

chris wiggins

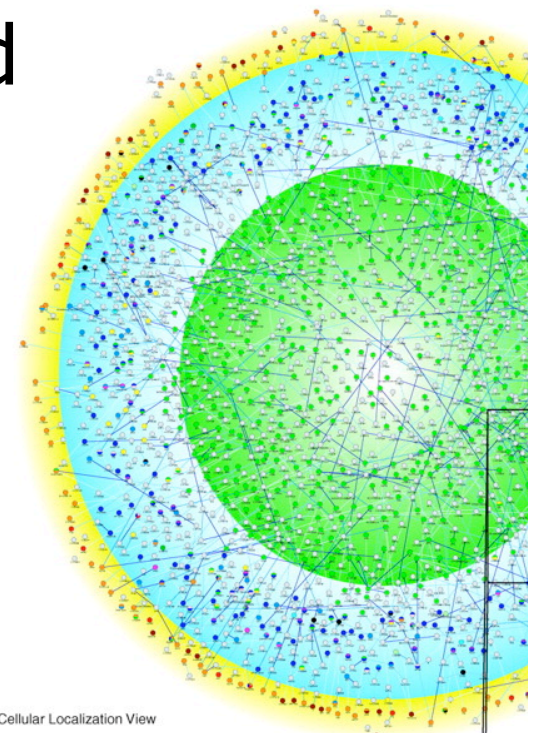
department of applied physics and applied
mathematics

+

center for computational biology and
bioinformatics

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schedule:

Morning Session, May 04, 2007 (Friday) (Davis Auditorium)		
9:00-9:20	Chris Wiggins	Inverse problems and imaging for systems biology
9:30-10:00	Fred Chang	Dynamic assembly of cells: rings, filaments and tubules
10:10-10:40	Ruben L. Gonzalez	Single-molecule enzymology of complex biochemical reactions
10:50-11:20	Rafa Yuste	Reverse engineering the cortical microcircuit

outline:

1. context
2. problems
 - inference problem
 - image problem
 - inference problem w/images
3. call to arms

biological pathologies:

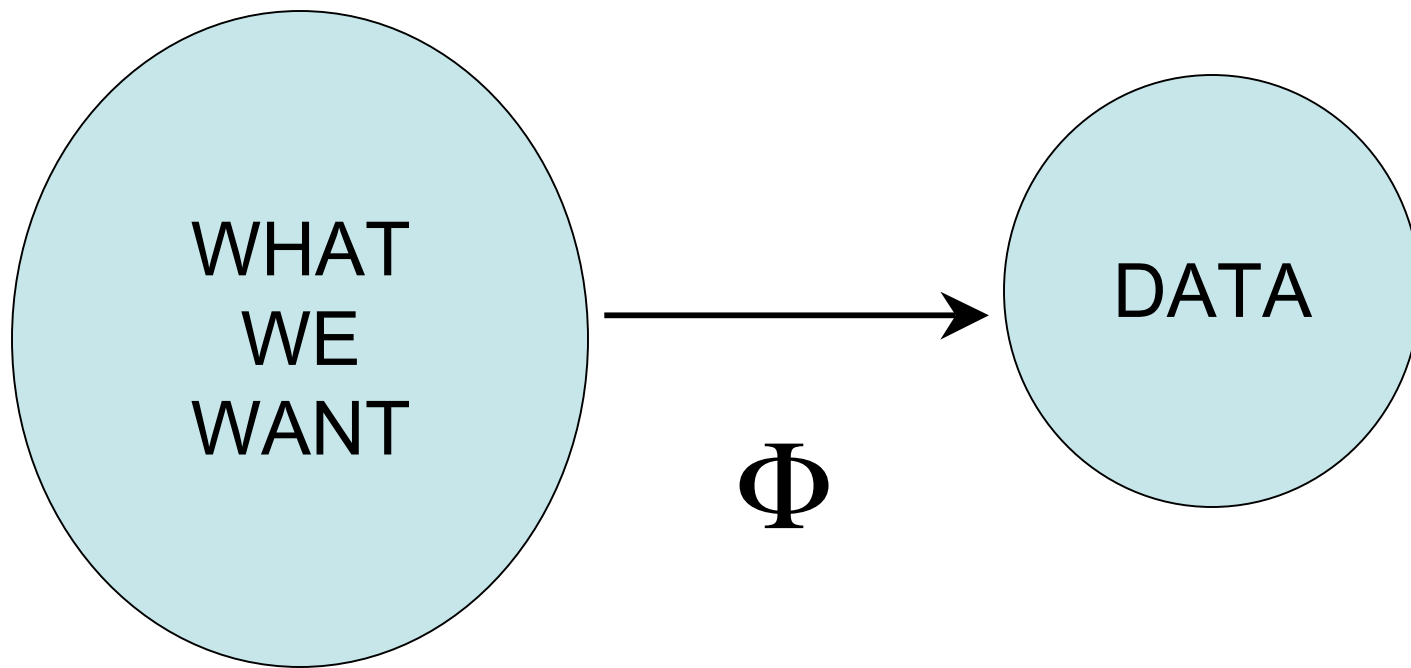
1. no “basic equation”:

