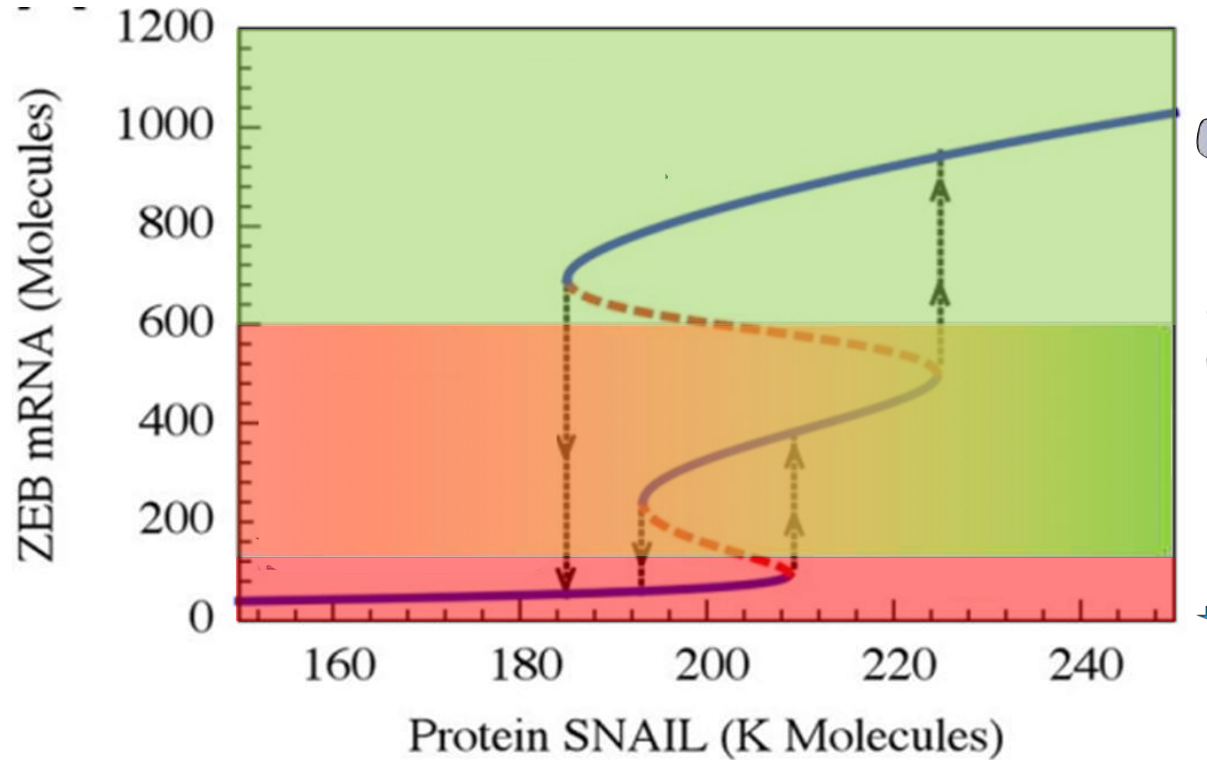
$$\frac{dZ}{dt} = g_Z m_Z L(\mu_{200}) - k_Z Z \quad \text{ZEB}$$

$$\frac{d\mu_{34}}{dt} = g_{\mu_{34}} H^S(Z, \lambda_{Z, \mu_{34}}) H^S(S, \lambda_{S, \mu_{34}}) - m_S Y_\mu(\mu_{34}) - k_{\mu_{34}} \mu_{34} \quad \text{miR-34}$$

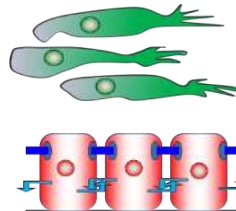
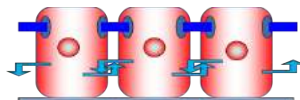
$$\frac{dm_S}{dt} = g_{m_S} H^S(S, \lambda_{S, m_S}) H^S(I, \lambda_{I, m_S}) - m_S Y_m(\mu_{34}) - k_{m_S} m_S \quad \text{SNAIL mRNA}$$

$$\frac{dS}{dt} = g_S m_S L(\mu_{34}) - k_S S \quad \text{SNAIL}_{17}$$

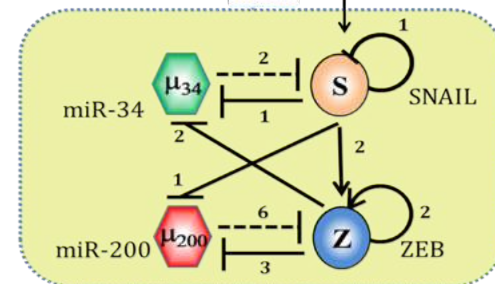
Tristability in the underlying EMT network



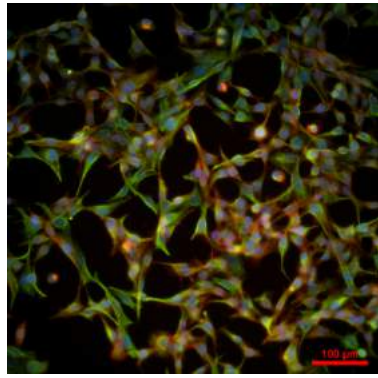
Hybrid E/M
Adhere AND
migrate collectively



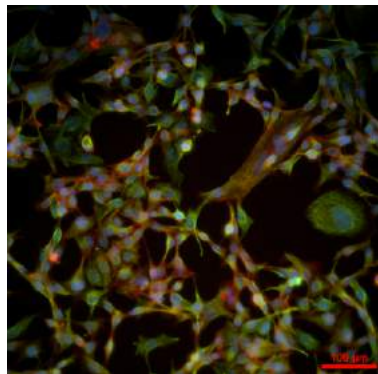
I (HGF, NF- κ B, Wnt, Notch, p53, TGF- β , HIF1 α)



Hybrid E/M can be a stable phenotype



H1975, T=0



H1975, T=2 months

CDH1 + VIM

Jolly *et al.* Oncotarget 2016
 Jolly *et al.* Mol Oncol 2017
 Satyendra Tripathi,
 Sam Hanash (MDACC)

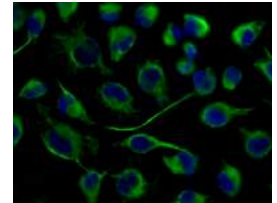
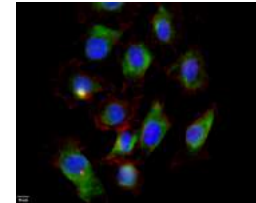
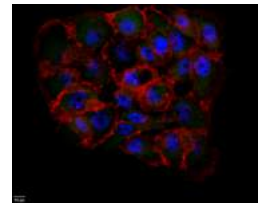
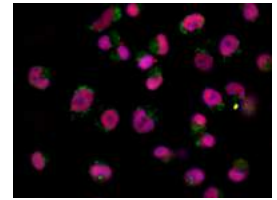
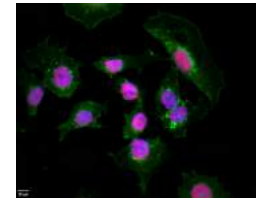
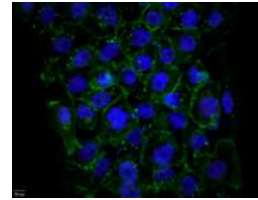
ZEB1 + CDH1

CDH1 + VIM

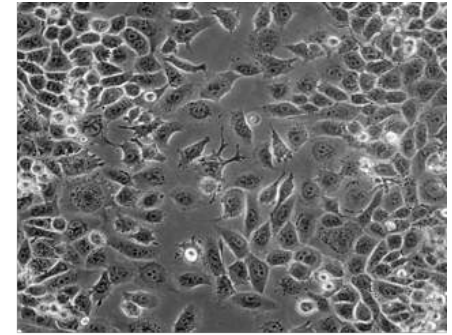
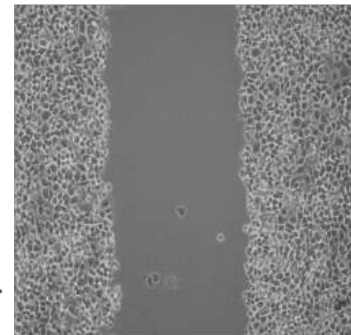
H820 (E)

H1975 (E/M)

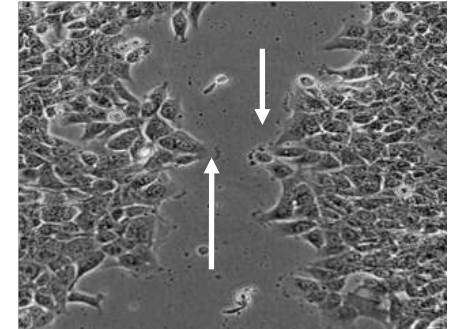
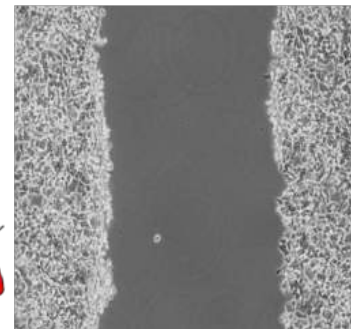
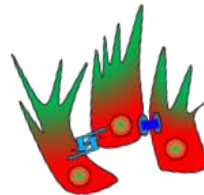
H1299 (M)



H1299

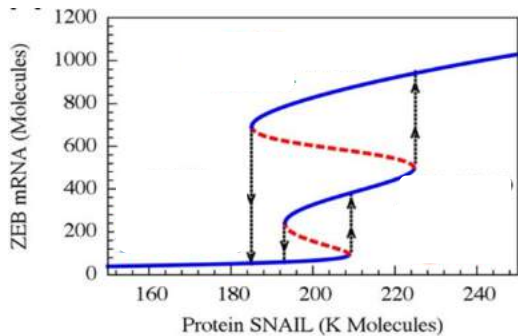


H1975



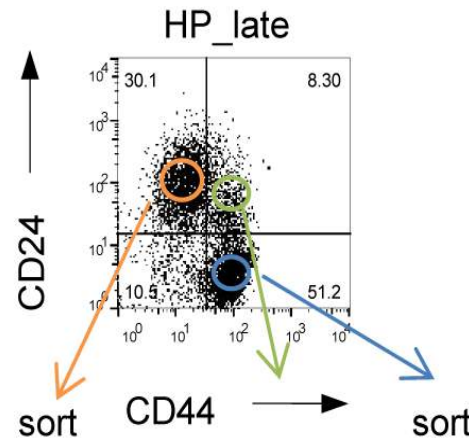
Co-existence of phenotypes seen experimentally

