

# CS 68: BIOINFORMATICS

Prof. Sara Mathieson  
Swarthmore College  
Spring 2018



# Outline: May 4

- Groups 5&6 from last time
- Disease biology beyond GWAS
- Secondary structure prediction

## Notes:

- Final presentation guidelines posted
- Let me know if you would like to meet today or next week
- Evaluations will be online
- If I get 100% response rate before the presentations, I will bring snacks

# Project Presentation Notes

- Date: **Thursday, May 17, 2-5pm** (in our classroom)
- Each person will have **4 minutes to present** (including questions, so aim for around 3:30)
- Email me your slides by **1pm on May 17!** (PowerPoint or PDF okay)
- I will have a laser pointer / slide advancer clicker

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[Your presentation should include](#)

- Motivation and Scientific Question
- Data and Methods
- Results and Interpretation
- Conclusions and Future Work

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- Avoid text-heavy slides, use images/diagrams
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## [Submit by 10pm on May 17](#)

- Lab Notebook (include references)
- All project code
- Presentation slides

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Think about  
reproducibility!

Groups 5&6 from last time...

## ■ **Biological Modeling**

- *Drug entering the body*
- *Tissue and surgical modeling*
- *Gene networks*
- *Intersects with computer vision, computer graphics, and graph theory*