- model-building
- validation
- complexity control

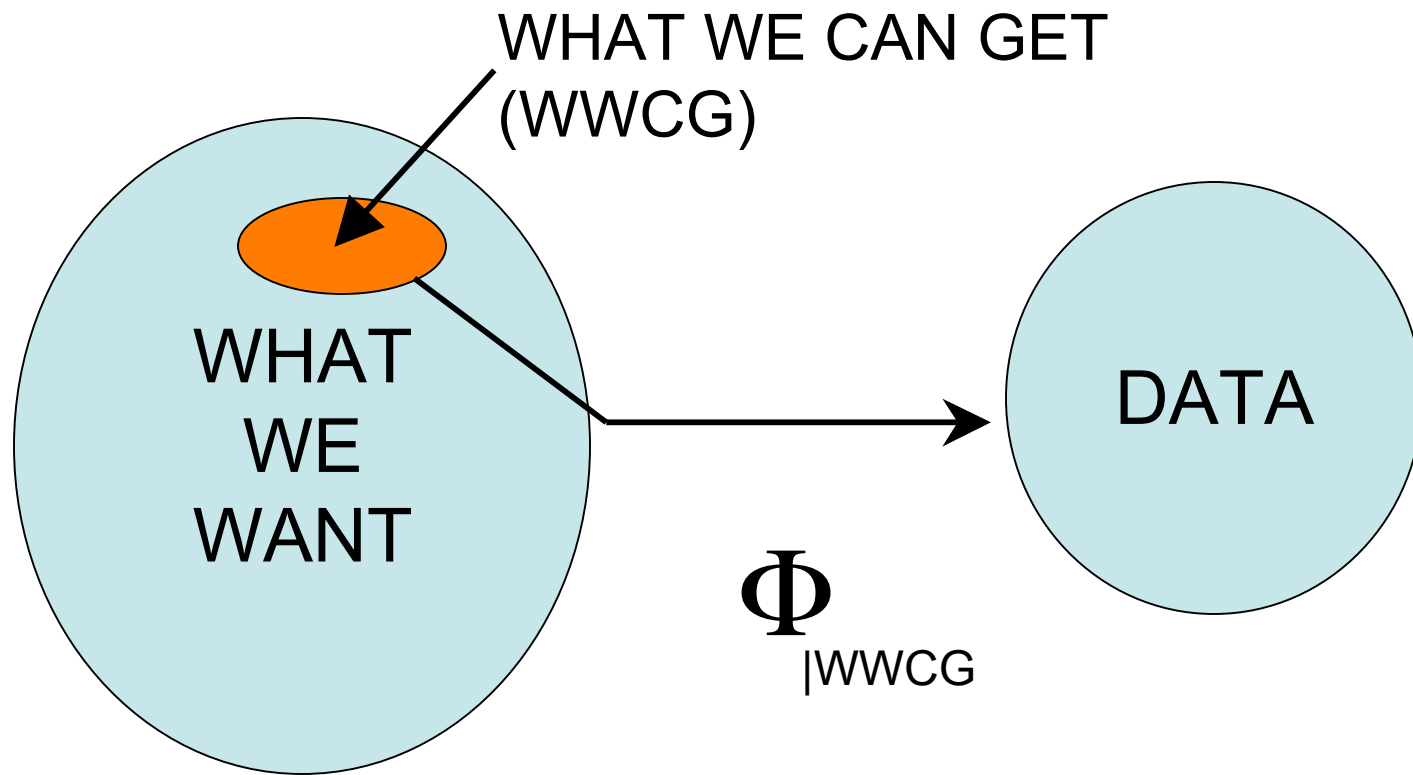
2. goal of imaging

- diagnosis/natural science vs.
- image enhancing

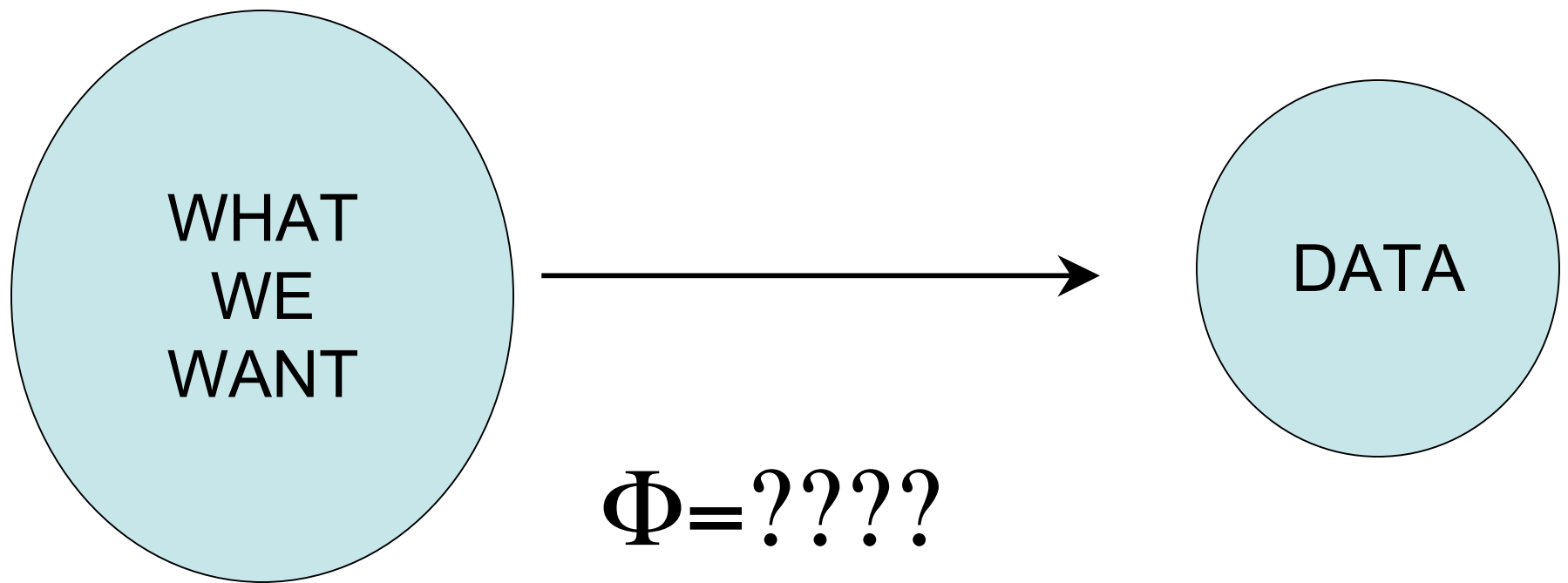
Problem: Φ is often
SMOOTHING



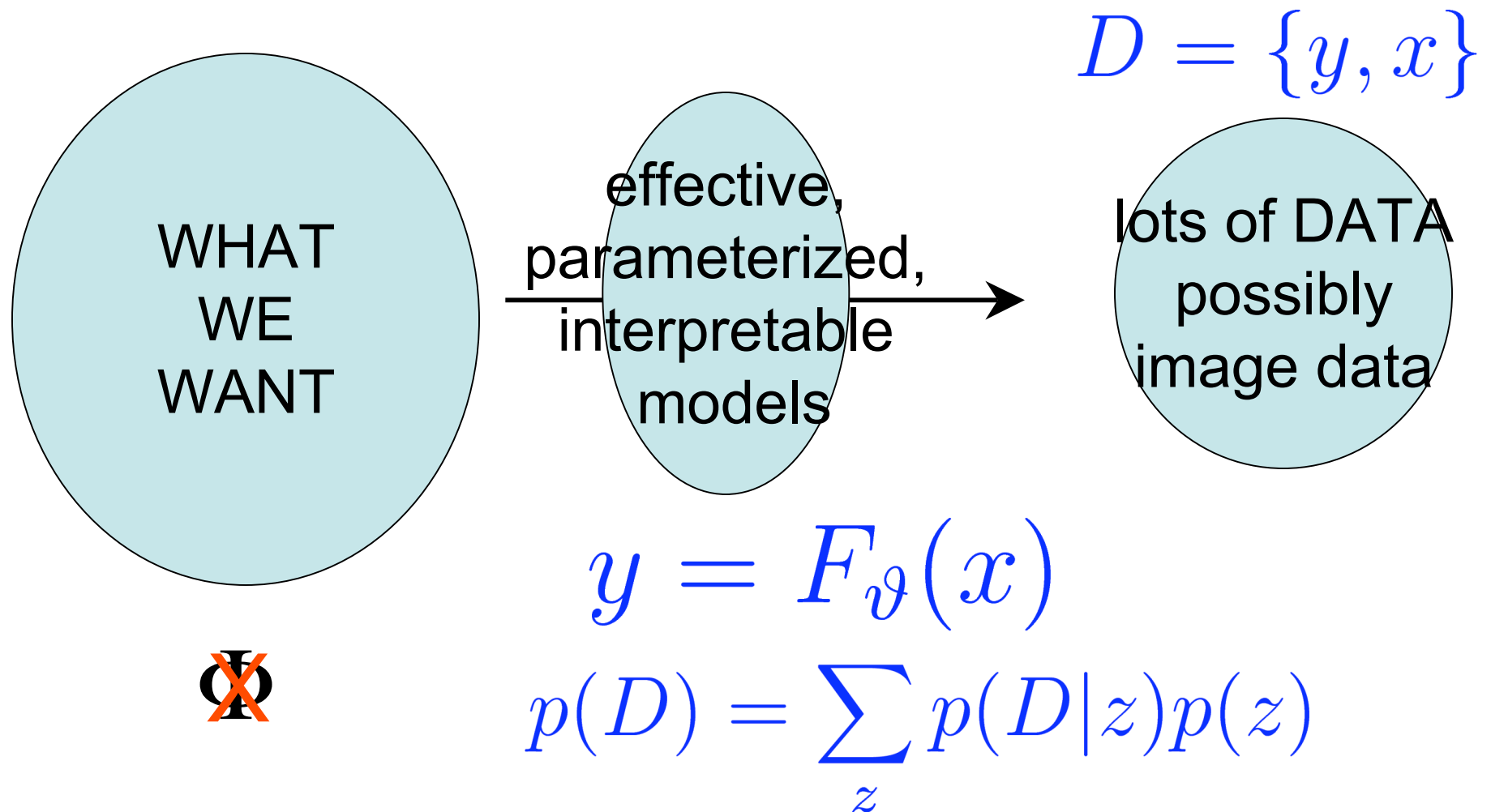
Solution: Simplify the problem



biological problem: we have
NO CLUE what Φ IS



solution: learn parameters in
effective or generative model



biological inverse problems

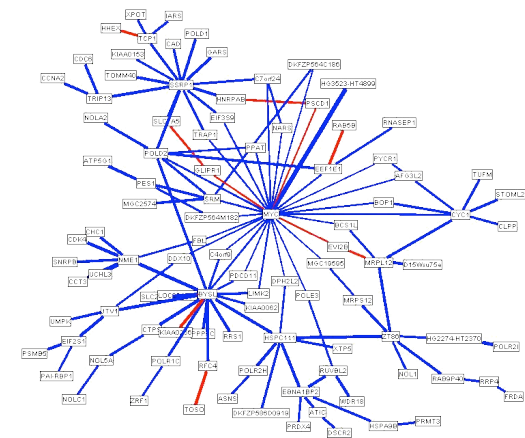
1. parameter learning,

e.g., "z"

$$p(D) = \sum_z p(D|z)p(z)$$

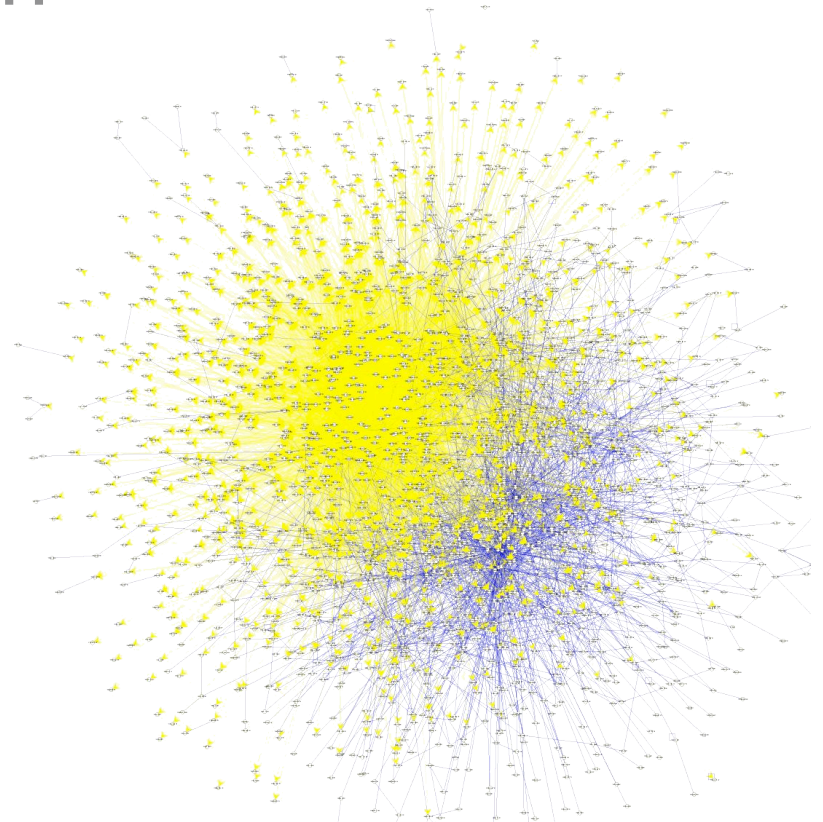
2. structure learning

(a generic “systems”
problem)