Theoretical prediction



Lu*, Jolly* *et al.* PNAS 2013

Experimental validation

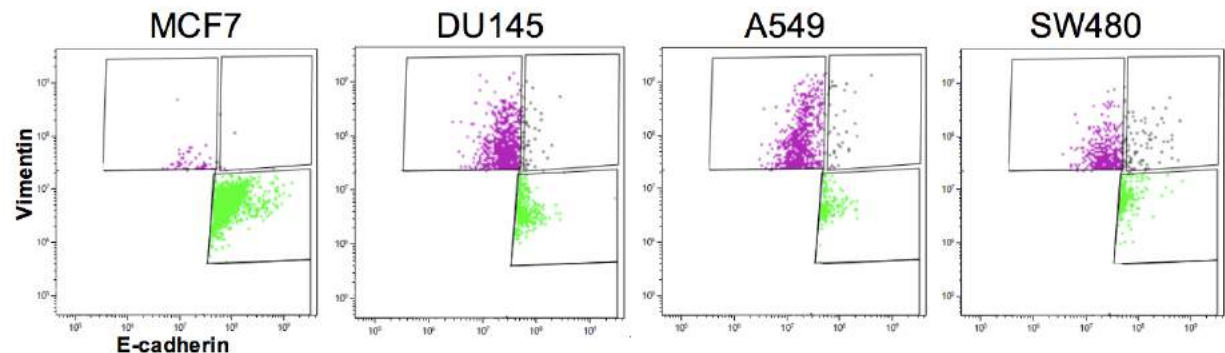


Grosse-Wilde *et al.* PLoS ONE 2015

Quantification of cells in different phenotypic states

Cell line	E (%)	E=M (%)	M (%)
A549	82	10.2	7.80
LT73	24.5	28.6	46.9
H460	19.5	4.8	75.6
H460_miR-200c	39.5	20.8	39.6

Andriani *et al.* Mol Oncol 2016



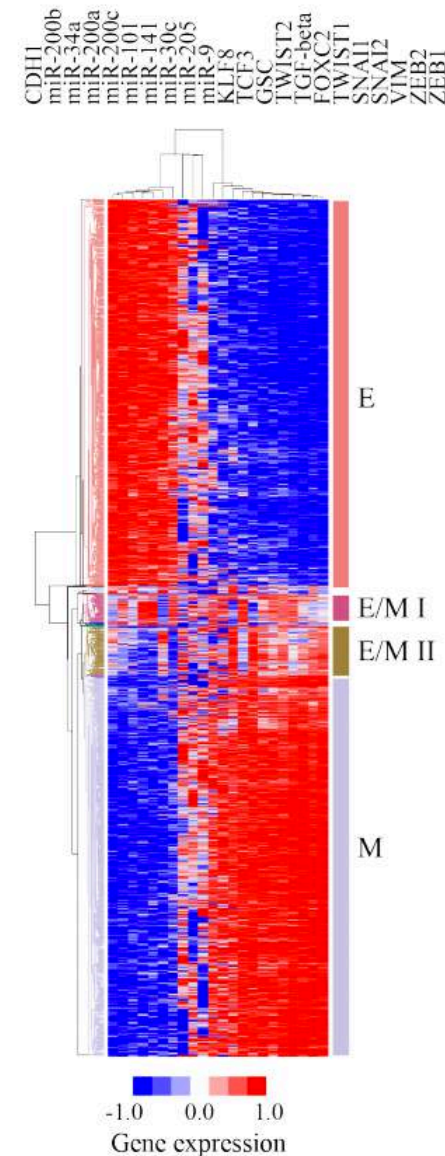
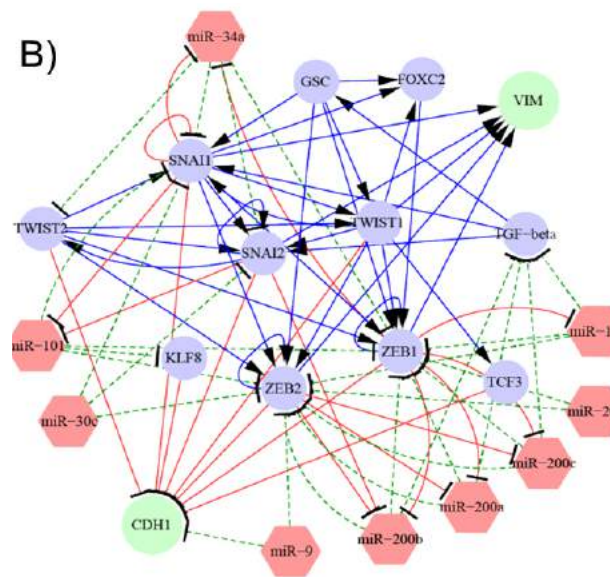
George*, Jolly* *et al.* Cancer Res 2017
Shengnan Xu, Jason A Somarelli (Duke University)

Quantifying the EMT spectrum of states

Hybrid E/M state(s) also predicted by other computational models:

- Xing group (Pittsburgh)
Tian *et al.* Biophys J 2013
Zhang *et al.* Sci Signal 2014
- Albert group (Penn State)
Steinway *et al.* Cancer Res 2014
Steinway *et al.* NPJ Syst Bio Appl 2014
- Zapperi group (U Milan)
Font-Clos *et al.* PNAS 2018
- Nie group (UC Irvine)
Hong *et al.* PLoS Comp Bio 2015
Li *et al.* Phys Chem Chem Phys 2016
Ta *et al.* Disc Contin Dyn Syst Ser B
- Huang group (ISB Seattle)
Joo *et al.* Sci Rep 2018

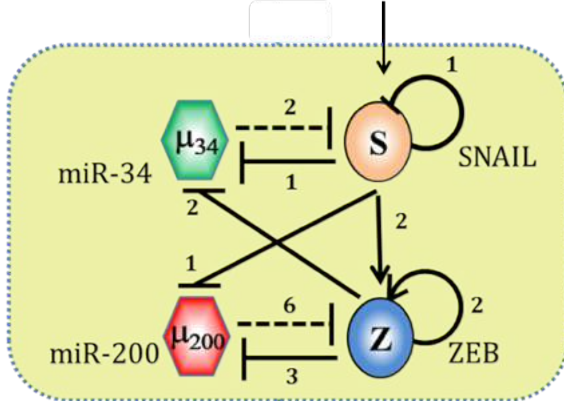
Ensemble of kinetic models with fixed circuit topology but with randomly selected parameters also enable hybrid E/M state(s)



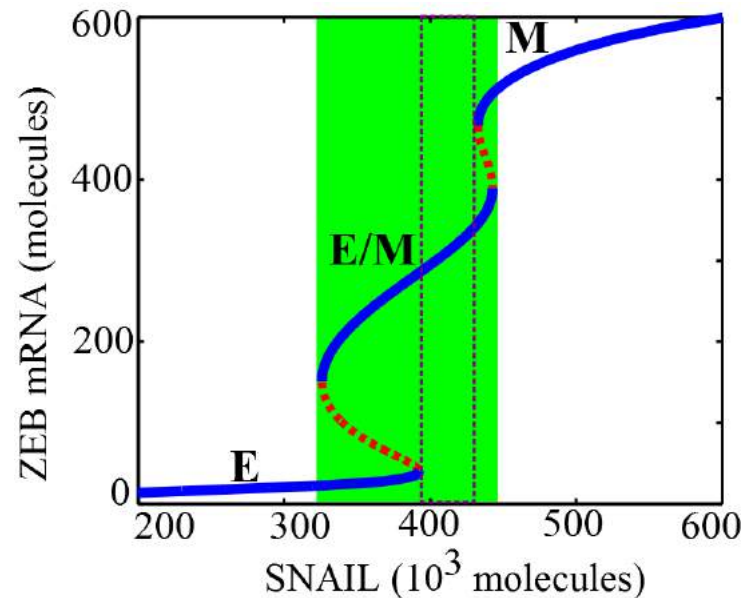
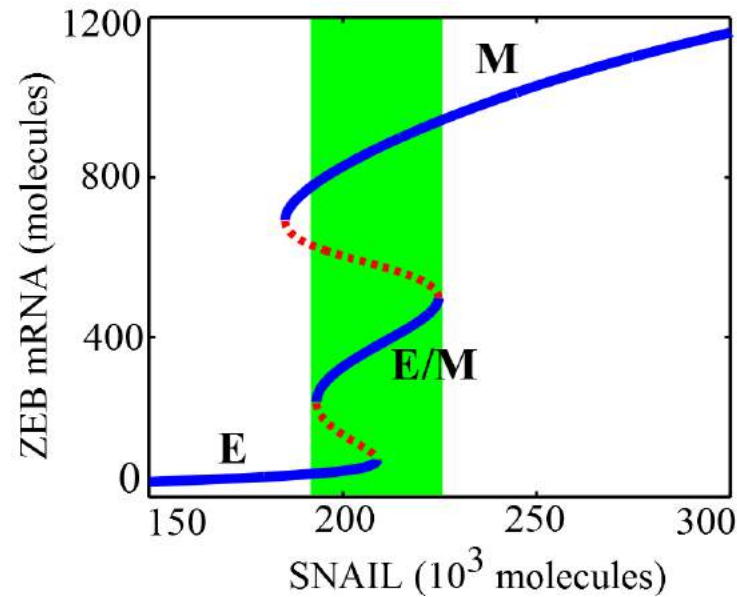
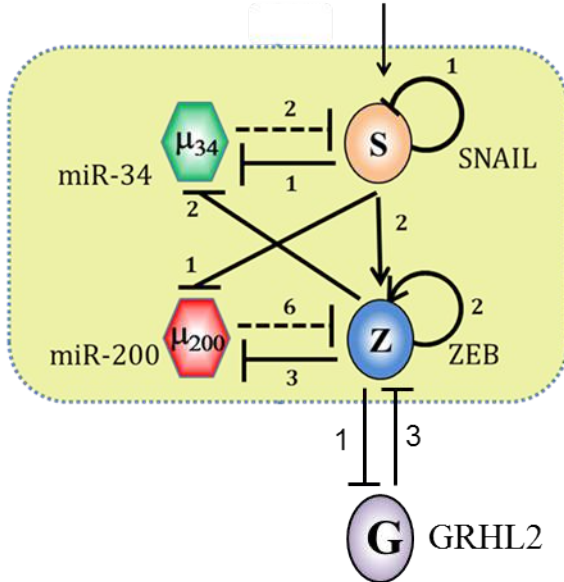
Huang *et al.* PLoS Comp Bio 2017
Huang *et al.* BMC Sys Bio 2018

Identifying 'phenotypic stability factors' (PSFs)

I (HGF, NF- κ B, Wnt, Notch, p53, TGF- β , HIF1 α)



I (HGF, NF- κ B, Wnt, Notch, p53, TGF- β , HIF1 α)



Jolly *et al.* Oncotarget 2016

Other PSFs:

- OVOL2

(Jia*, Jolly* *et al.* Oncotarget 2015;
Watanabe *et al.* Dev Cell 2014;
Hong *et al.* PLoS Comp Biol 2015)

- Δ NP63 α

(Jolly *et al.* NPJ Br Cancer 2017;
Dang *et al.* Cancer Res 2015)

