### Natural numbers



Mukund Thattai, NCBS/TIFR ICTS Discussion Meeting Dec 2011

### Life on earth is built from cells

Tissues, organs, animals and plants are interacting aggregates of cells







### Cells grow and divide to make new cells...



... mirroring the replication of genetic material

# Since the origin of life, genetic material has been freely flowing between cells





... leaving the genetic code unchanged for billions of years

Genes are 'particles' that underlie the heritability of phenotypes







## We now know that genes are embodied as DNA sequences

We can think of them as single nucleotides....

ATTGATTCTAGTTAACCGCTGATCGTGGCTAGTGCATTGATCGTGGCTAGTGCATATT <mark>G</mark> ATTCTAGTTAACCGCTGATCGTTGATCGT	GCTAGTATTGATTCTAGTTAACCGCTGATC

... or as long sequence stretches

They are discrete, replicated, vertically inherited, horizontally exchanged, and subject to mutation

They can 'code for' proteins and RNA

They can 'regulate' when and where proteins and RNA are produced

They can regulate the 3D structure of chromosomes

...

### Biological variability: a map from protein numbers to phenotypes

Variability is a fundamental property of living matter at molecular scales...





All life is made of cells Cells are small Small means noisy ... but macroscopic outcomes are precise

### Protein and mRNA distributions show $\sqrt{n}$ scaling



D Thattai & van Oudenaarden, PNAS, 2001; Ozbudak et al., Nature Genet., 2002

#### Noise can flip a bistable switch



### Single cells can 'use' noise to hedge bets



Cells switch between two states, each optimized to a different environment

Thattai & van Oudenaarden, Genetics, 2004; Acar, Mettetal & van Oudenaarden, Nature Genet., 2008; Kussell et al., 2005

### Controlling 'noise'



### Molecular computation





Open problems:

- fundamental theoretical limits on molecular control
- information processing by small numbers of molecules
- phenomenological theories of variability in complex systems

## Development: A map from DNA elements to macroscopic features of animals



### Animal development is an initial value problem

The genome defines the space of outcomes as a function of initial conditions



Existing cells interact with the environment to establish the initial conditions

Small web page Figure 1



Figure 1: RNA expression patterns of selected genes in anterior posterior patterning. AnterGenesies expressed tet of the timepoint turn on or off genes at subsequent timepoints, to form stripes

### Modular organization of the eve regulatory region



Alberts et al., Molecular Biology of the Cell

### Like stripes, digits develop idiosyncratically



Alligator limb

<sup>I</sup> Wagner & Gauthier, PNAS, 1999

### Digit development is regulated by morphogens



Chick limb



<sup>[]</sup> Tickle, Nat Rev Mol Cell Biol, 2006

### Each digit has a unique driver



Initial conditions

output: bone development

So that's where '5' comes from. Why is this interesting to a theorist?

### A remarkable map from DNA to body plans



This *hox* gene cluster map might arise purely from evolutionary forces

Swalla, Heredity, 2006

### Gene order in a bacterial evolution model



Genes, proteins, polyketide products



Two types of catalytic domains; Polyketide products are binary strings



Competition, selection, and rampant gene swapping leads to gene ordering

Co-linear systems are more 'evolvable'

Callahan et al., PNAS, 2010

### Population genetics: a map from mutations to populations



Nothing in biology makes sense except in light of evolution [Dobzhansky] And nothing in evolution makes sense except in light of population genetics [Lynch]

Khatri et al., PNAS, 2009

## Real population genetics are rich in phenomena, but poorly understood



Open problems:

- populations in which multiple mutations coexist
- genomes with multiple mutations
- interactions between individuals
- analysis of experimental data