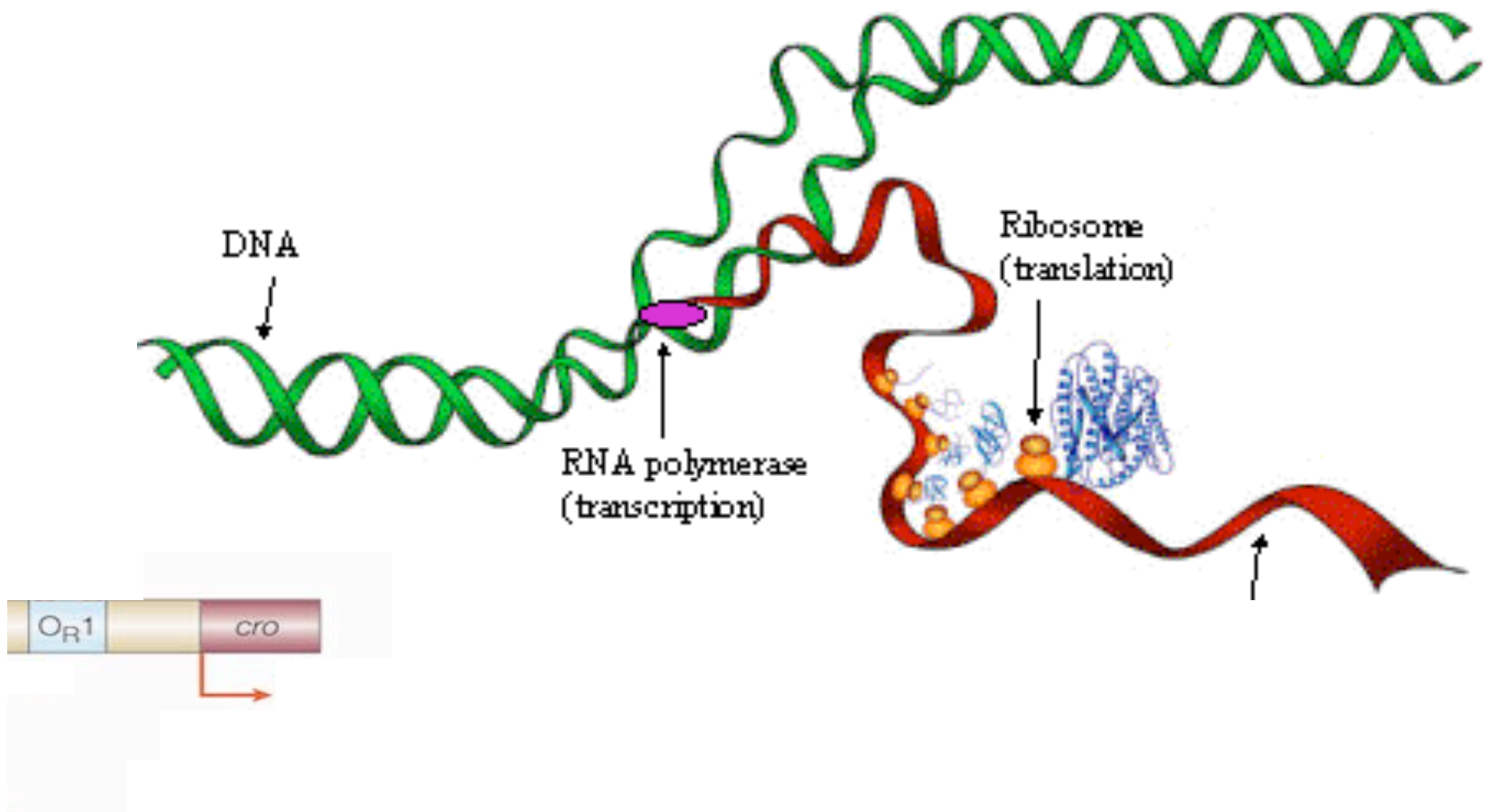
biological networks?