## ■ **Secondary and Tertiary Structure**

- RNA secondary structure prediction
- Protein folding

## ■ **Neuroscience**

- *Modeling the brain*

## ■ **Disease biology**

- *Pedigree analysis*
- *Infectious disease models*
- *Cancer biology*

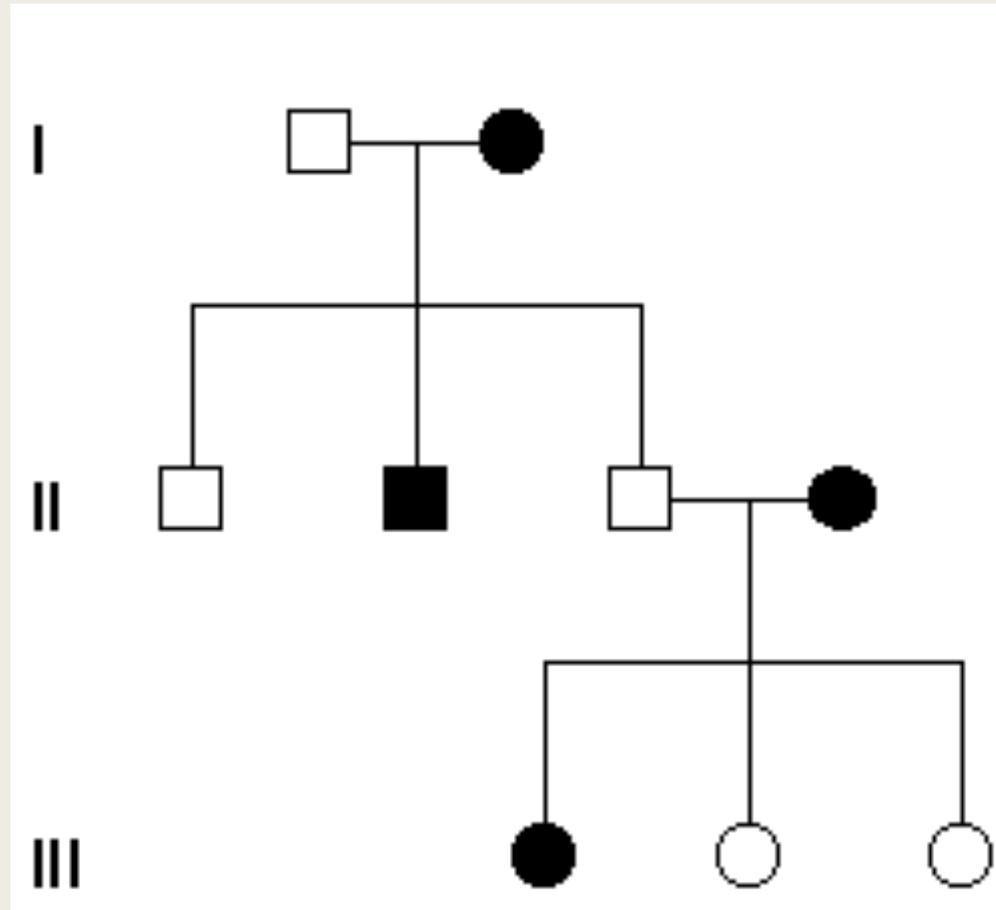
Other areas of  
Computational Biology

# Computational disease biology beyond GWAS

# Pedigree Analysis

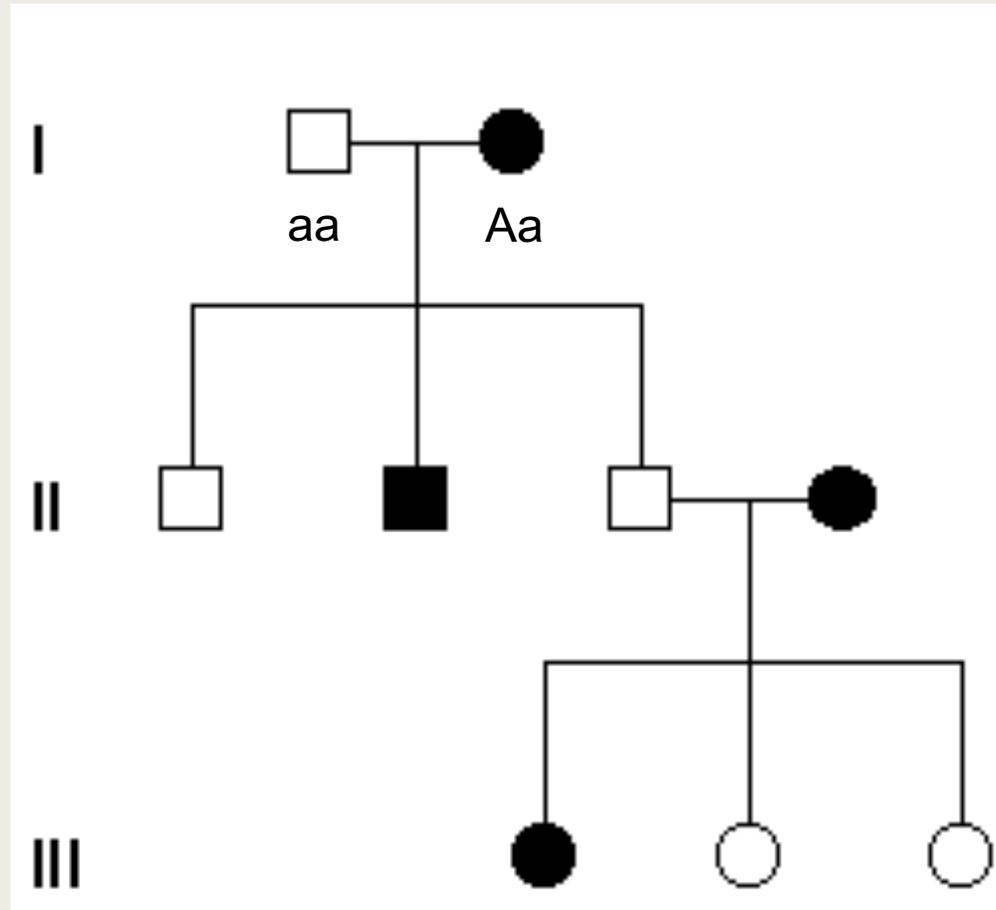
# Beyond GWAS: pedigree analysis

## Dominant



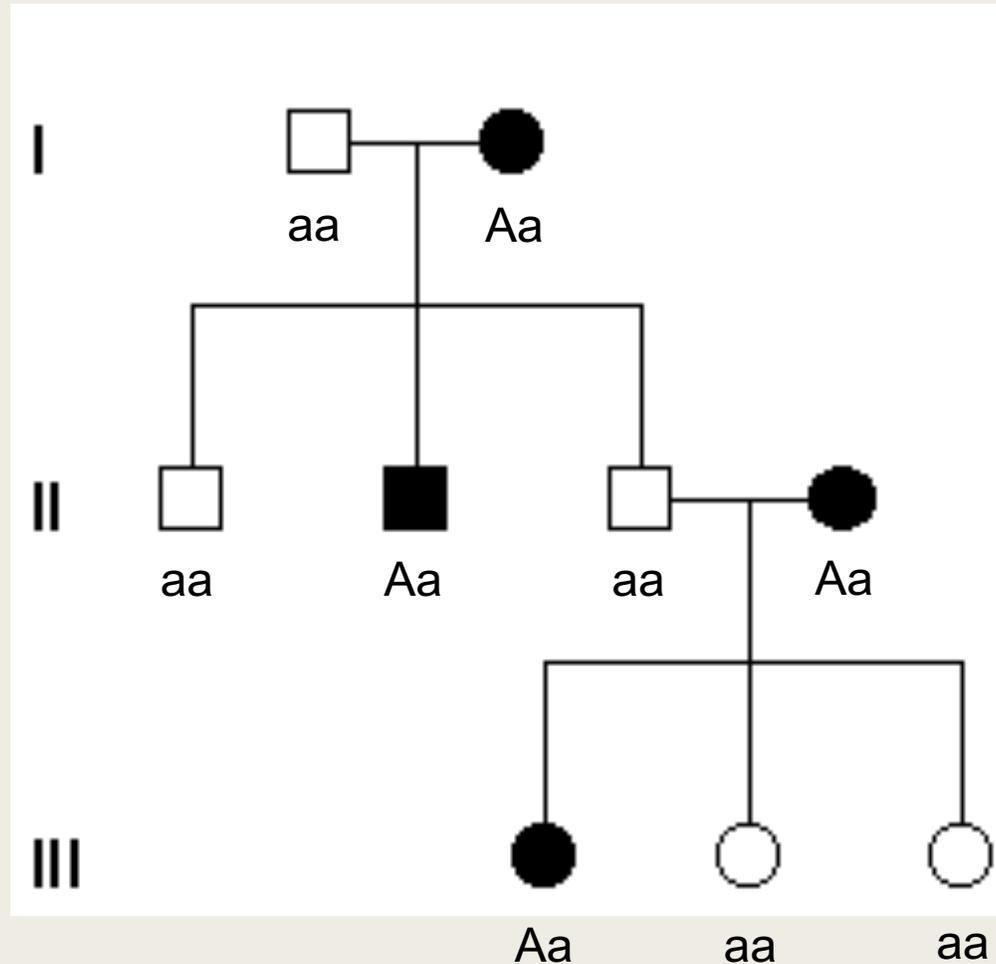