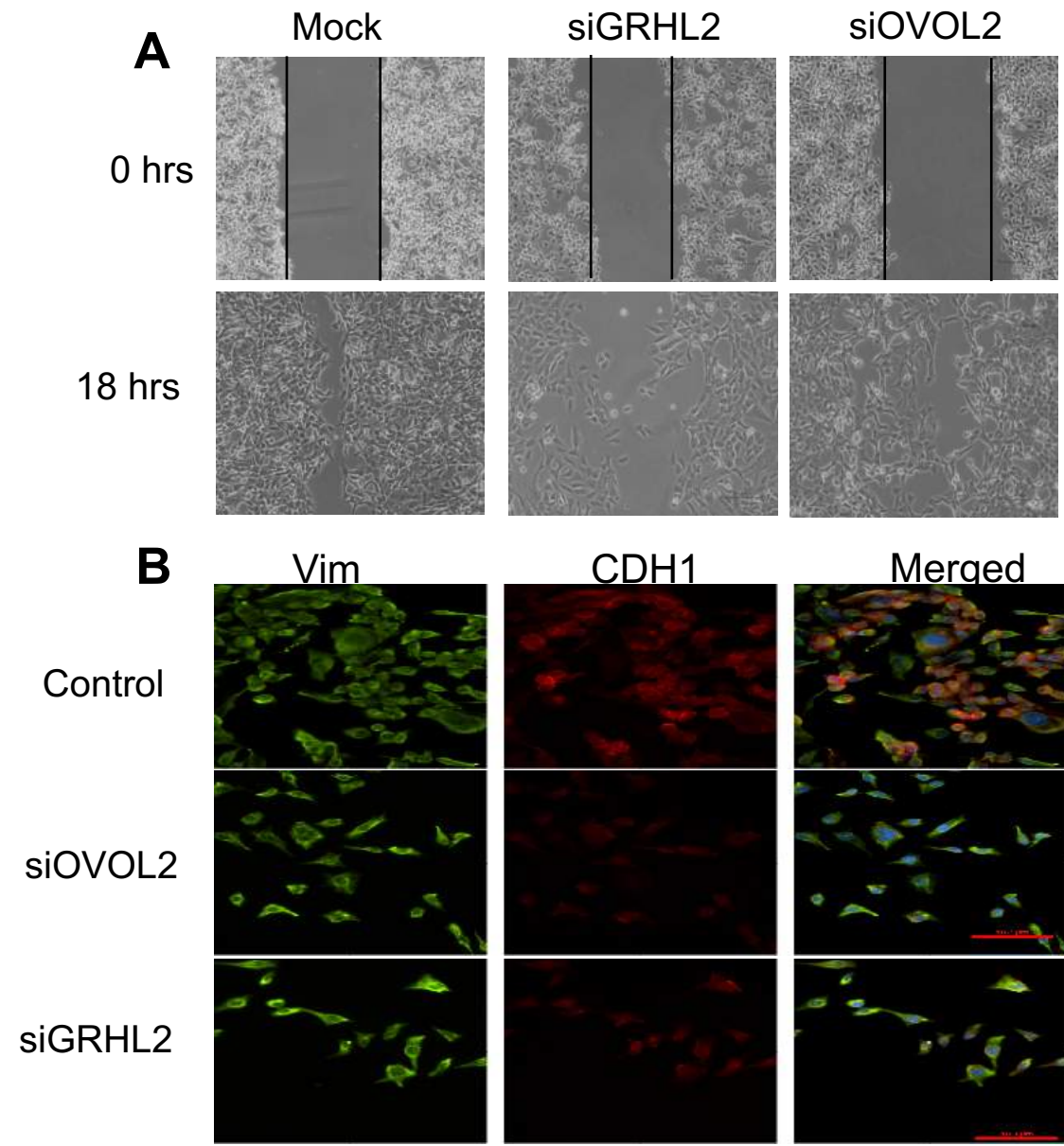
- NUMB

(Bocci*, Jolly* *et al.* J R Soc Interface 2017)

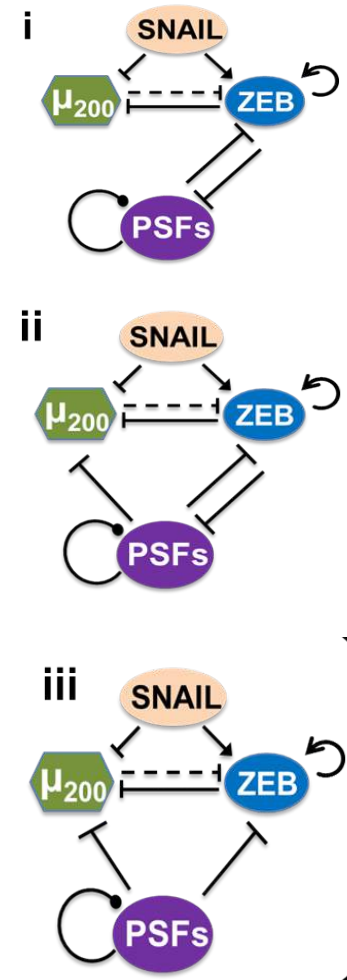
- NRF2

(Bocci *et al.*,; bioRxiv: **390237**)

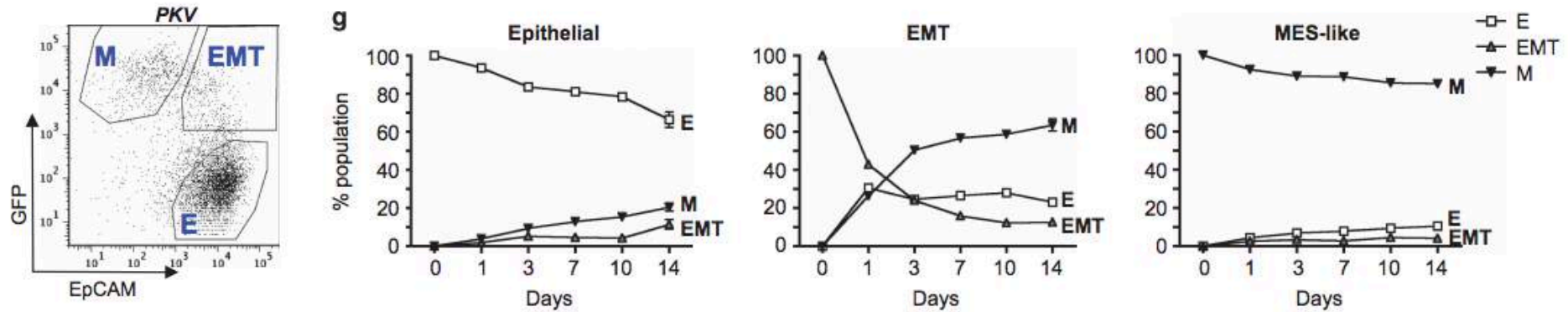
Knockdown of PSFs can drive a complete EMT



Network motifs for identifying additional PSFs

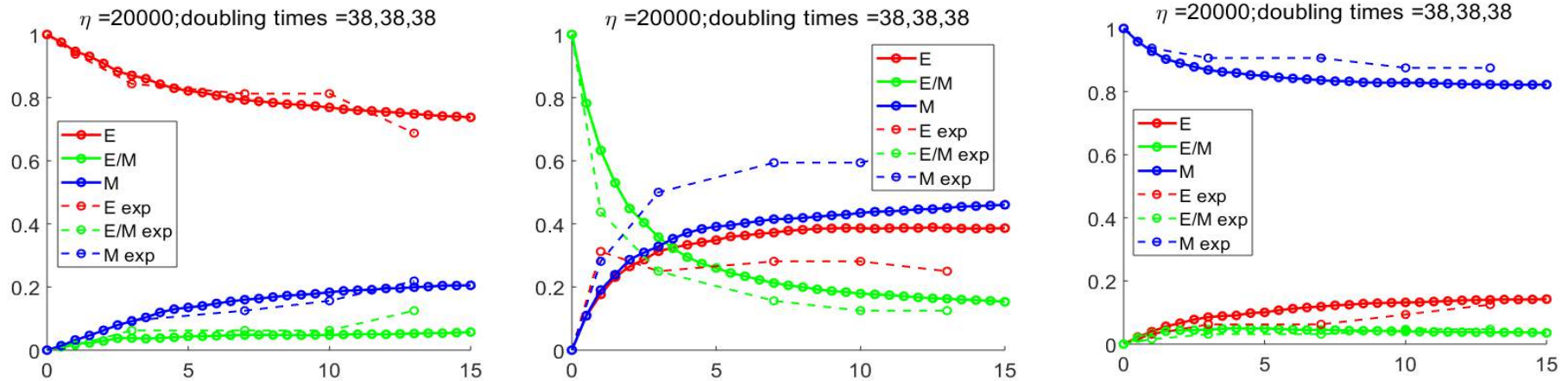


Spontaneous switching among phenotypes



Ruscetti *et al.* Oncogene 2016

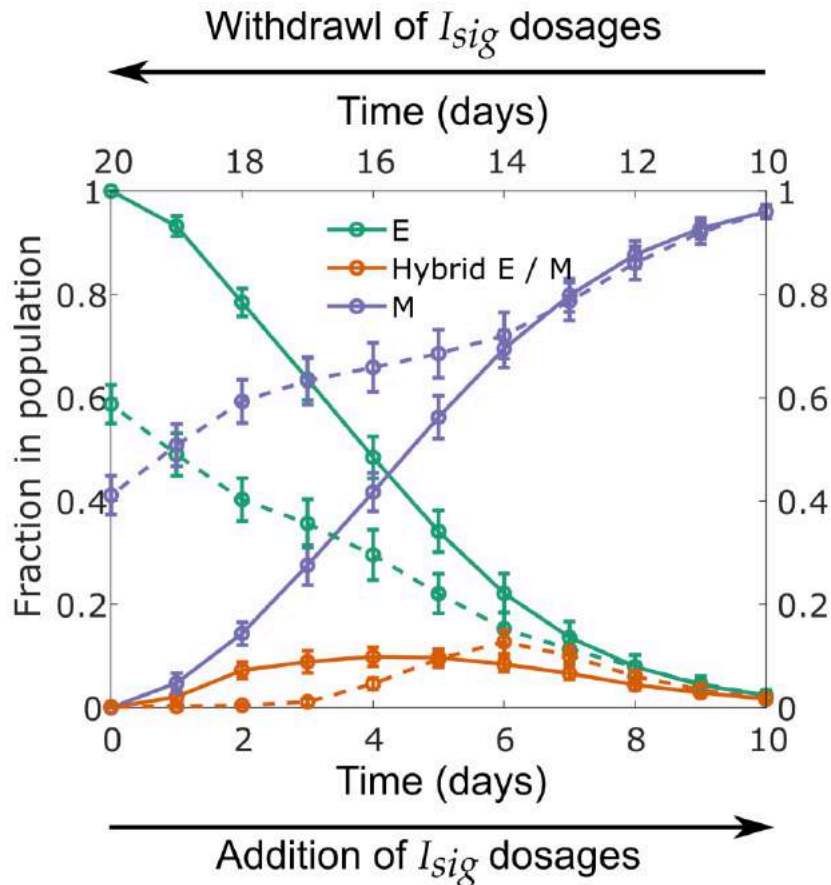
Can we explain these features of the population dynamics of EMT?