- protein-protein
- transcriptional regulation
- signaling

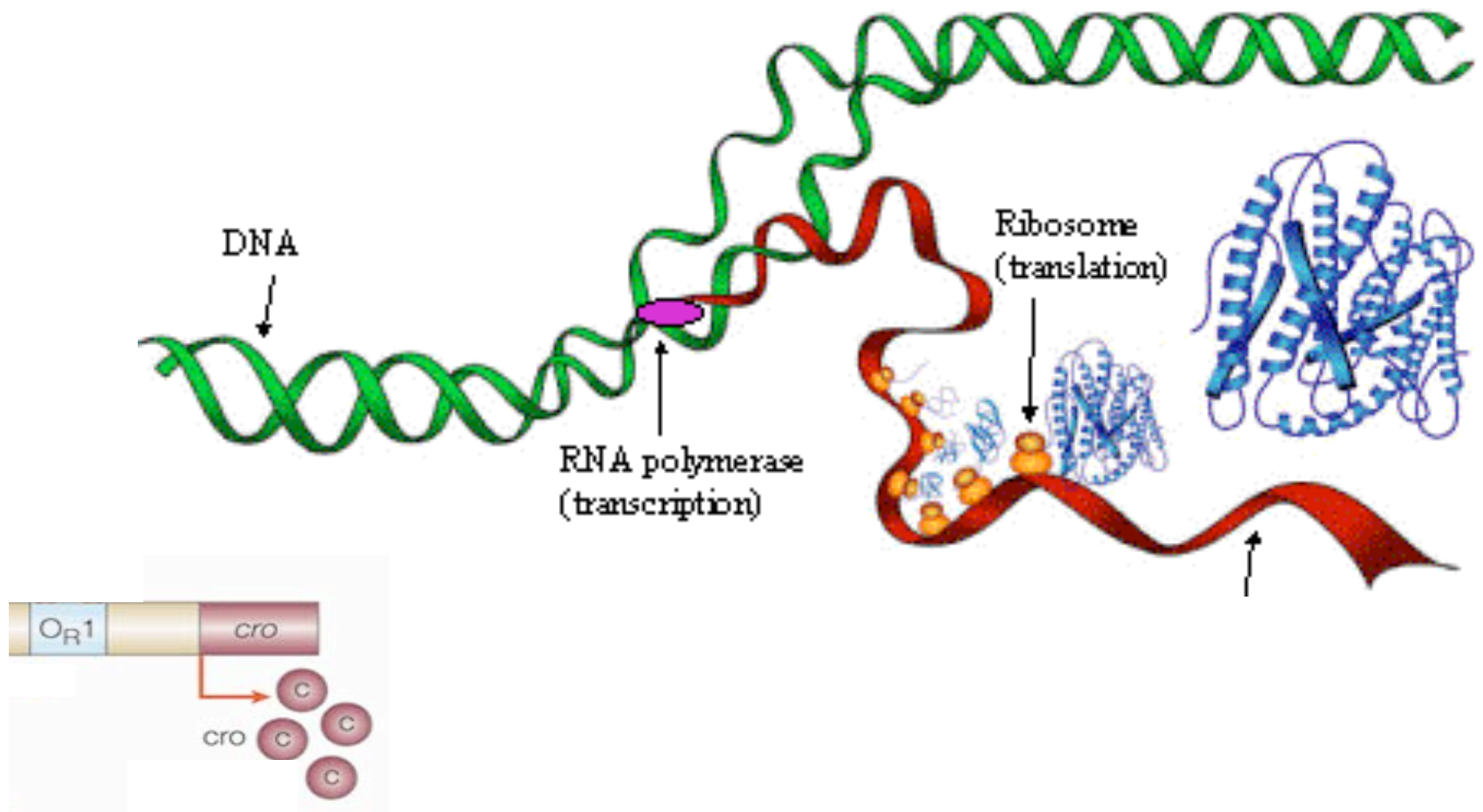


biology as told by a theorist

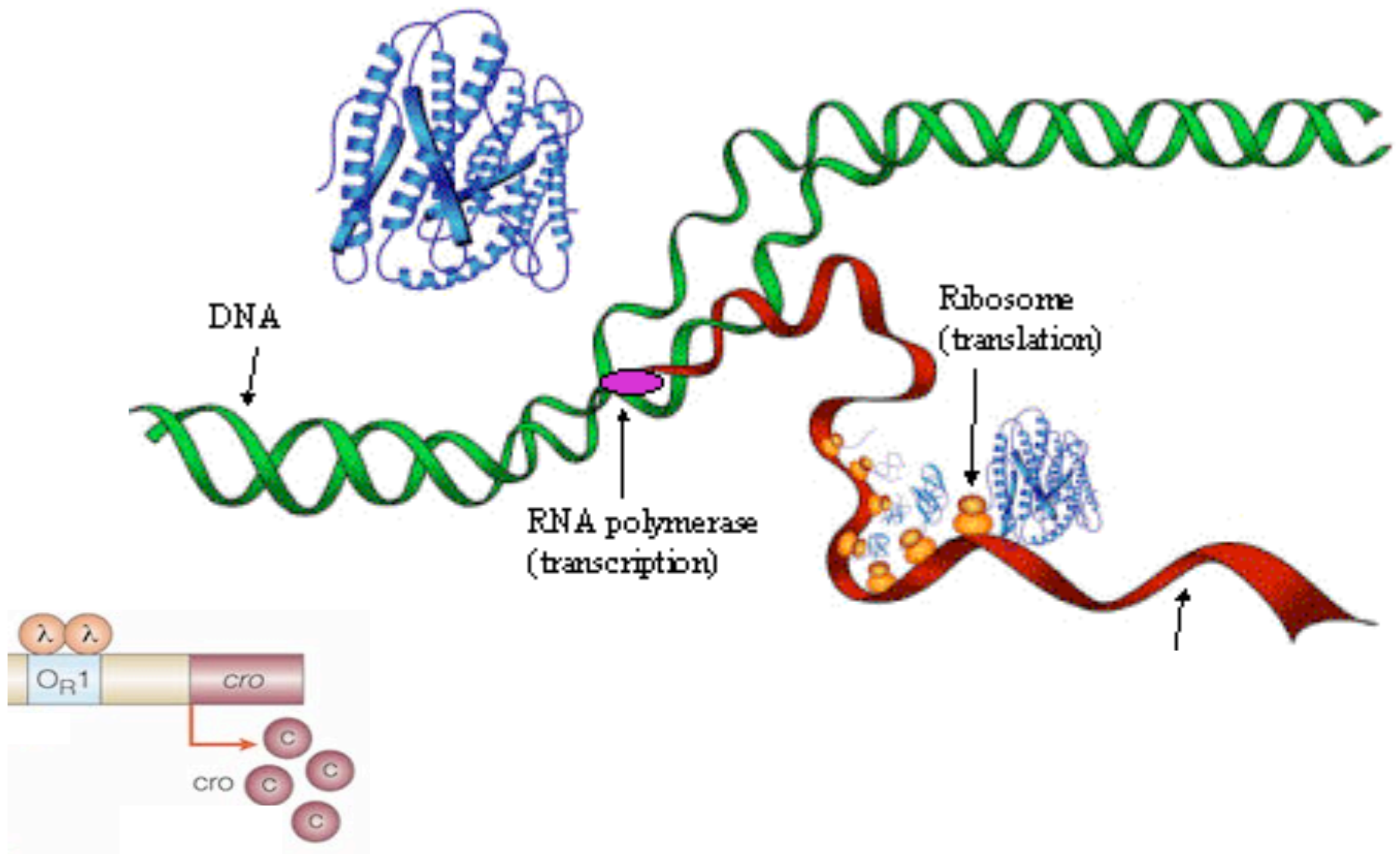
D->R->P



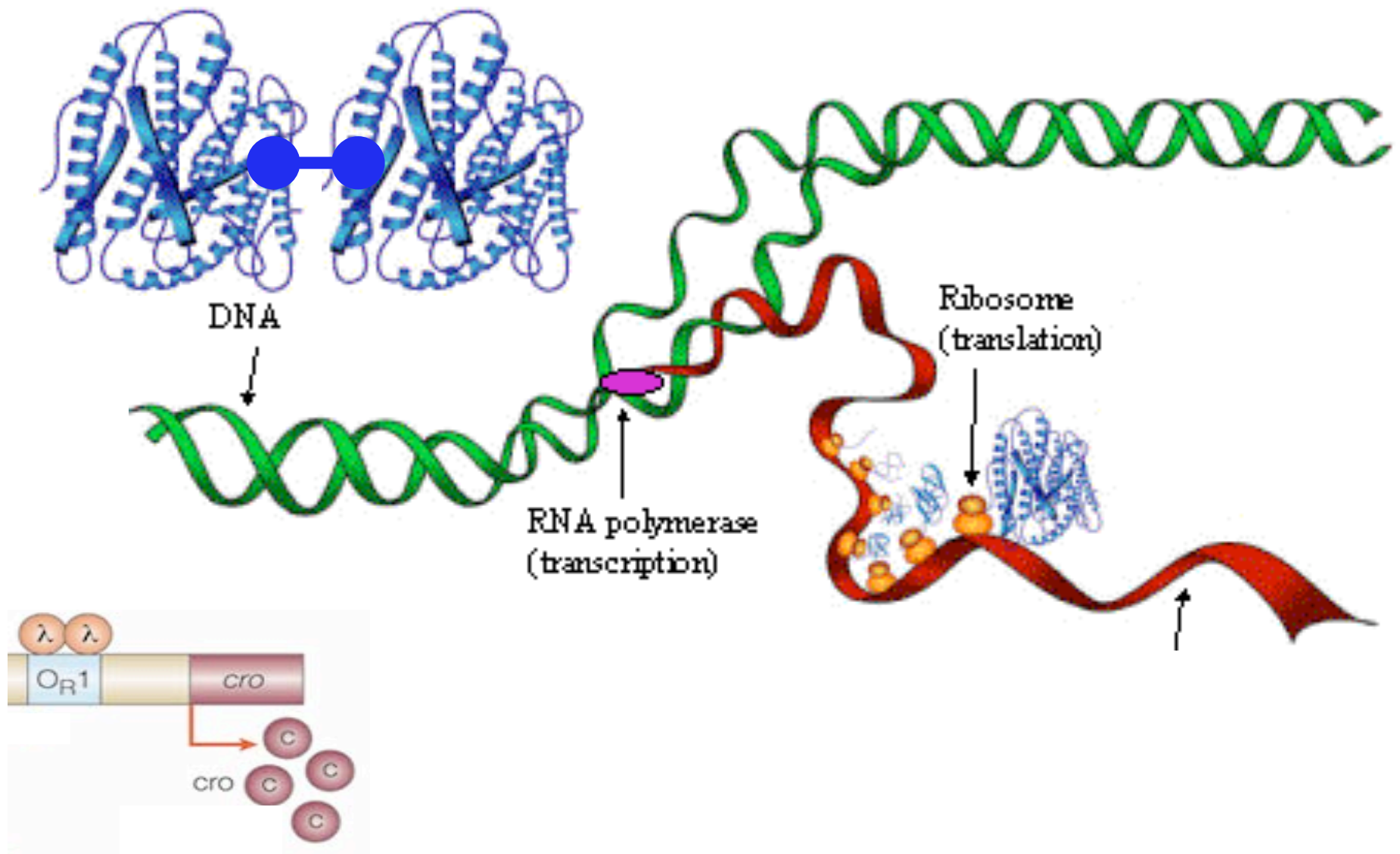
biology as told by a theorist



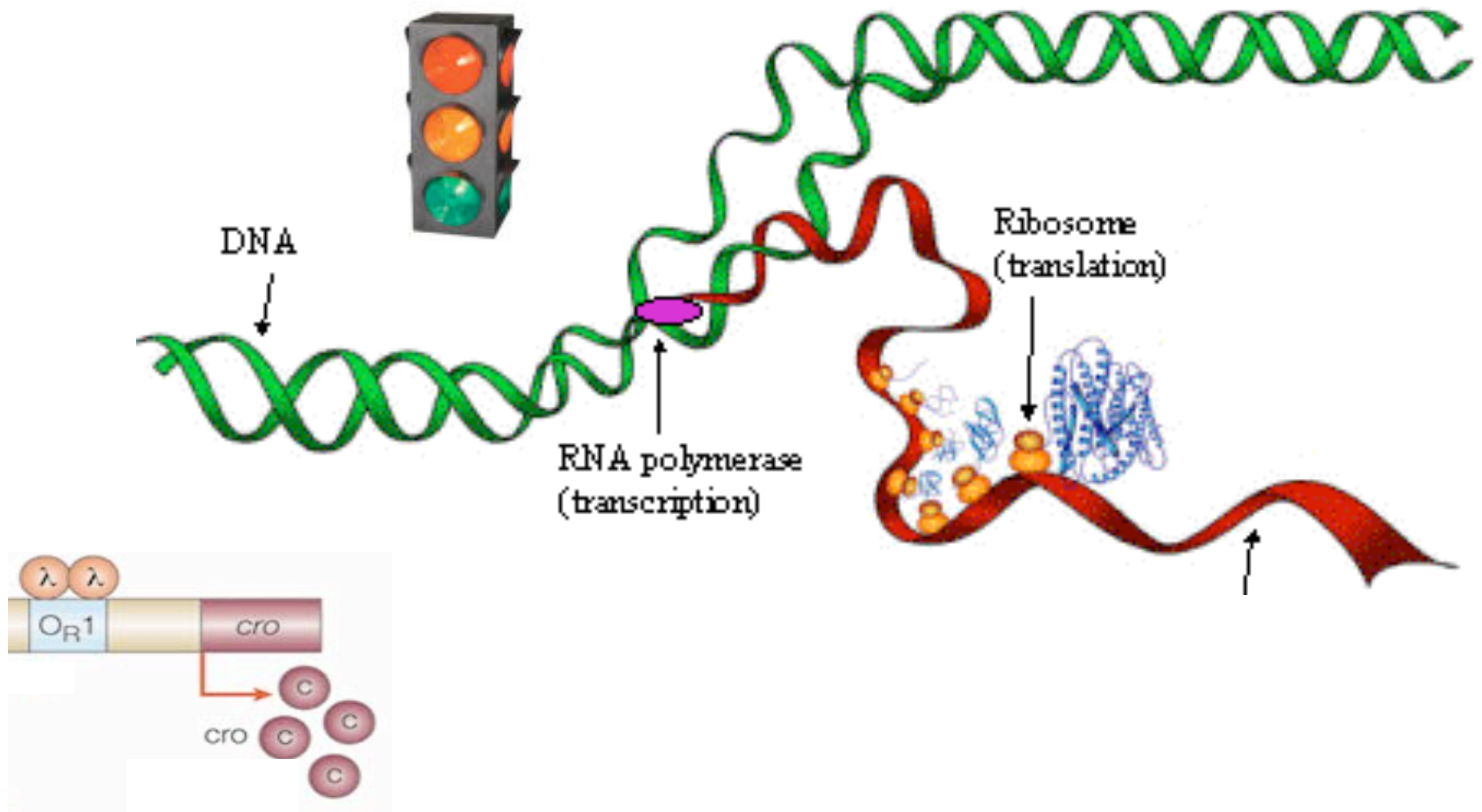
biology as told by a theorist



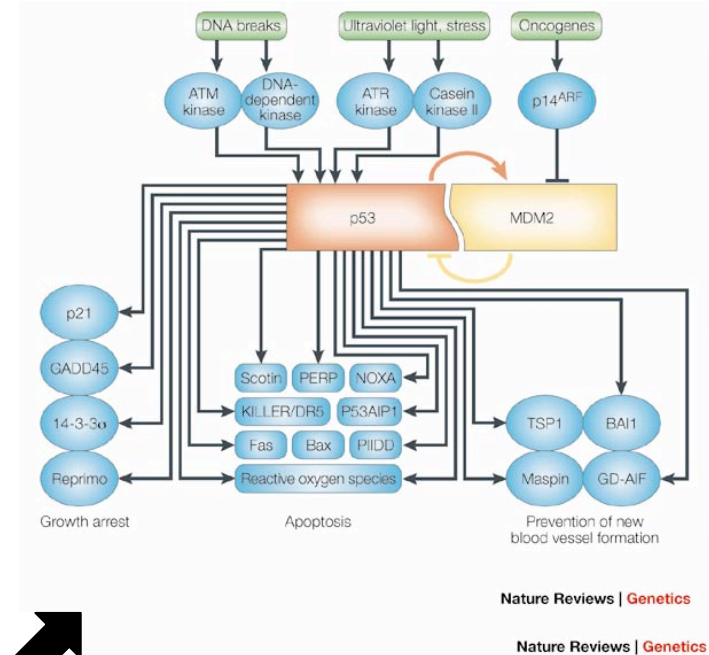
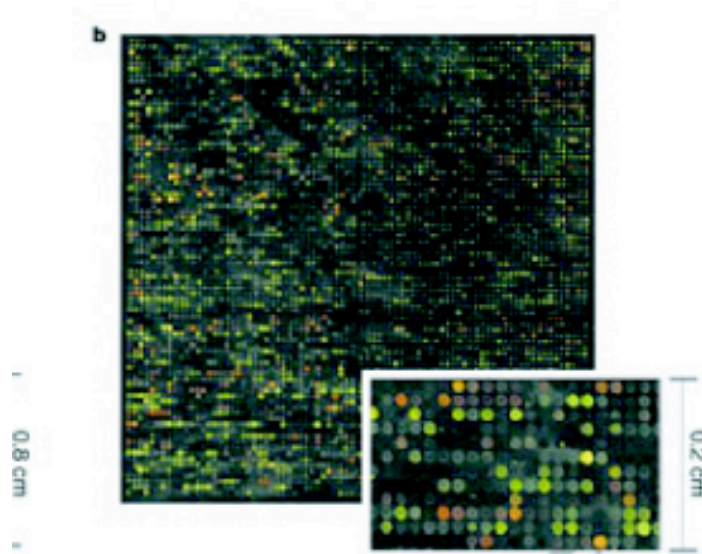
biology as told by a theorist