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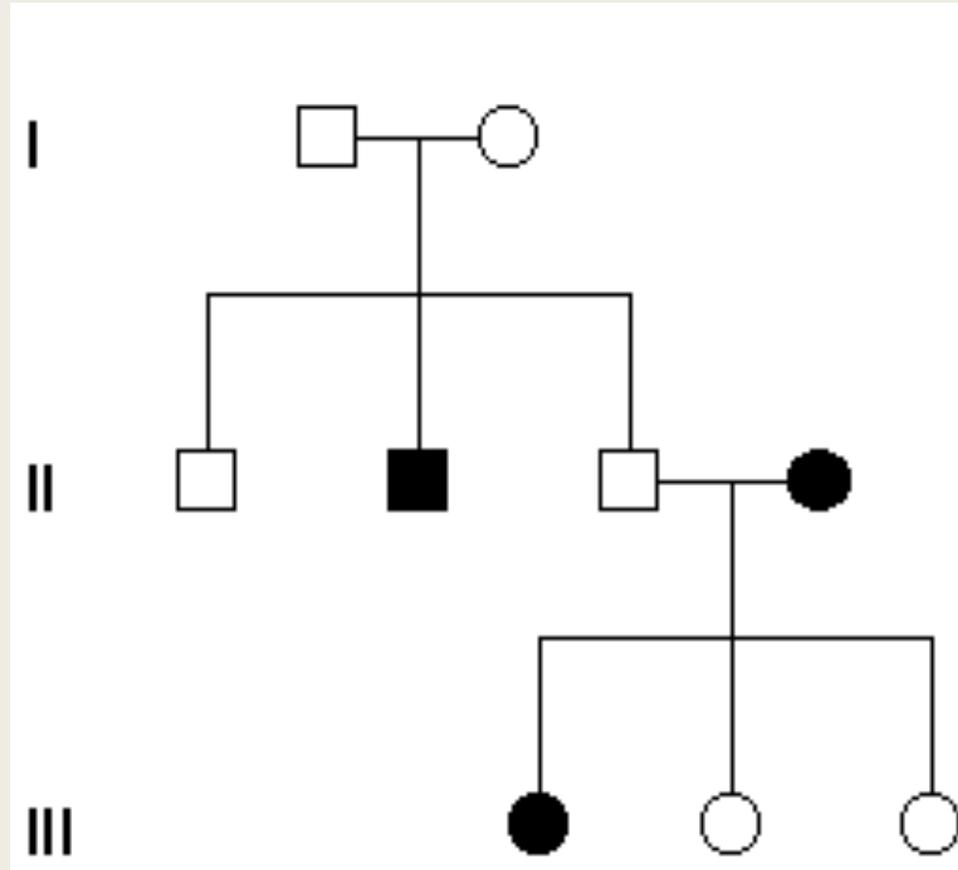
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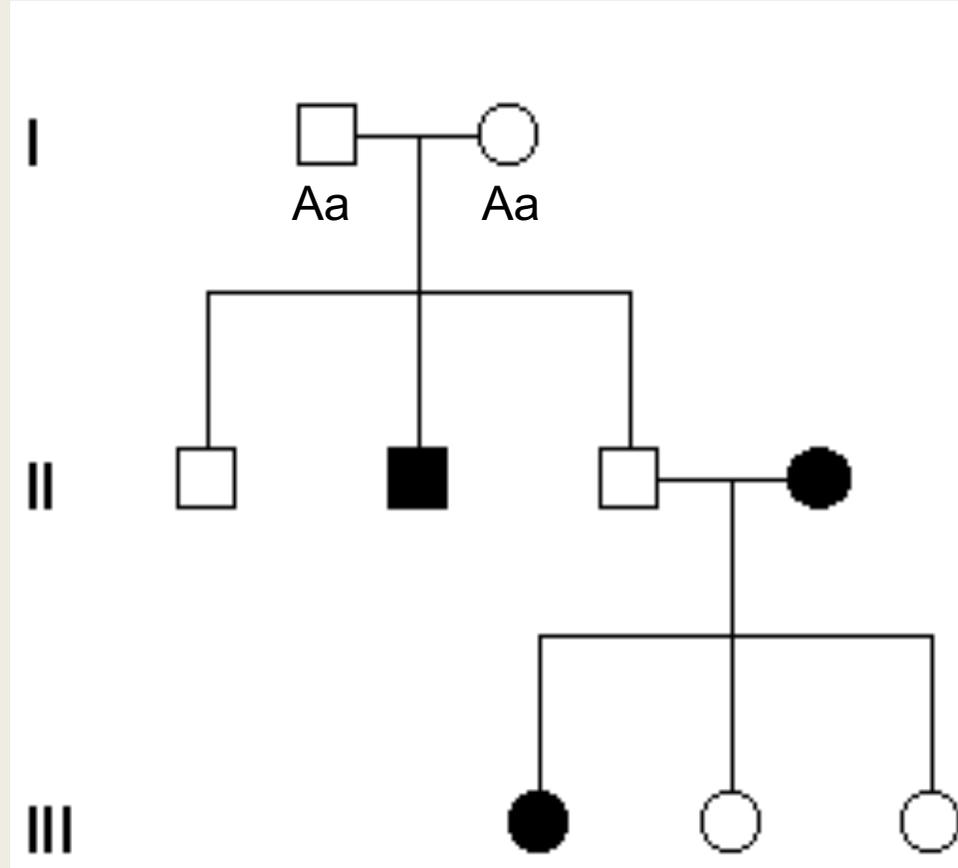
# Beyond GWAS: pedigree analysis