Tripathi, Levine & Jolly, bioRxiv: **592691**

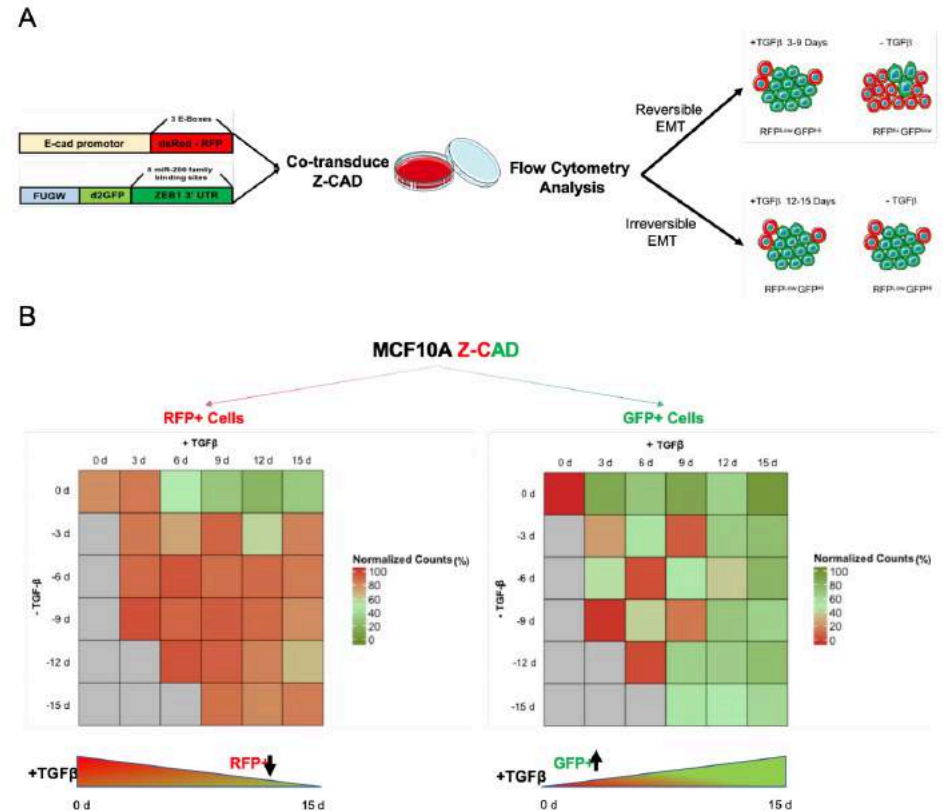
Is EMT always reversible?

Theoretical prediction



Tripathi, Levine & Jolly, bioRxiv: **592691**

Experimental validation



Jia, Deshmukh, Mani, Jolly & Levine, bioRxiv: **651620**

Cells may get 'locked' in mesenchymal state, losing phenotypic plasticity

How EMT alters tumor-initiation ability (stemness)?

The Epithelial-Mesenchymal Transition Generates Cells with Properties of Stem Cells

Sendurai A. Mani,^{1,3,10,*} Wenjun Guo,^{1,10} Mai-Jing Liao,^{1,10} Elinor Ng, Eaton,¹ Ayyakkannu Ayyanan,⁴ Alicia Y. Zhou,^{1,2} Mary Brooks,¹ Ferenc Reinhard,¹ Cheng Cheng Zhang,¹ Michail Shipitsin,^{5,6} Lauren L. Campbell,^{5,7} Kornelia Polyak,^{5,6,7} Cathrin Briskin,⁴ Jing Yang,⁸ and Robert A. Weinberg^{1,2,9,*}

Mani *et al.* Cell 2008

Epithelial-mesenchymal transition can suppress major attributes of human epithelial tumor-initiating cells

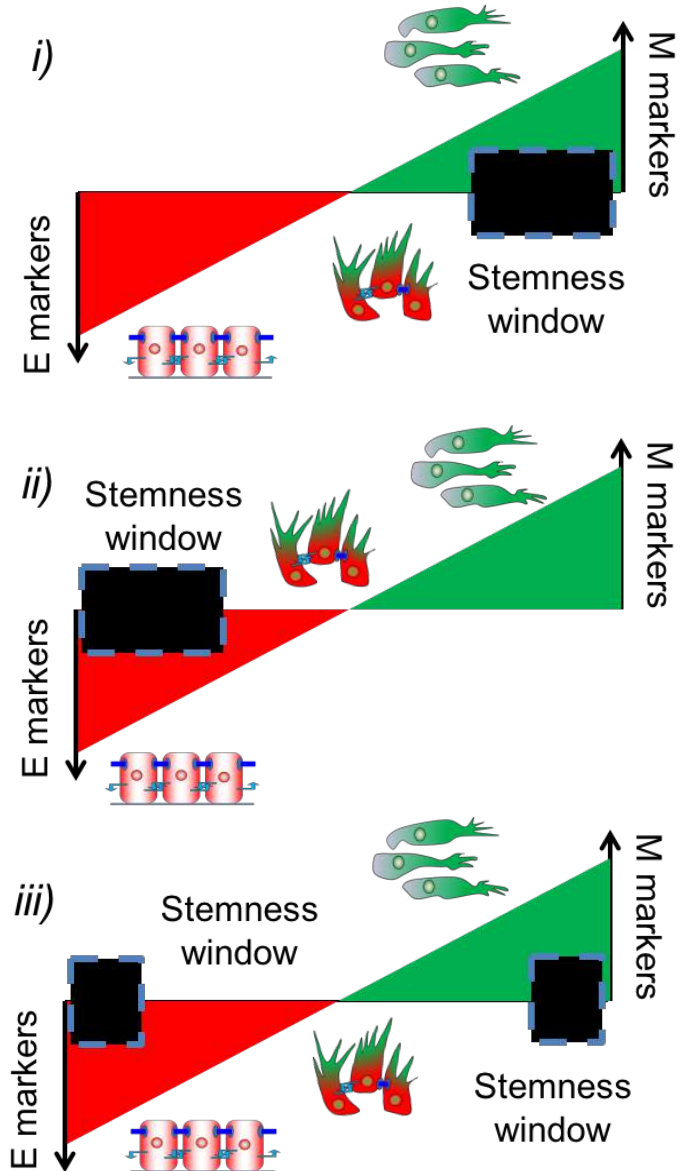
Toni Celià-Terrassa,¹ Óscar Meca-Cortés,¹ Francesca Mateo,¹ Alexia Martínez de Paz,¹ Nuria Rubio,² Anna Arnal-Estapé,³ Brian J. Ell,⁴ Raquel Bermudo,^{5,6} Alba Díaz,⁶ Marta Guerra-Rebollo,² Juan José Lozano,⁷ Conchi Estarás,⁸ Catalina Ulloa,¹ Daniel Álvarez-Simón,¹ Jordi Milà,⁹ Ramón Vilella,⁹ Rosanna Paciucci,¹⁰ Marian Martínez-Balbás,⁸ Antonio García de Herreros,¹¹ Roger R. Gomis,^{3,12} Yibin Kang,⁴ Jerónimo Blanco,² Pedro L. Fernández,^{5,6,13} and Timothy M. Thomson¹

Celia-Terrassa *et al.* J Clin Invest 2012

Breast Cancer Stem Cells Transition between Epithelial and Mesenchymal States Reflective of their Normal Counterparts

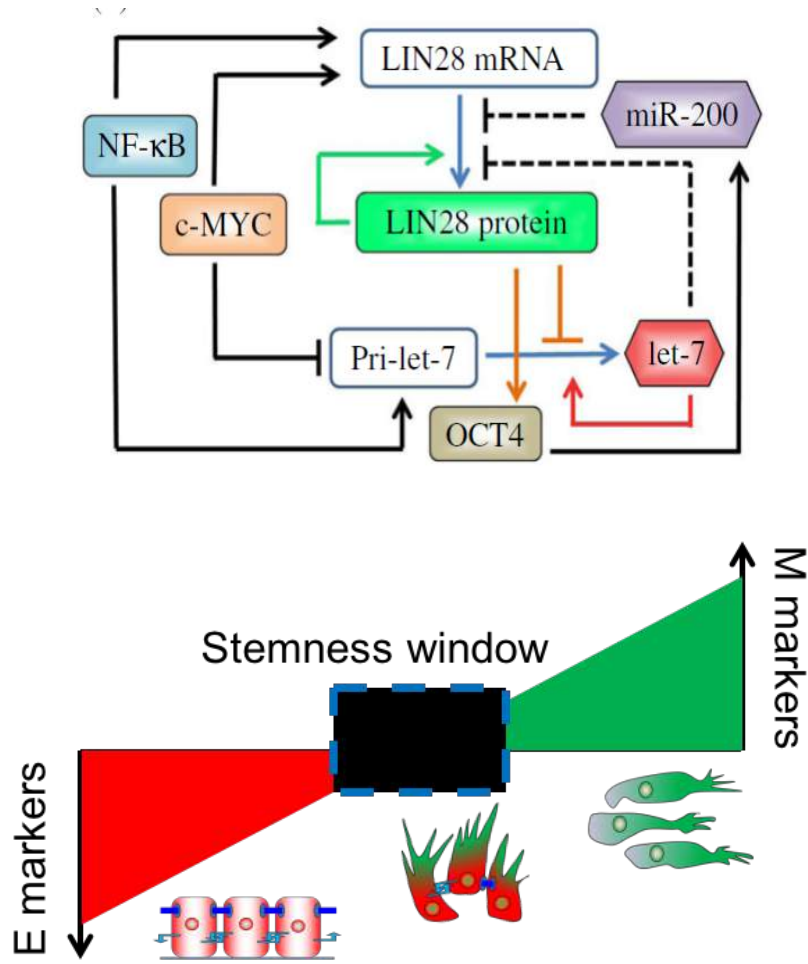
Suling Liu,^{1,6,*} Yang Cong,^{2,6} Dong Wang,¹ Yu Sun,¹ Lu Deng,¹ Yajing Liu,³ Rachel Martin-Trevino,³ Li Shang,³ Sean P. McDermott,³ Melissa D. Landis,⁴ Suhyung Hong,³ April Adams,³ Rosemarie D'Angelo,³ Christophe Ginetier,⁵ Emmanuelle Charafe-Jauffret,⁵ Shawn G. Clouthier,³ Daniel Birnbaum,⁵ Stephen T. Wong,² Ming Zhan,^{2,7} Jenny C. Chang,^{4,7} and Max S. Wicha^{3,7,*}

Liu *et al.* Stem Cell Reports 2013



Hybrid E/M cells can form many more tumors

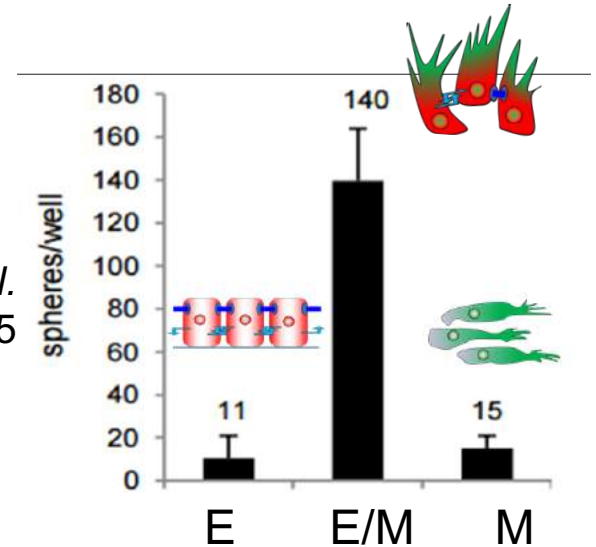
Theoretical prediction



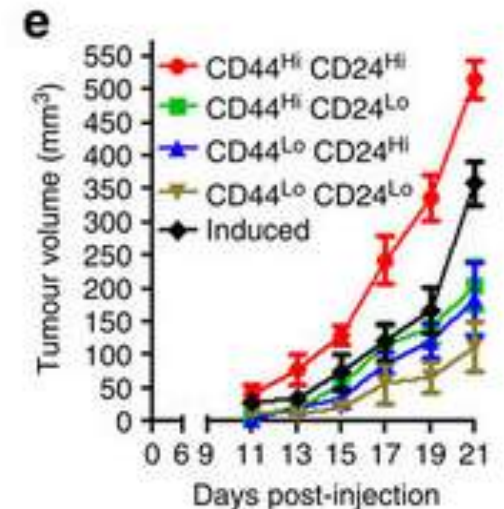
Jolly *et al.* J R Soc Interface 2014
Jolly*, Jia* *et al.* Oncotarget 2015