biology as told by a theorist

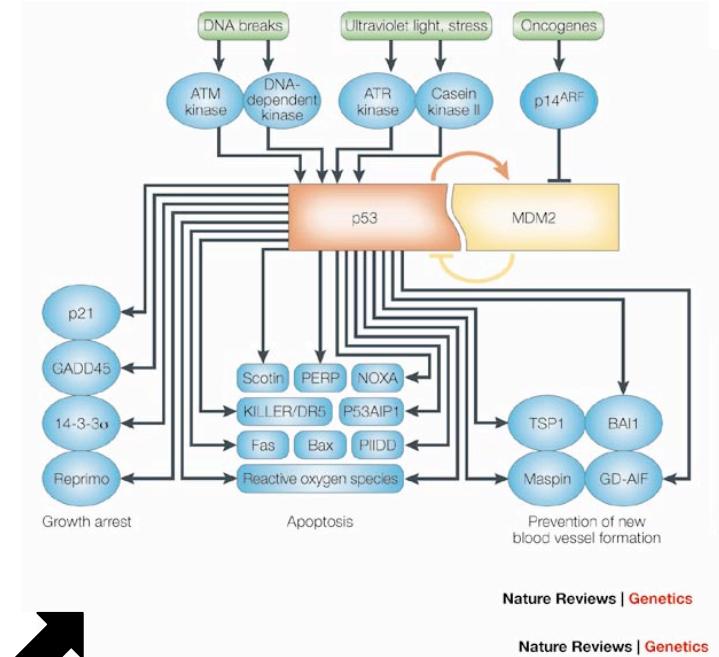
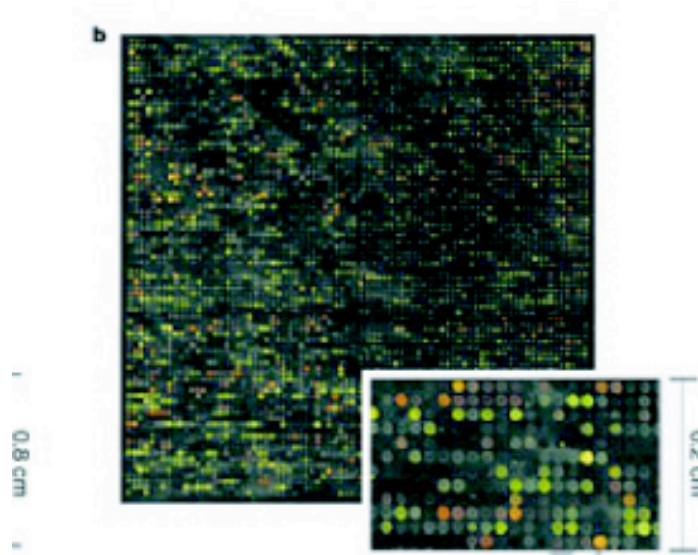


learning networks from biology



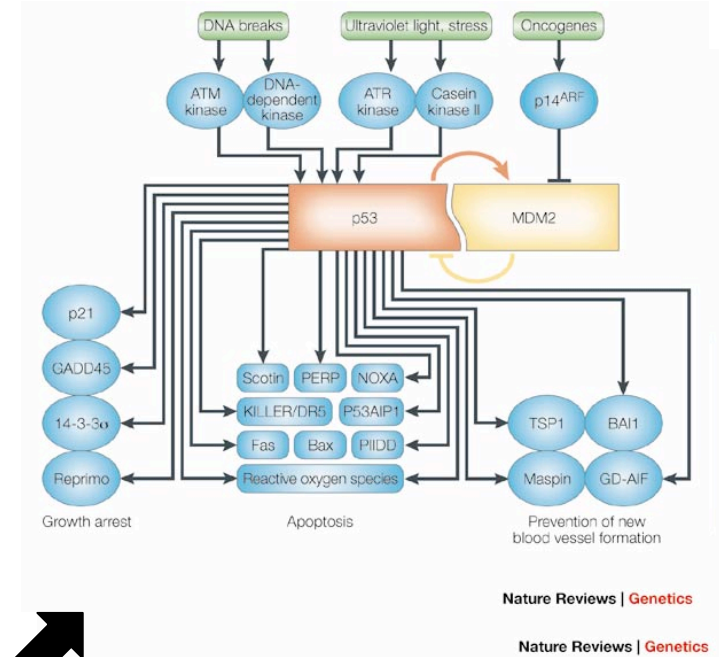
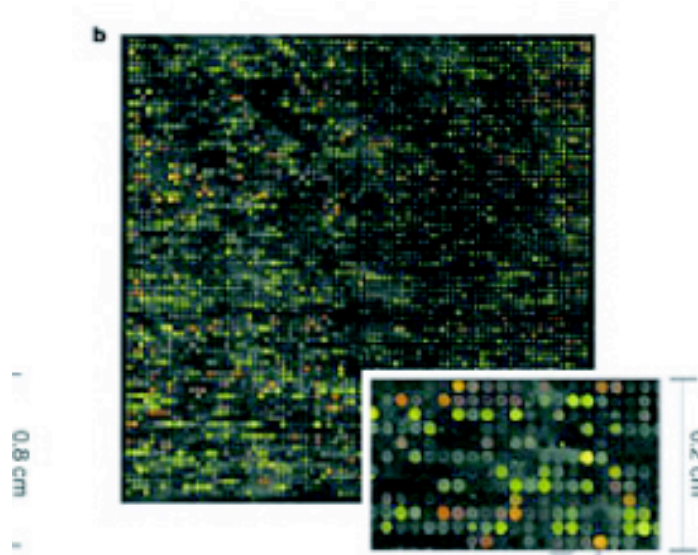
?

learning networks from biology



$$y = F_{\vartheta}(x)$$

learning networks from biology

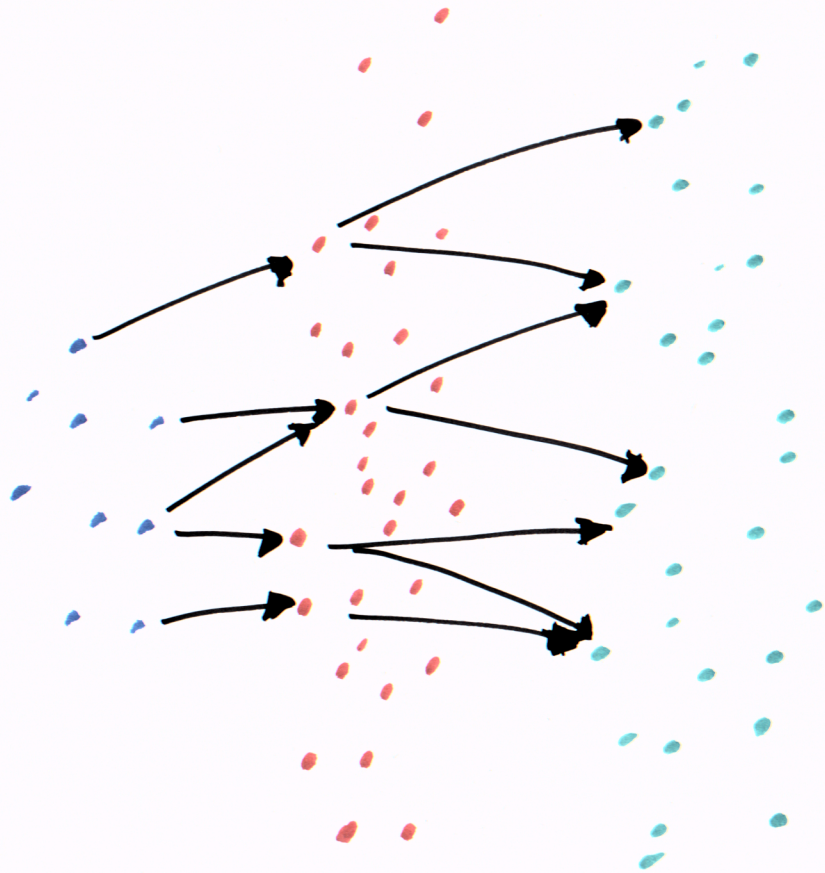


$$y = \sum_t \alpha_t \sigma_{\pi, \mu}$$

boosting: base on biological rules

parents - “motifs” - children

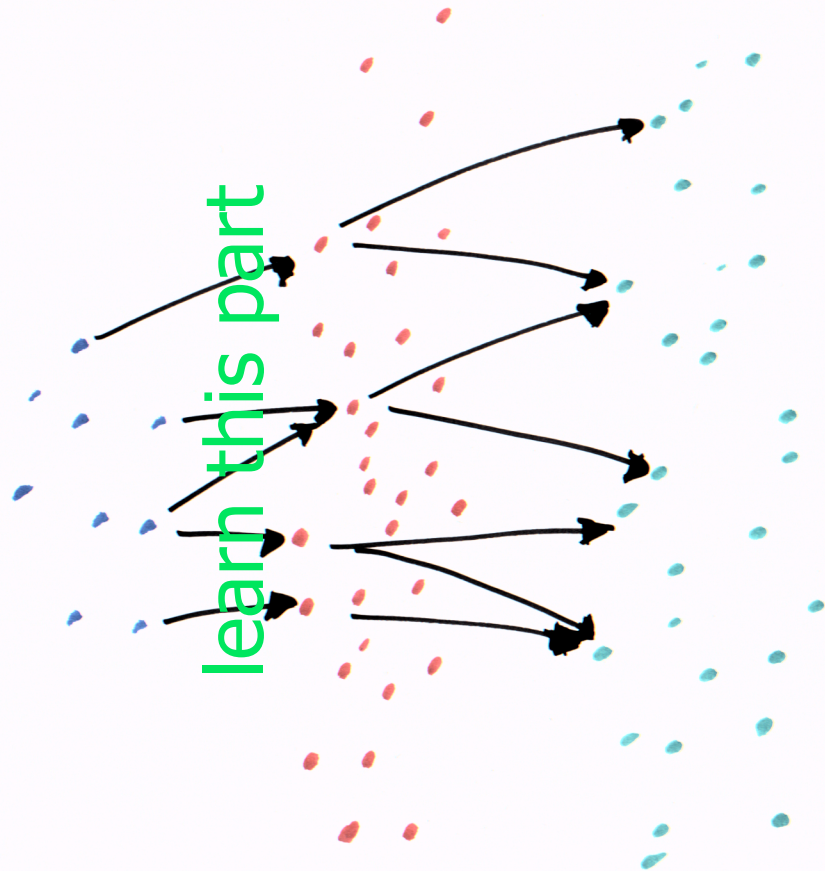
- 10M-dimensional feature space
- approx 100×6000 examples