## Recessive



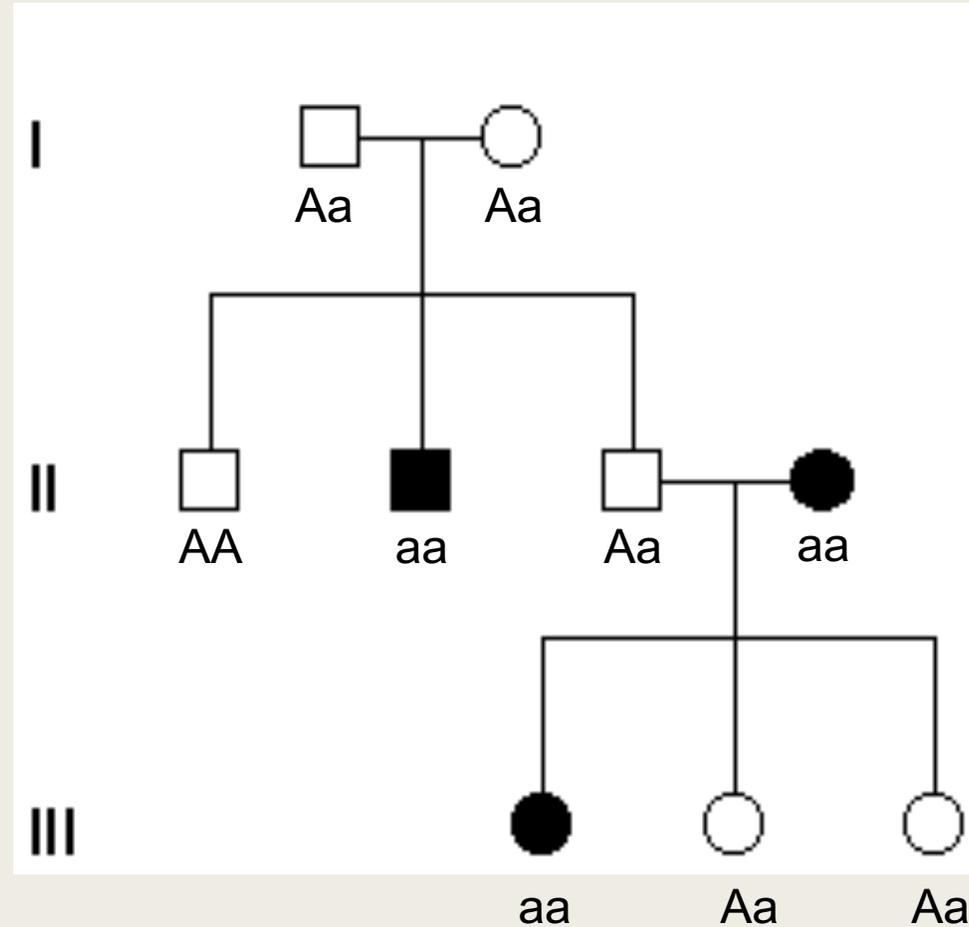
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## Recessive