Experimental validation

Grosse-Wilde *et al.*
PLoS ONE 2015



Goldman *et al.*
Nat Comm 2015



Hybrid E/M cells can form many more tumors

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

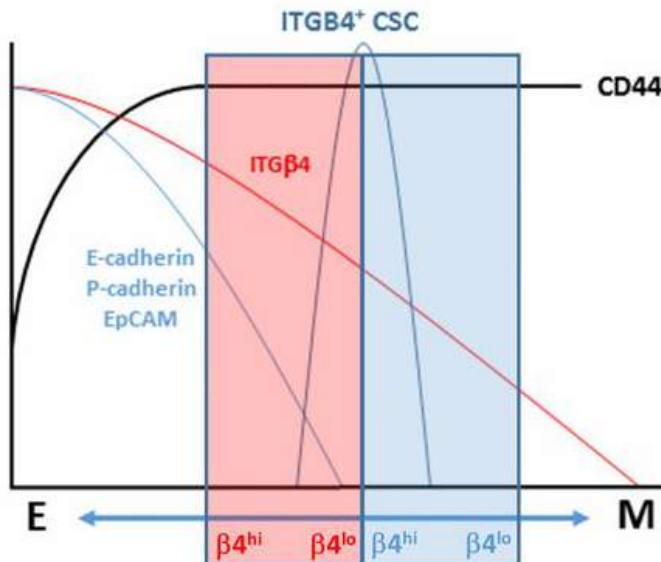
Cornelia Kröger^a, Alexander Afeyan^{a,b}, Jasmin Mraz^{a,c}, Elinor Ng Eaton^a, Ferenc Reinhardt^a, Yevgenia L. Khodor^d, Prathapan Thiru^a, Brian Bierie^a, Xin Ye^{a,e}, Christopher B. Burge^d, and Robert A. Weinberg^{a,f,g,1}

Kroger *et al.* PNAS 2019

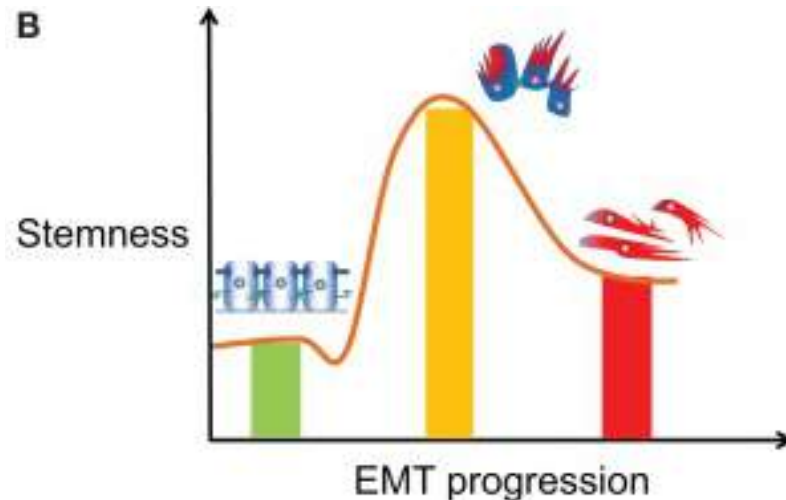
Heterogeneity of Human Breast Stem and Progenitor Cells as Revealed by Transcriptional Profiling

Colacino *et al.* Stem Cell Reports 2018

Justin A. Colacino,^{1,2,3,*} Ebrahim Azizi,^{3,4} Michael D. Brooks,^{3,4} Ramdane Harouaka,^{3,4} Shamileh Fouladdel,^{3,4} Sean P. McDermott,^{3,4} Michael Lee,⁴ David Hill,⁴ Julie Madden,⁵ Julie Boerner,⁵ Michele L. Cote,^{5,6} Maureen A. Sartor,^{3,7} Laura S. Rozek,^{1,3} and Max S. Wicha^{3,4,*}

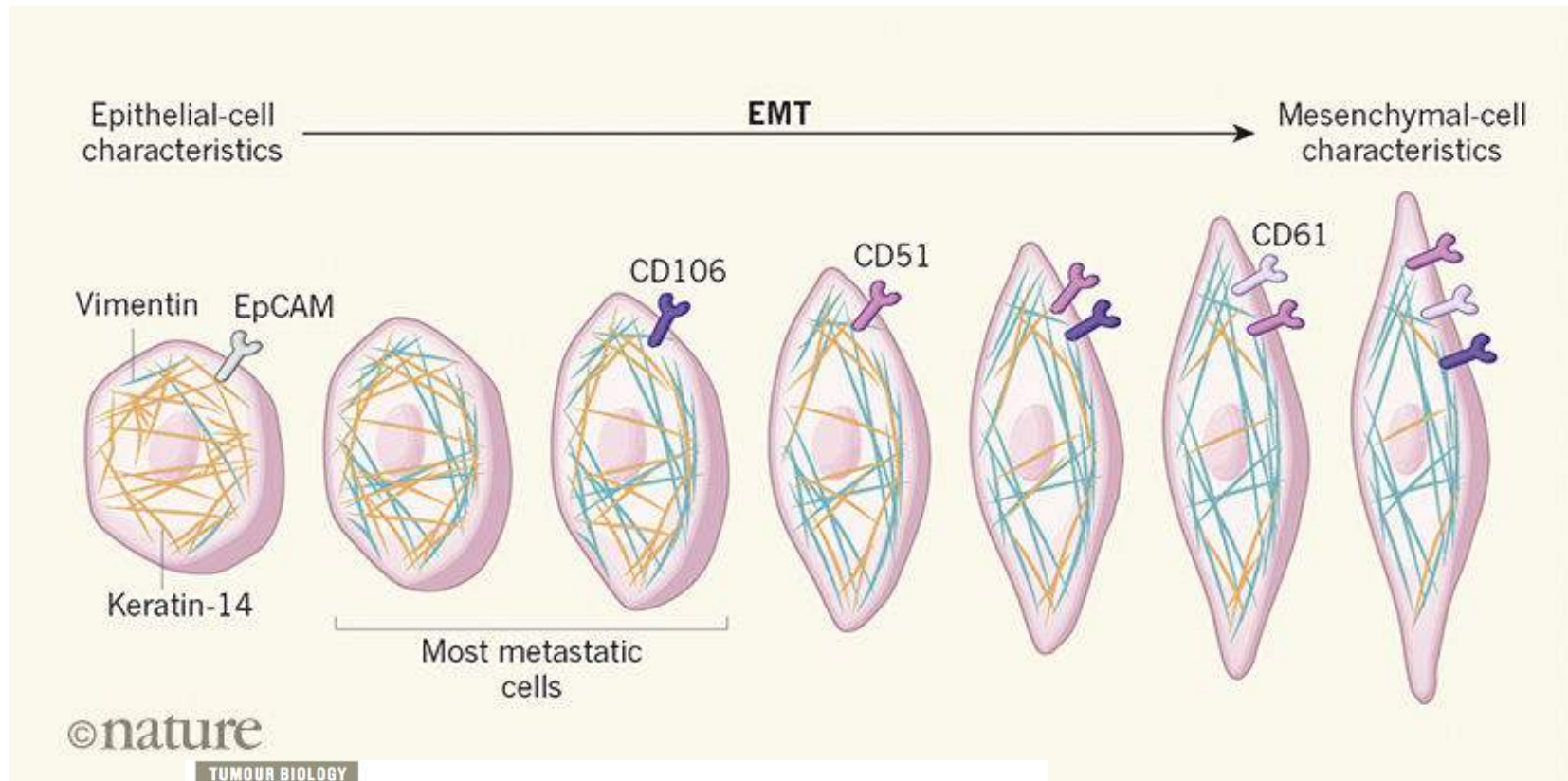


Bierie *et al.* PNAS 2017



Jolly *et al.* Front Oncol 2015
Jolly *et al.* Pharmacol Ther 2018

In vivo spontaneous EMT model highlights the aggressive behavior of hybrid E/M phenotype(s)

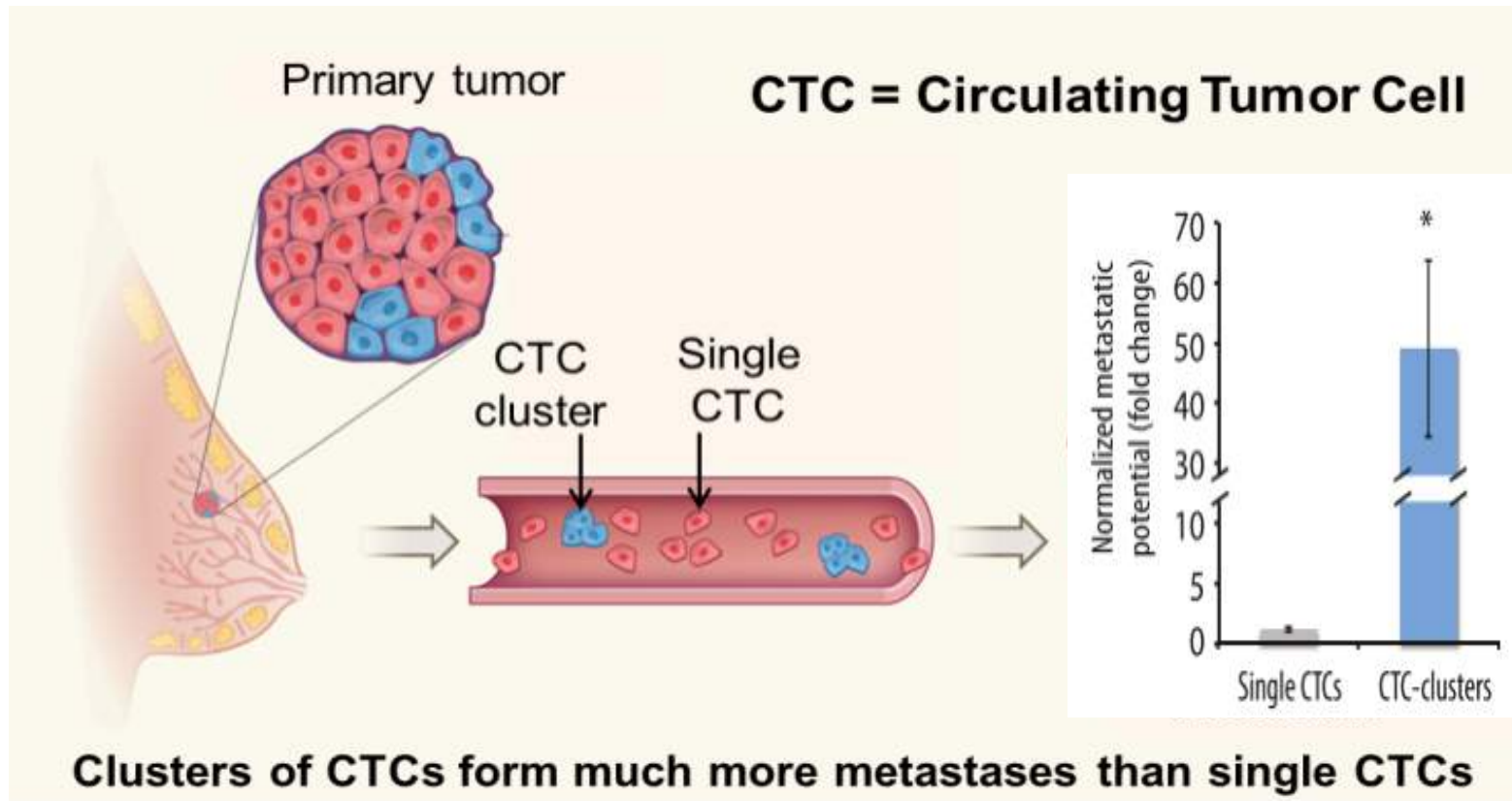


Transition states that allow cancer to spread

Cancers of epithelial-cell origin often contain some tumour cells that have acquired traits of mesenchymal cells. How this leads to cancer spread has now been illuminated in mouse models. [SEE ARTICLE P.463](#)