boosting: add 1 edge at a time

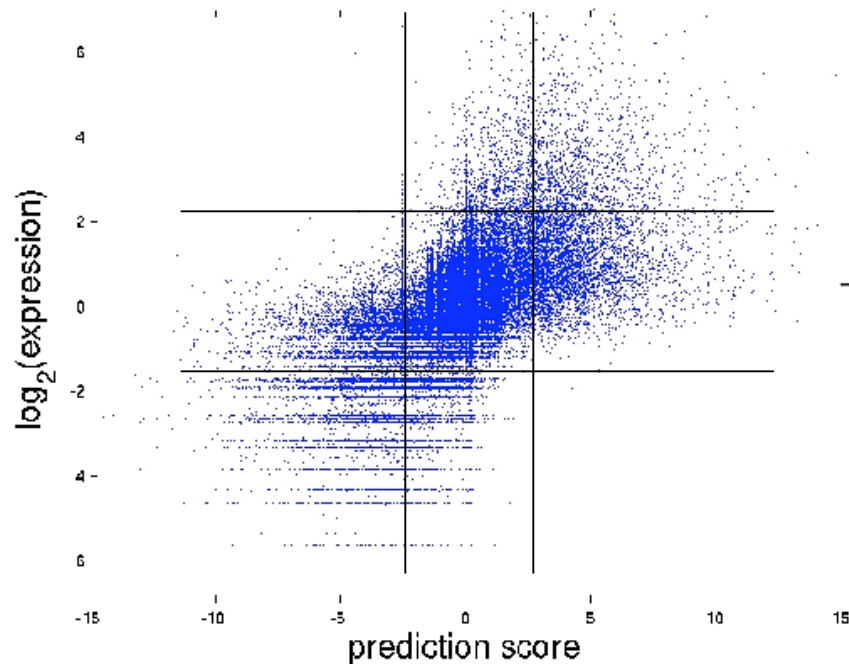
parents - “motifs” - children

- 10M-dimensional feature space
- approx 100×6000 examples



basic notions: fitting vs. overfitting

- “10-fold cross-validation” yields **test loss** of 13.6%



		Predicted Bins		
		Down	Baseline	Up
True Bins	Down	16.5%	8.9%	1.5%
	Baseline	9.3%	32.4%	6.3%
	Up	2.8%	9.9%	12.0%

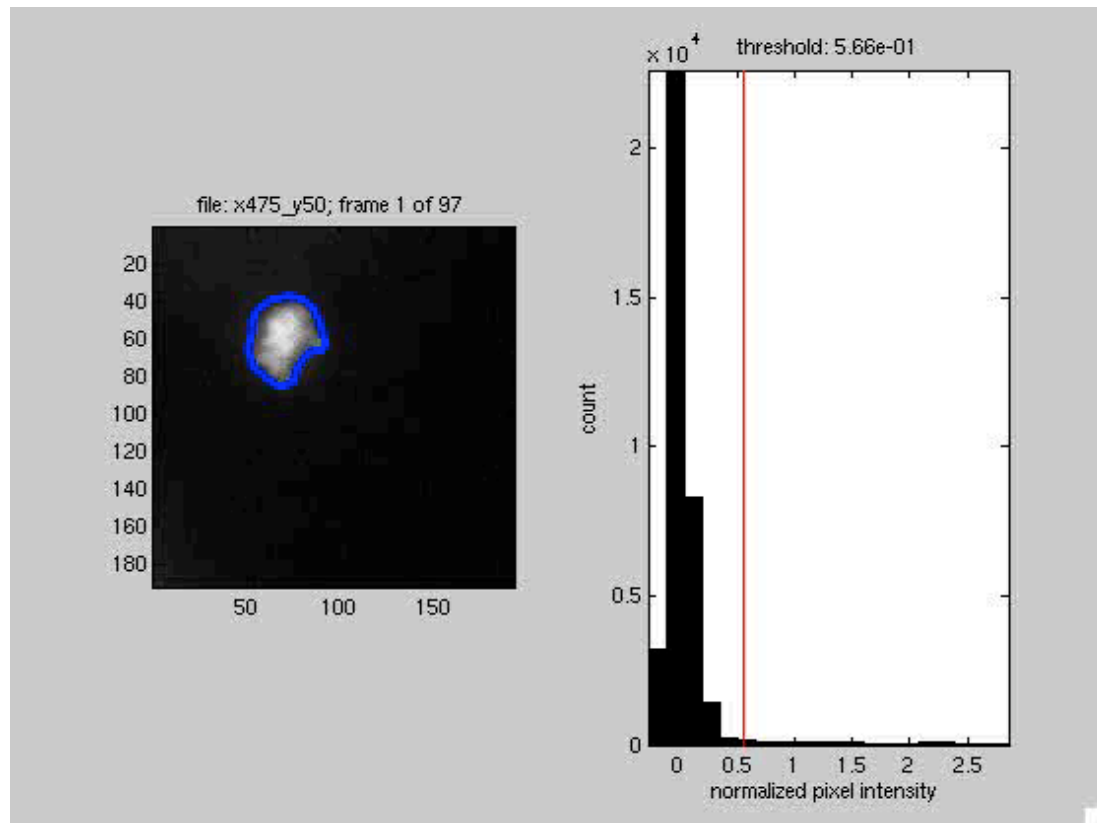
- Empirical estimate of **generalization** error
- not chi squared (not training data, and not normal)
- M. Middendorf, A. Kundaje, CW, Y. Freund and C. Leslie

outline:

1. context
2. problems
 - inference problem
 - **image problem**
 - inference problem w/images
3. call to arms

segmentation: PDEs, graph-cuts, or...

$$p(D) = \sum_z p(D|z)p(z)$$

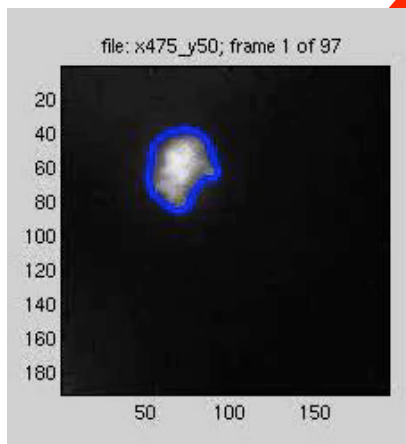


movie: tasha sims, [dustin](#) lab; harry xenias+ben dubin-thaler, [sheetz](#) lab

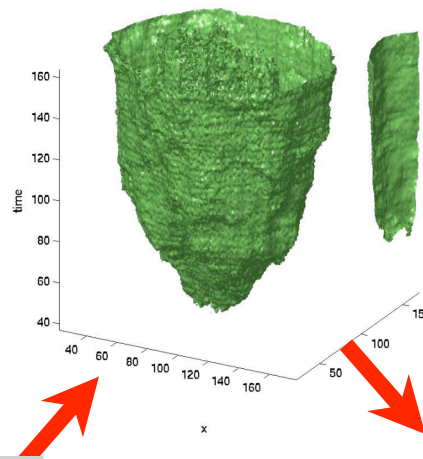
noVel: jake hofman

automated, statistical, “high-throughput” (whole movies) quantitative motility assays

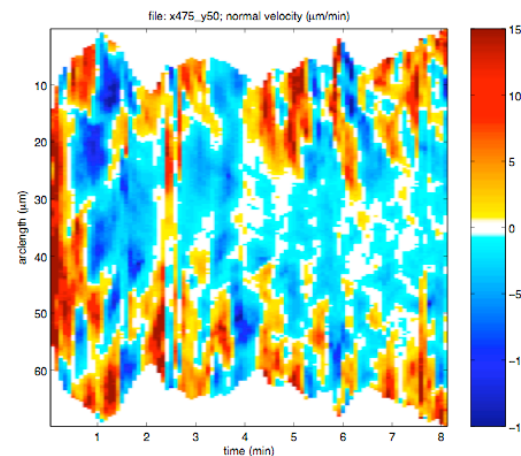
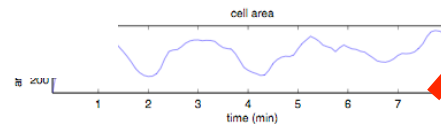
1. identify cell edge
(statistical
segmentation)



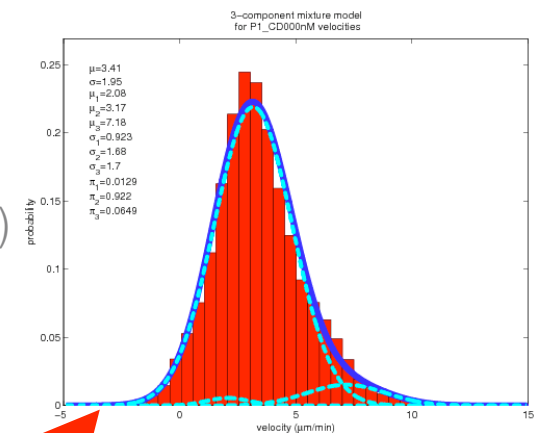
2. evaluate normal
velocity
(optical flow)