Thompson & Nagaraj, Nature 2018
Patushenko *et al.* Nature 2018

Hybrid E/M phenotype may form CTC clusters

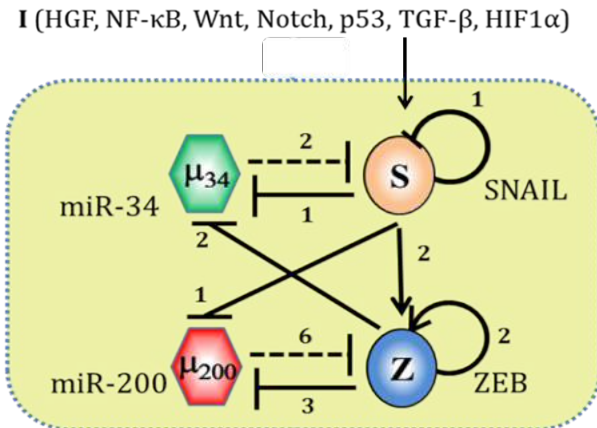


Clusters of CTCs:

- Comprise of 5-8 cells
- Associate with worse patient survival
- Resist cell death in circulation
- **Are formed before entering the circulation**

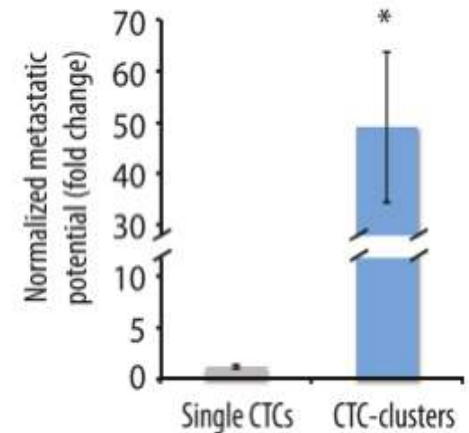
Aceto *et al.* Cell 2014
Bottos & Hynes, Nature 2014³⁰
Cheung *et al.* PNAS 2016

How are CTC clusters formed?



Existence of Hybrid
E/M Phenotype

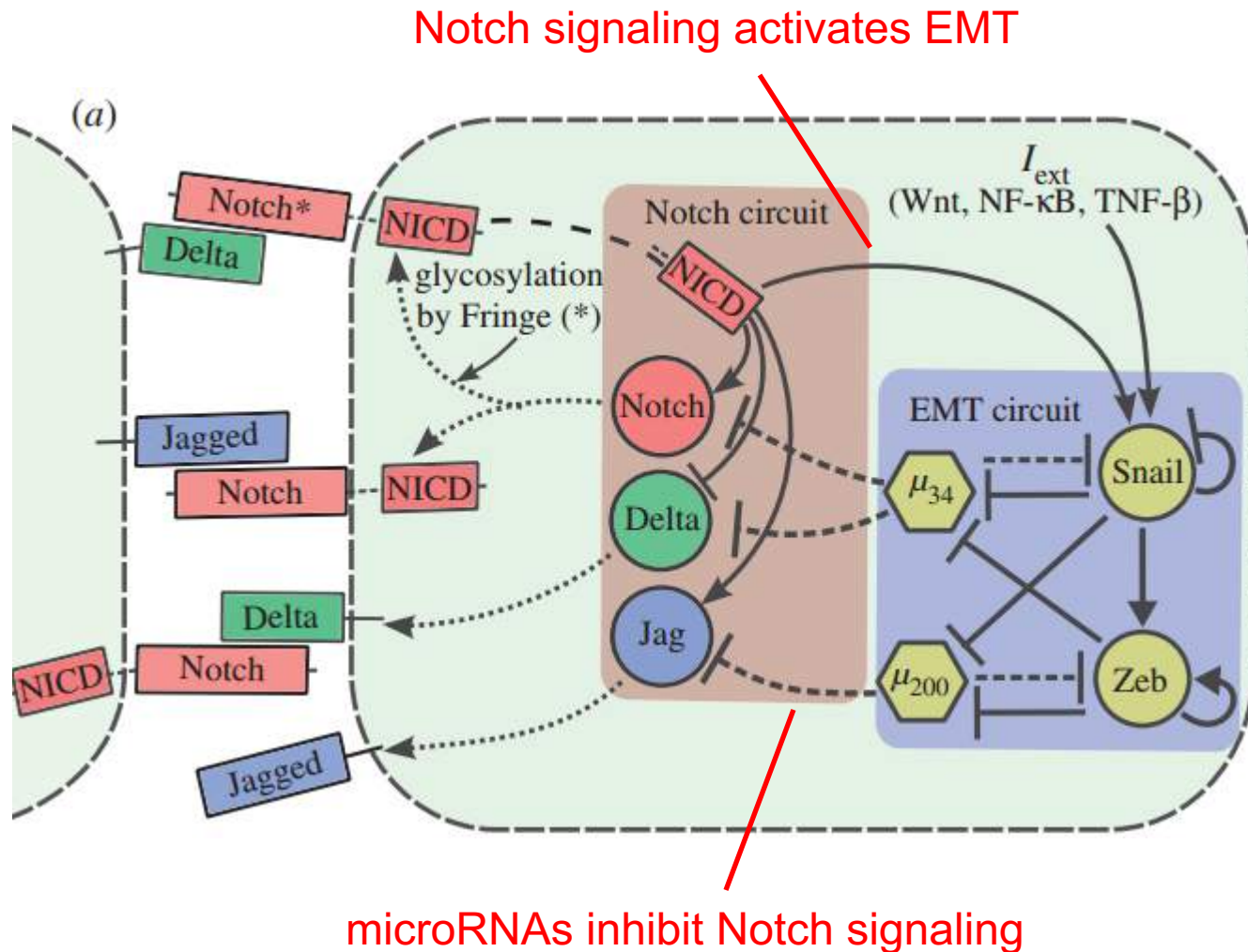
Cell-Cell Signaling



Clusters of CTCs

Cell-cell communication may help coordinate the spatial proximity of hybrid E/M cells to form CTC clusters

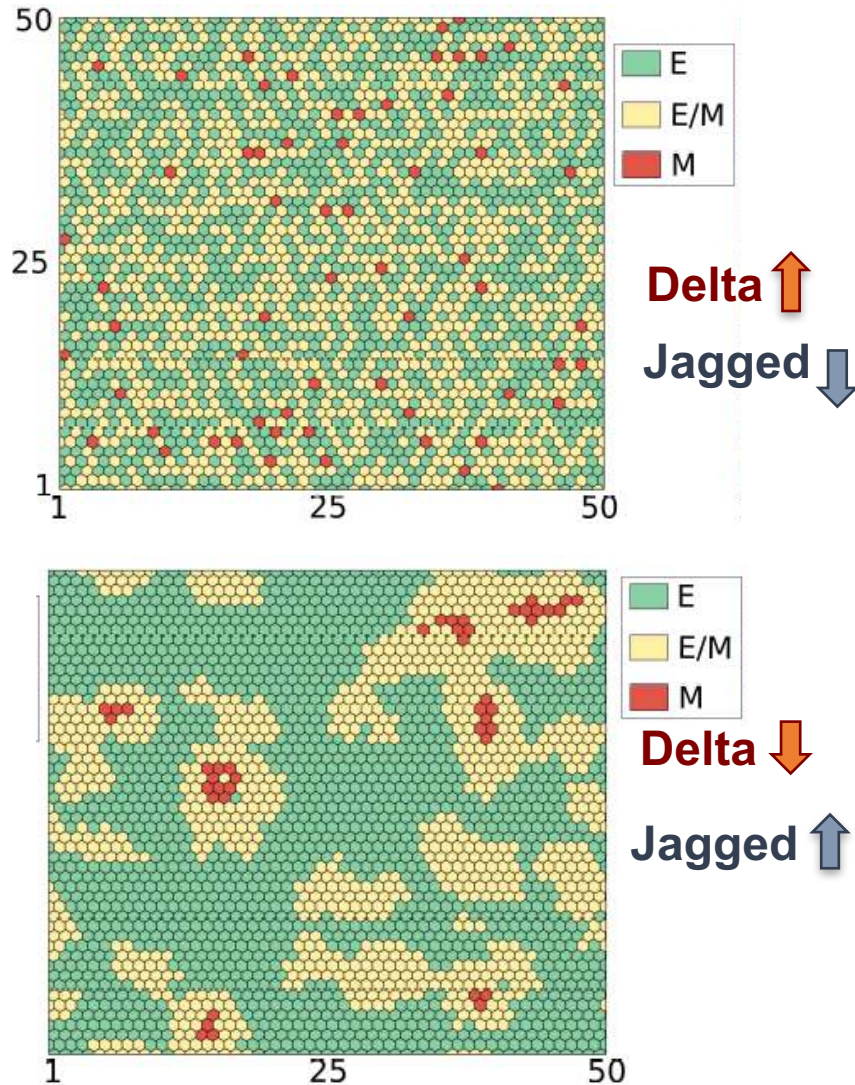
Crosstalk between EMT and Notch pathways



Can cell-cell communication via Notch signaling enable forming CTC clusters?

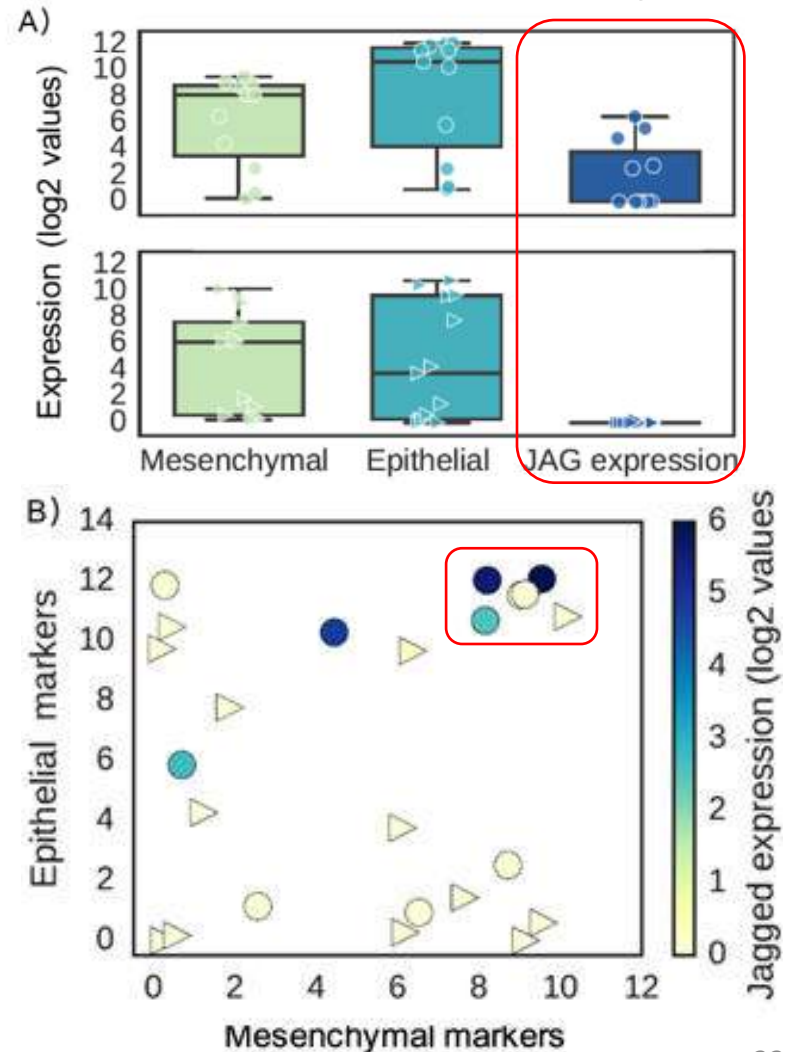
Notch-Jagged signaling can form CTC clusters

Theoretical prediction

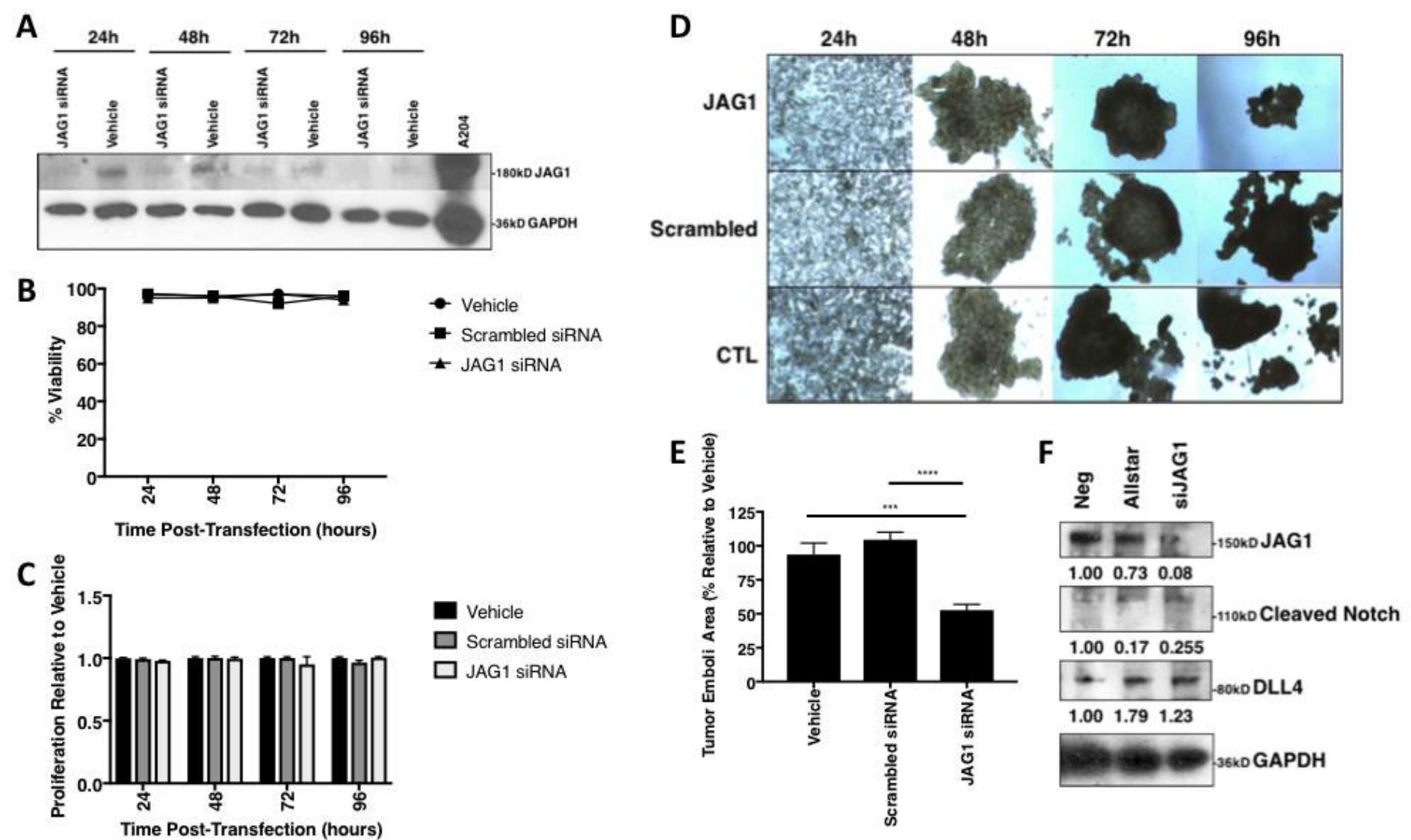


Experimental validation

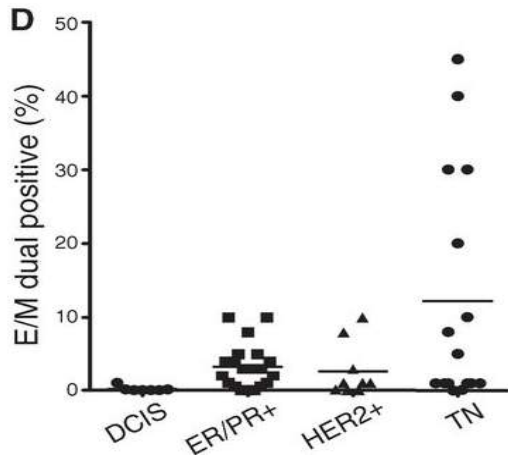
Patient data for CTC clusters vs. single CTCs



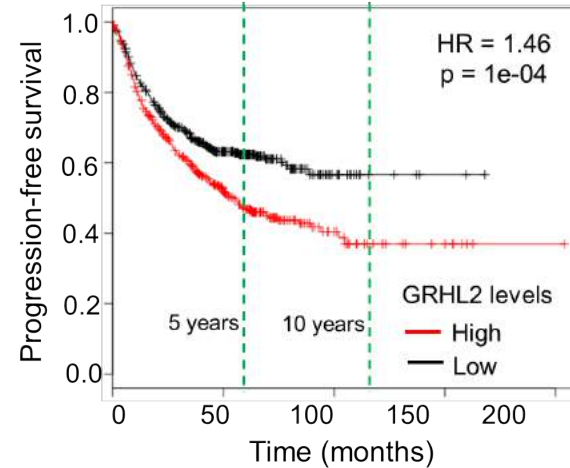
JAG1 knockdown diminishes emboli formation



Why do hybrid E/M cells matter in the clinic?

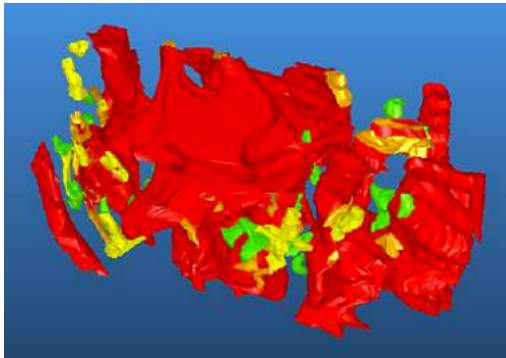


Yu *et al.* Science 2013



n = 982
(lung
cancer)

Jolly *et al.* Oncotarget 2016

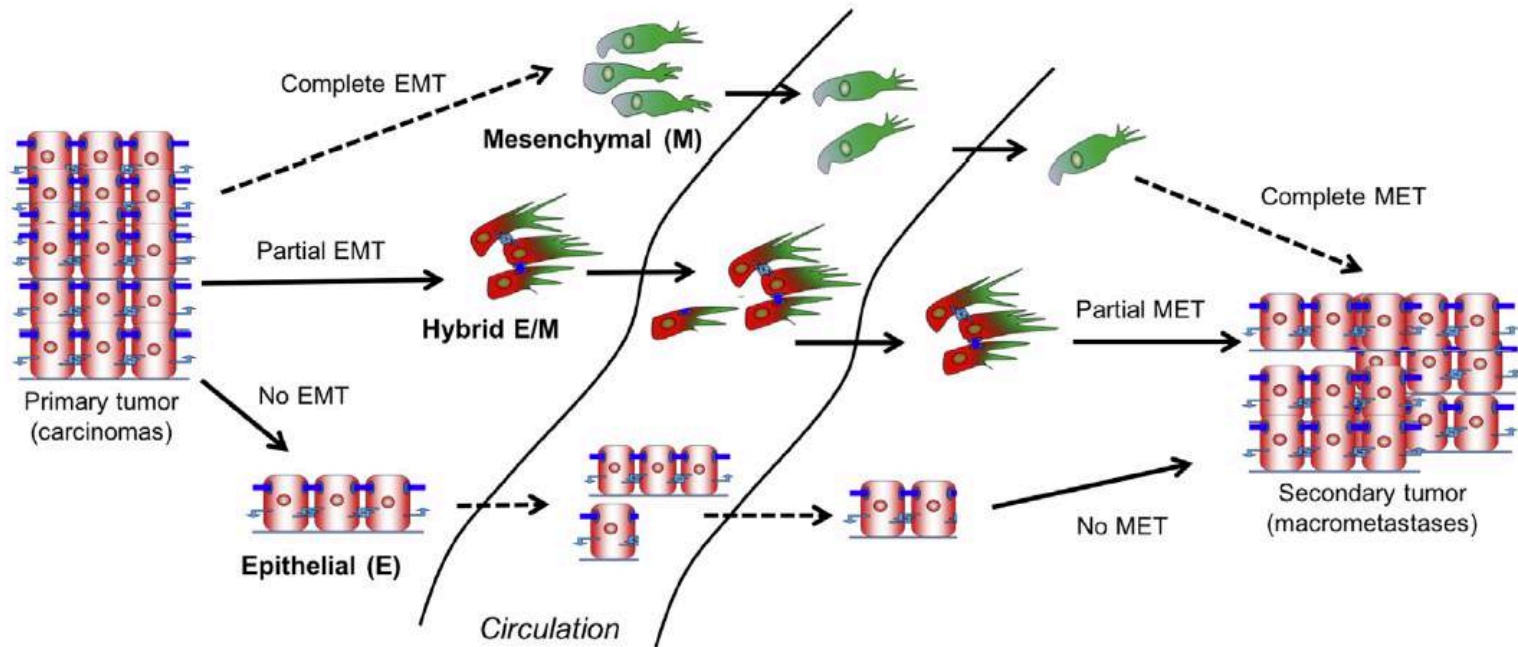


Single-cell migration is very rare, if any, in cancer

Co-expression of nuclear ZEB1 and membranous E-cad - a 'partial EMT' status of 'tumor buds'

Hybrid E/M may be more aggressive than a complete EMT

Hybrid E/M: the 'fittest' for metastasis?