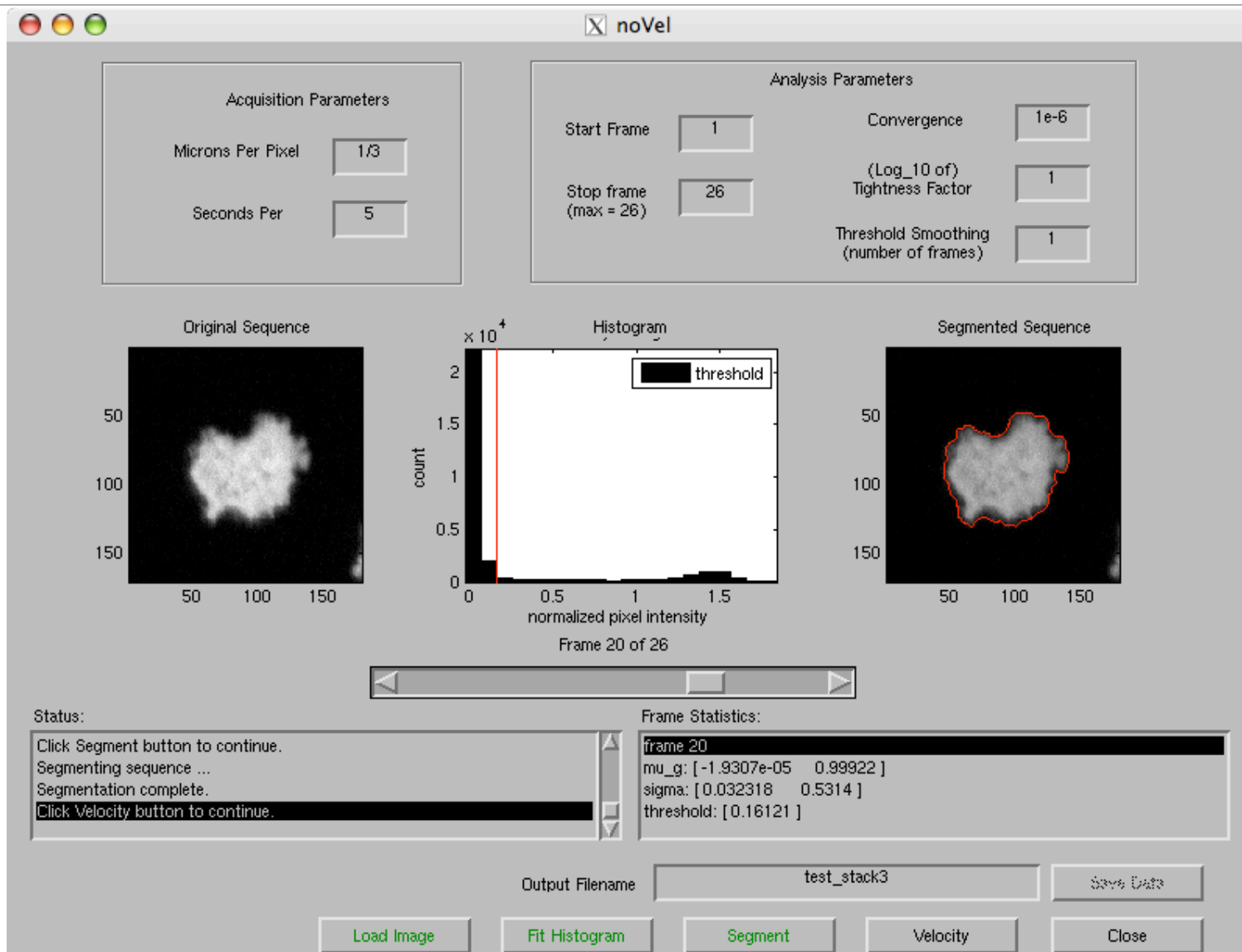
3. map onto surface
(differential geometry)



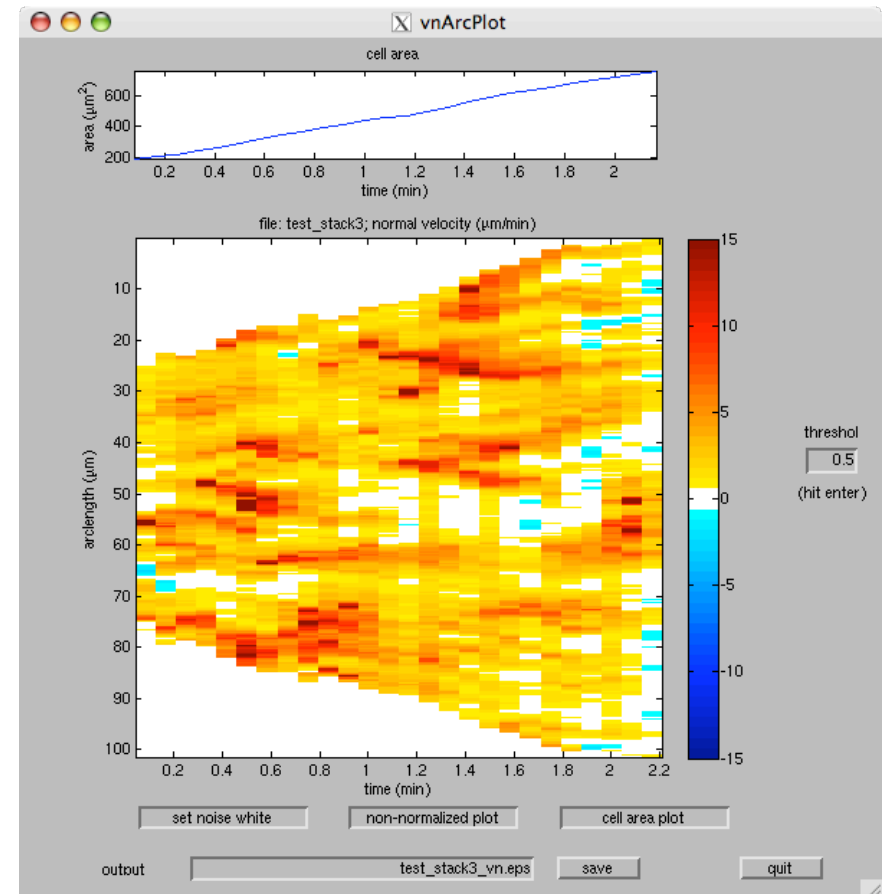
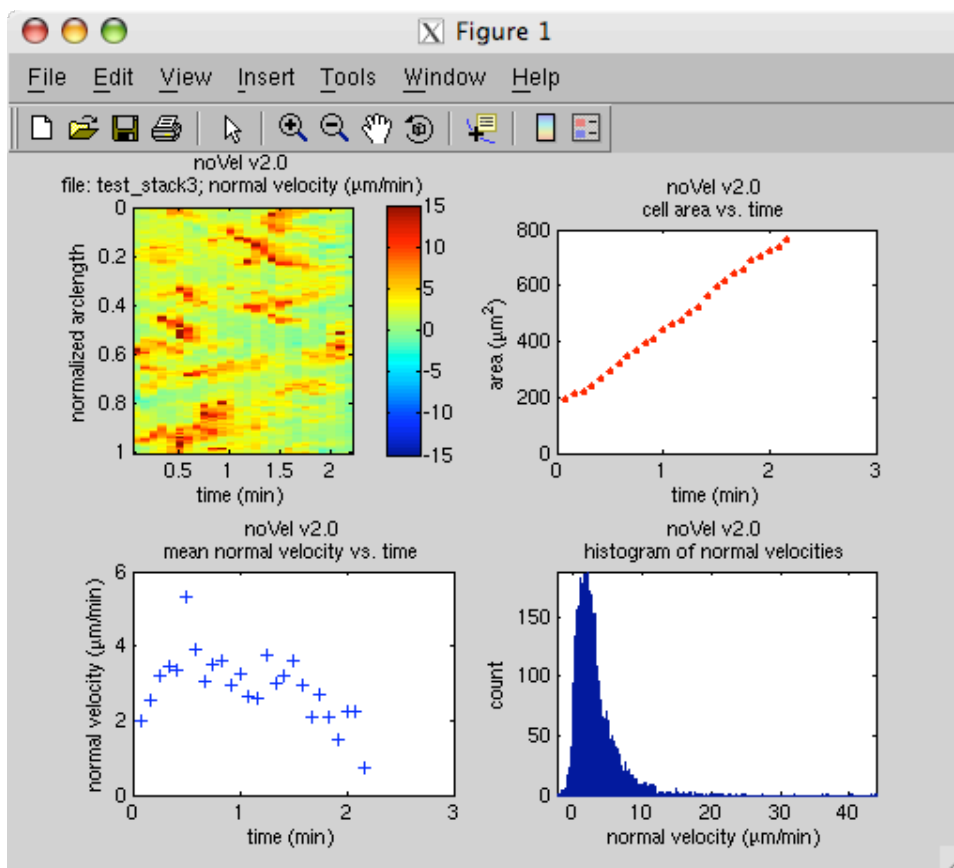
4. analyze velocity
statistics
(mixture modeling)



noVel: software interface



noVel: software interface (cont'd)



outline:

1. context

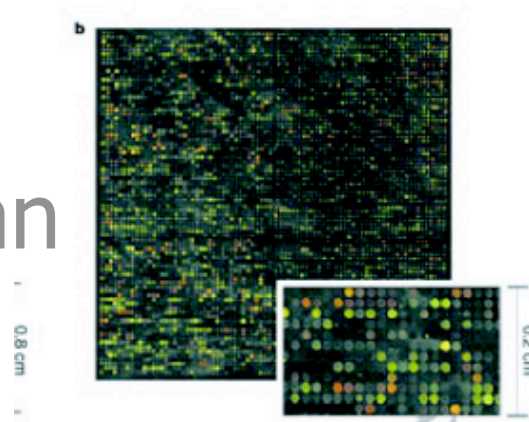
2. problems

- inference problem
- image problem
- **inference problem w/images**

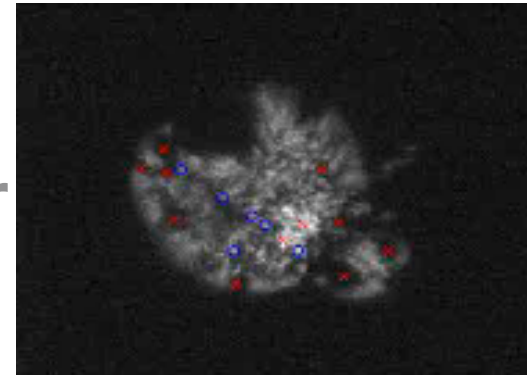
3. call to arms

inference + images

what can

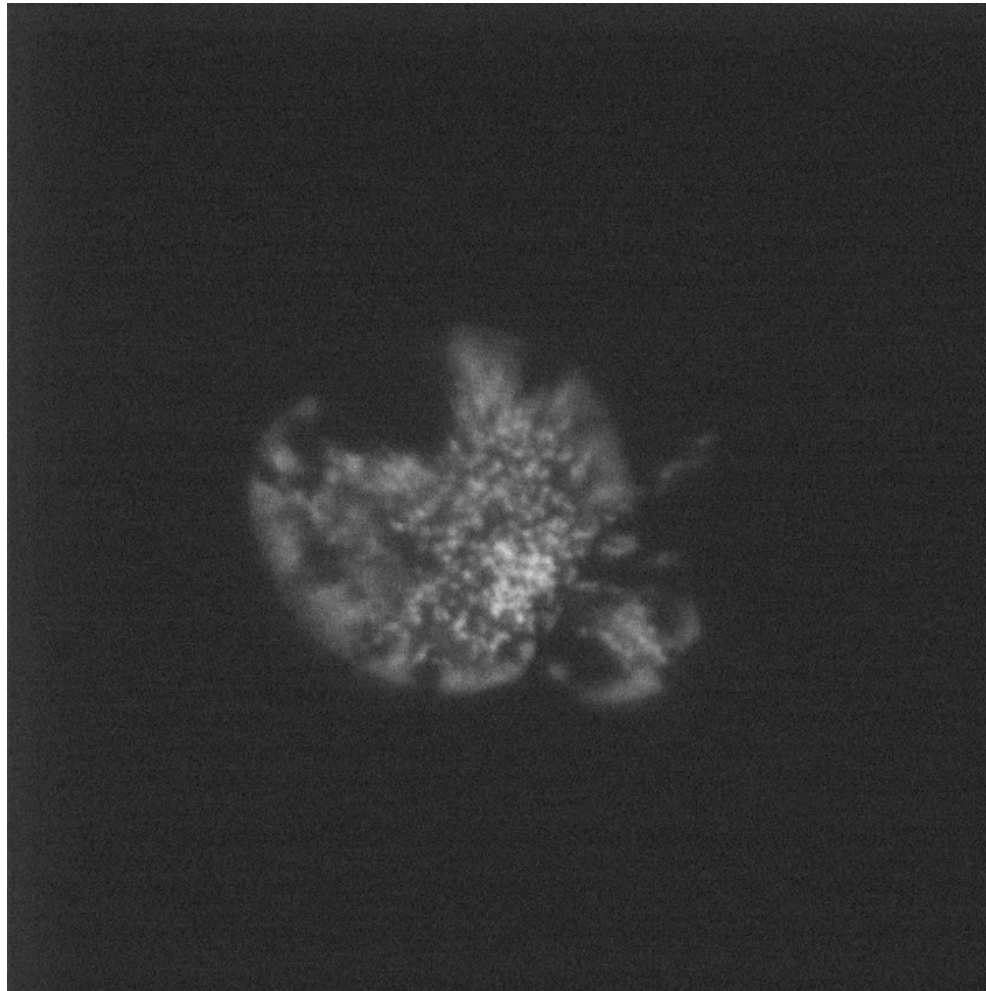


do for

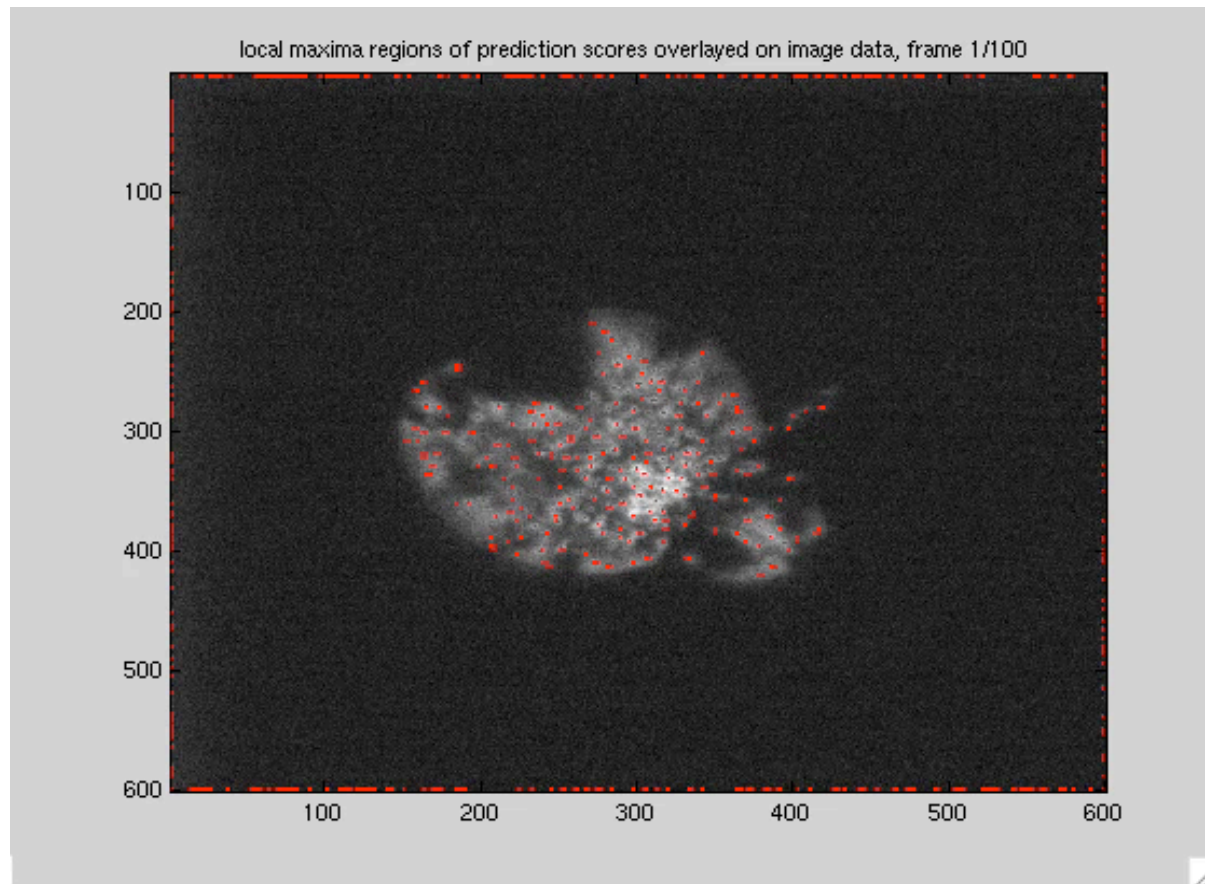


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foci detection: modern machine learning+microscopy

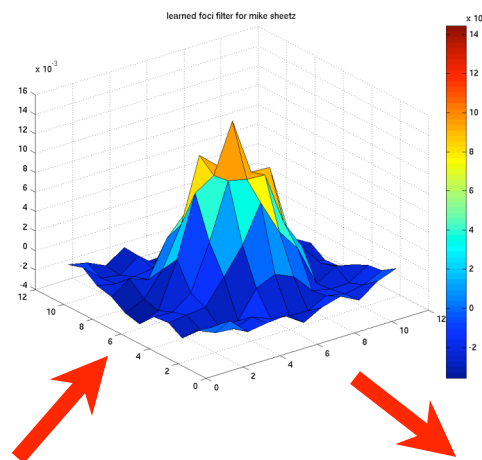
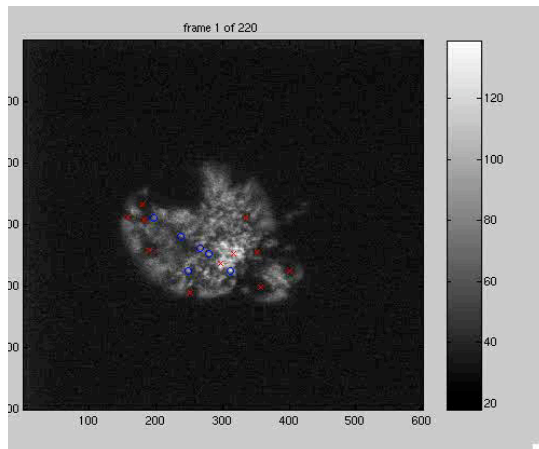


foci detection: modern machine learning+microscopy

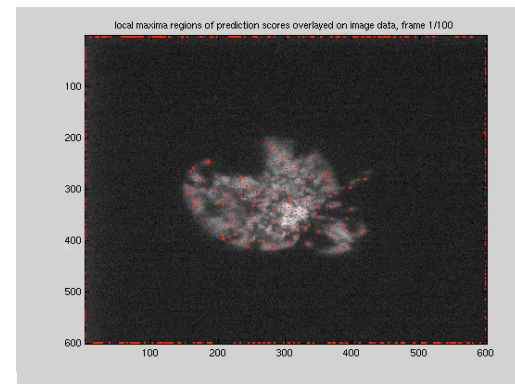


foci detection: simulate biologists, not biology

1. label images
(HCI)

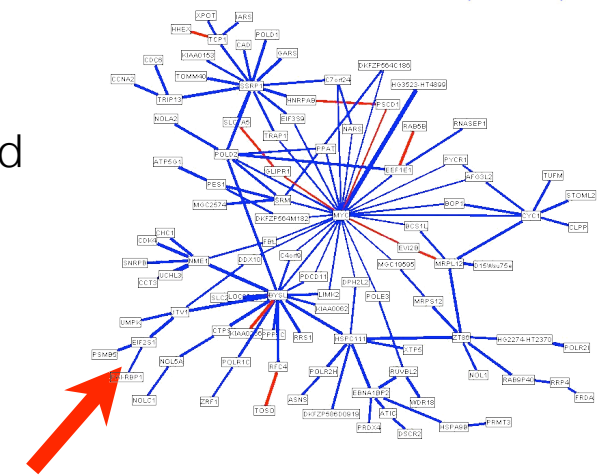


2. learn detector
(SVMs)



3. correlate with
disease states and
phenotypic
features
(biology)

$$\begin{aligned}\partial_t u &= D_u \nabla^2 u + f(u, v) \\ \partial_t v &= D_v \nabla^2 v + g(u, v)\end{aligned}$$



4. develop network
+ dynamical models
(applied math)

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- inference problem w/images

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more info

- inference/reverse engineering
 - ISMB 2004
 - RECOMB 2005
 - open source: www.cs.columbia.edu/compbio/
- bioimage data
 - Cell 2007
 - Biophysical Journal 2007
 - PRL 2006
 - Biophysical Journal 2006
 - Journal of Cell Science 2006
 - open source: cellmap.sourceforge.net
- chris.wiggins@columbia.edu