United cancer cells stand, divided they fall!

- Cells can help each other develop resistance against cell death
- Clusters can navigate more effectively
- Hybrid E/M cells can more easily initiate new tumors
- Hybrid E/M cells can generate more heterogeneity driving cooperation

Conclusion

Existing framework:

Hybrid E/M state is **transient**, and the more the EMT, the more aggressive the cancer

Tam and Weinberg, Nat Med 2013, Savagner P Curr Opin Dev Biol 2015

Proposed framework:

Hybrid E/M state is **stable** and may be more aggressive than a complete EMT

Jolly *et al.* Front Oncol 2015, Jolly *et al.* Oncotarget 2016

with biophysical models. Computational modeling, including those that consider the mutual inhibitory loops between several microRNAs (miRNAs) and EMT transcriptional drivers like Snail1 and Zeb1, also accepts an intermediate hybrid EMT state that could favor the progress of developmental programs and metastatic potential (Jolly *et al.*, 2015; Lu *et al.*, 2013; Tian *et al.*, 2013; Zhang *et al.*, 2014). The inclusion of additional reciprocal inhibitory loops that involve other transcription factors (e.g., Zeb1 with *Ovol2* and *Grhl2*) and the description of these as phenotypic stability factors indicates that the network is capable of generating additional intermediate stabilized states that, therefore, are not necessarily metastable (Hong *et al.*, 2015; Jolly *et al.*, 2016).

Nieto MA, Thiery JP, Cell 2016

“Instead, there is growing evidence that a cell that has undergone only a partial EMT, thereby expressing both retained epithelial and acquired mesenchymal traits, is best positioned to acquire stem-like properties (Grosse-Wilde *et al.*, 2015; **Jolly *et al.*, 2015 a,b**, Andriani *et al.*, 2016)”

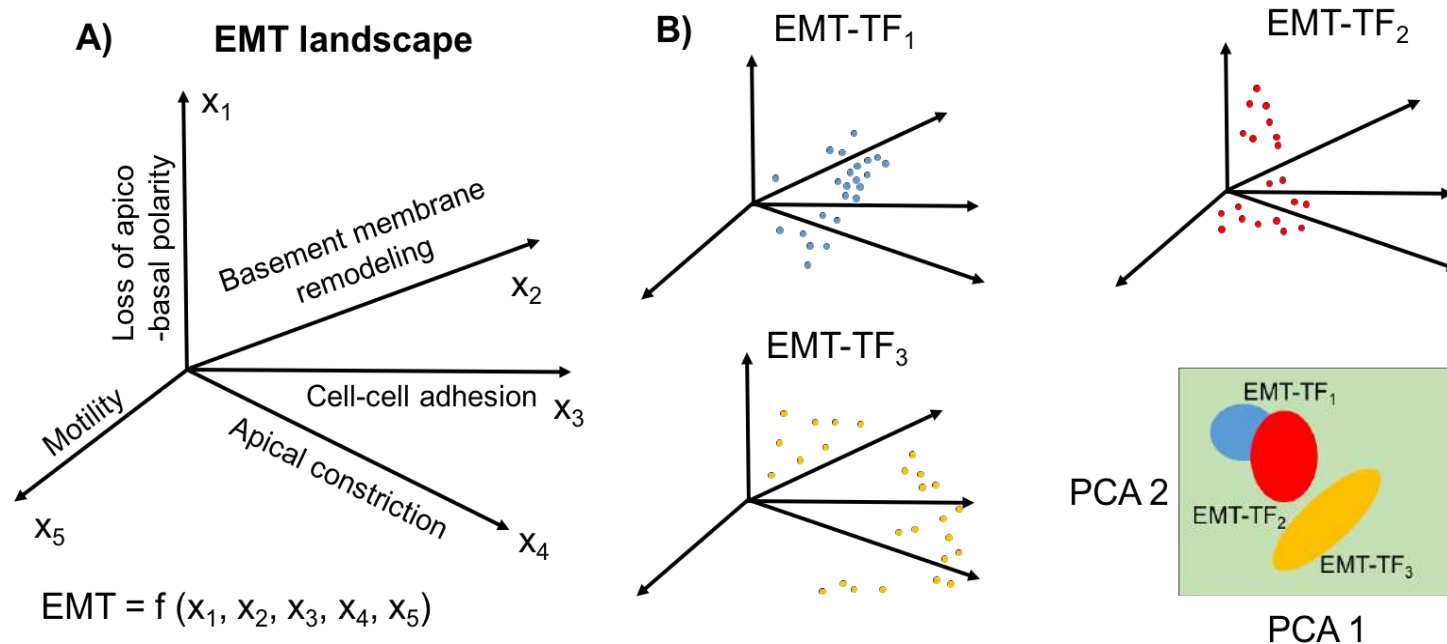
Pattabiraman & Weinberg, CSHL Quant Bio 2017

Ongoing questions/debate

Epithelial-to-mesenchymal transition is dispensable for metastasis but induces chemoresistance in pancreatic cancer

Xiaofeng Zheng^{1*}, Julienne L. Carstens^{1*}, Jiha Kim¹, Matthew Scheible¹, Judith Kaye¹, Hikaru Sugimoto¹, Chia-Chin Wu², Valerie S. LeBleu¹ & Raghu Kalluri^{1,3,4}

Zheng *et al.* Nature 2015
Fischer *et al.* Nature 2015
Krebs *et al.* Nat Cell Biol 2017



- EMT is a highly non-linear and multi-dimensional process
- Connections between genetics and biophysics of EMT are still being elucidated

Jolly *et al.* Mol Oncol 2017

Fifty (or more) shades of cellular plasticity

A box contains 6 white balls, 3 red balls, and 3 blue balls. In how many ways can one pick one white ball, one red ball, and one blue ball?

- No. of EMT states ≥ 6

Pastushenko et al. Nature 2018

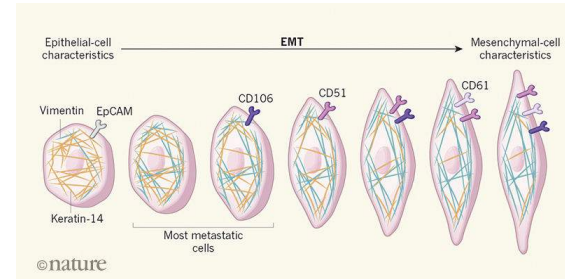
Huang et al. EMBO Mol Med 2014

Schliekelman et al. Cancer Res 2015

Yu et al. Science 2013

Biddle et al. EBioMedicine 2016

Varankar et al., bioRxiv: 307934

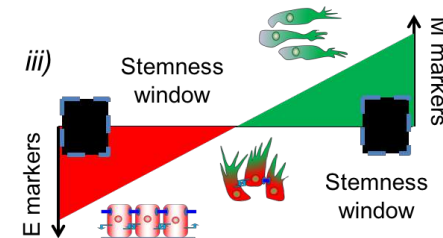


- No. of stem-like states ≥ 3

Liu et al. Stem Cell Reports 2014

Colacino et al. Stem Cell Reports 2018

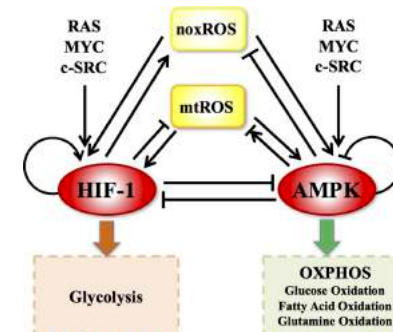
Ruscetti et al. Oncogene 2015, 2016



- No. of metabolic states ≥ 3

Yu et al. Cancer Res 2017

Saha et al. Cancer Res 2018



- Total no. of states = $6 \times 3 \times 3 \times \dots$?

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Kundan Sengupta
Maithilee Khot
Apoorva Kulkarni



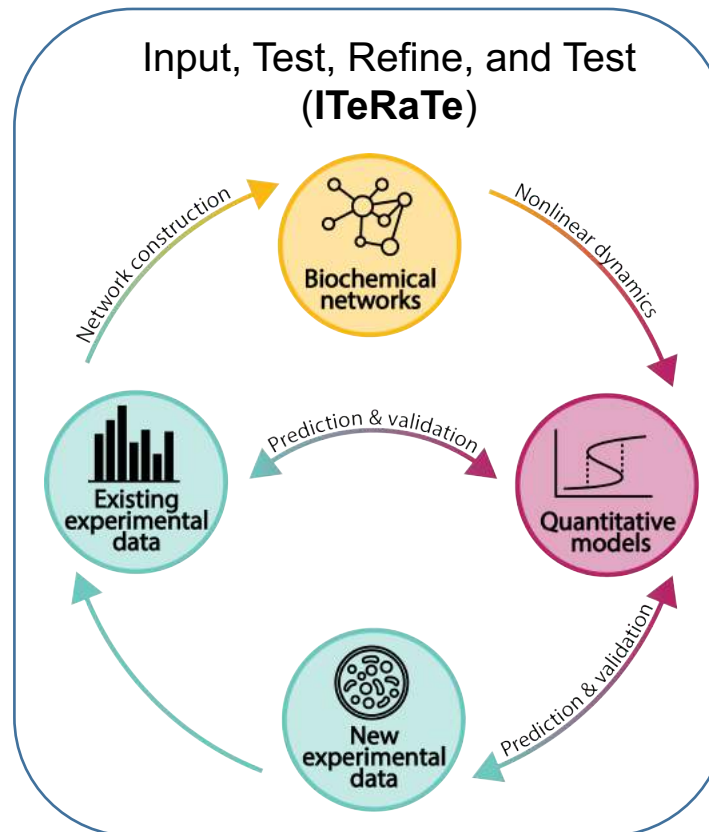
Sharmila A Bapat
Sagar Varankar



Jason A Somarelli
Andrew J Armstrong
Gayathri R Devi
L Gearhart-Serna
Kathryn E Ware
Shengnan Xu



Ravi Salgia
Prakash Kulkarni
Blake Hewelt
Arjun Kalvala



Herbert Levine
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MC Farach-Carson
Dongya Jia
Federico Bocci
Jason T George
Shubham Tripathi
Marcelo Boareto
Xuefei Li
Mingyang Lu
Wen Jia

Govindan Rangarajan
HAS Shri Kishore

Partha Sharthi Dutta
Sudipta Sinha
Sukanta Sarkar

Anandmohan Ghosh
Kuheli Biswas

Aaron Goldman
Shiladitya Sengupta