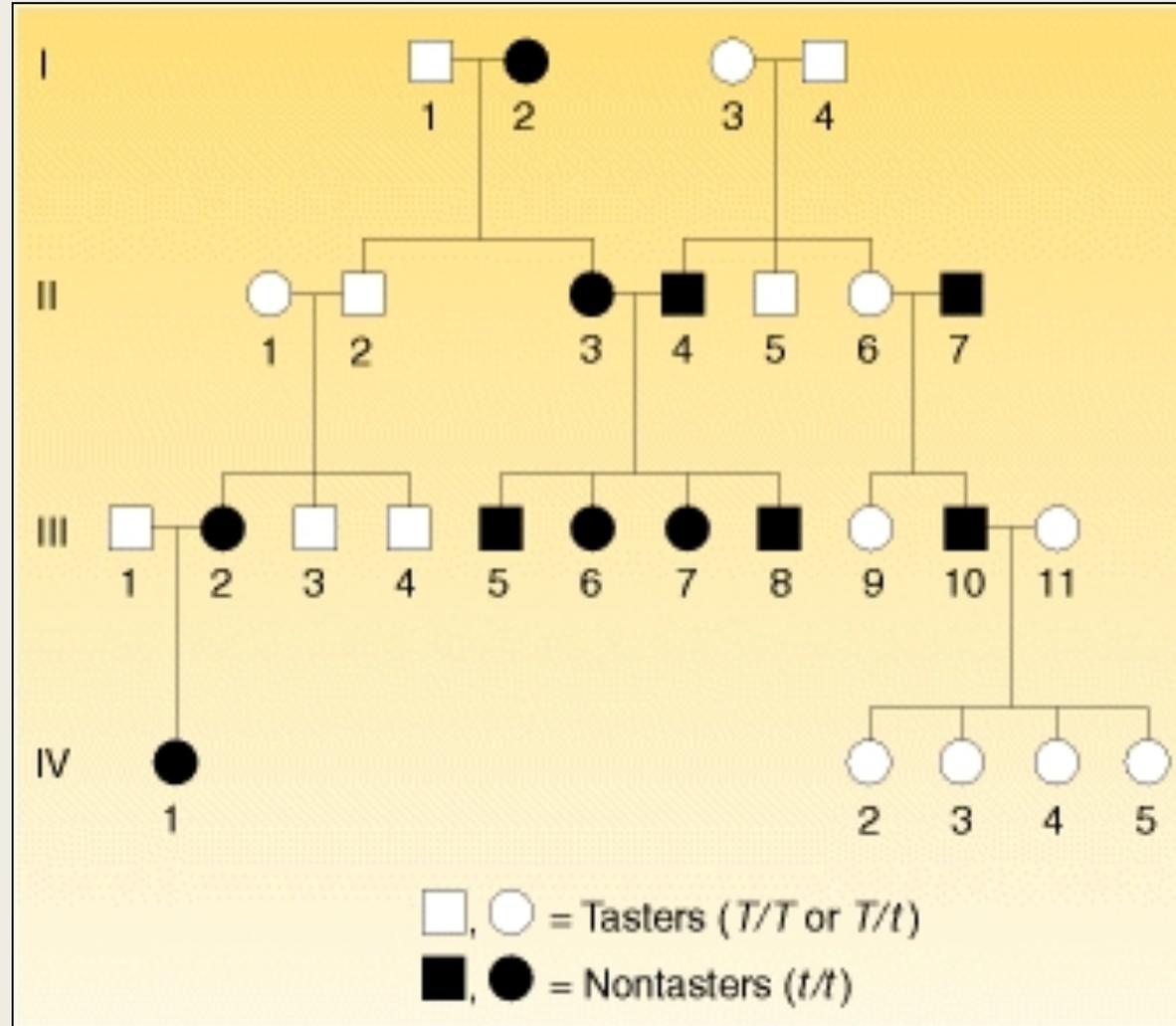


# Beyond GWAS: pedigree analysis

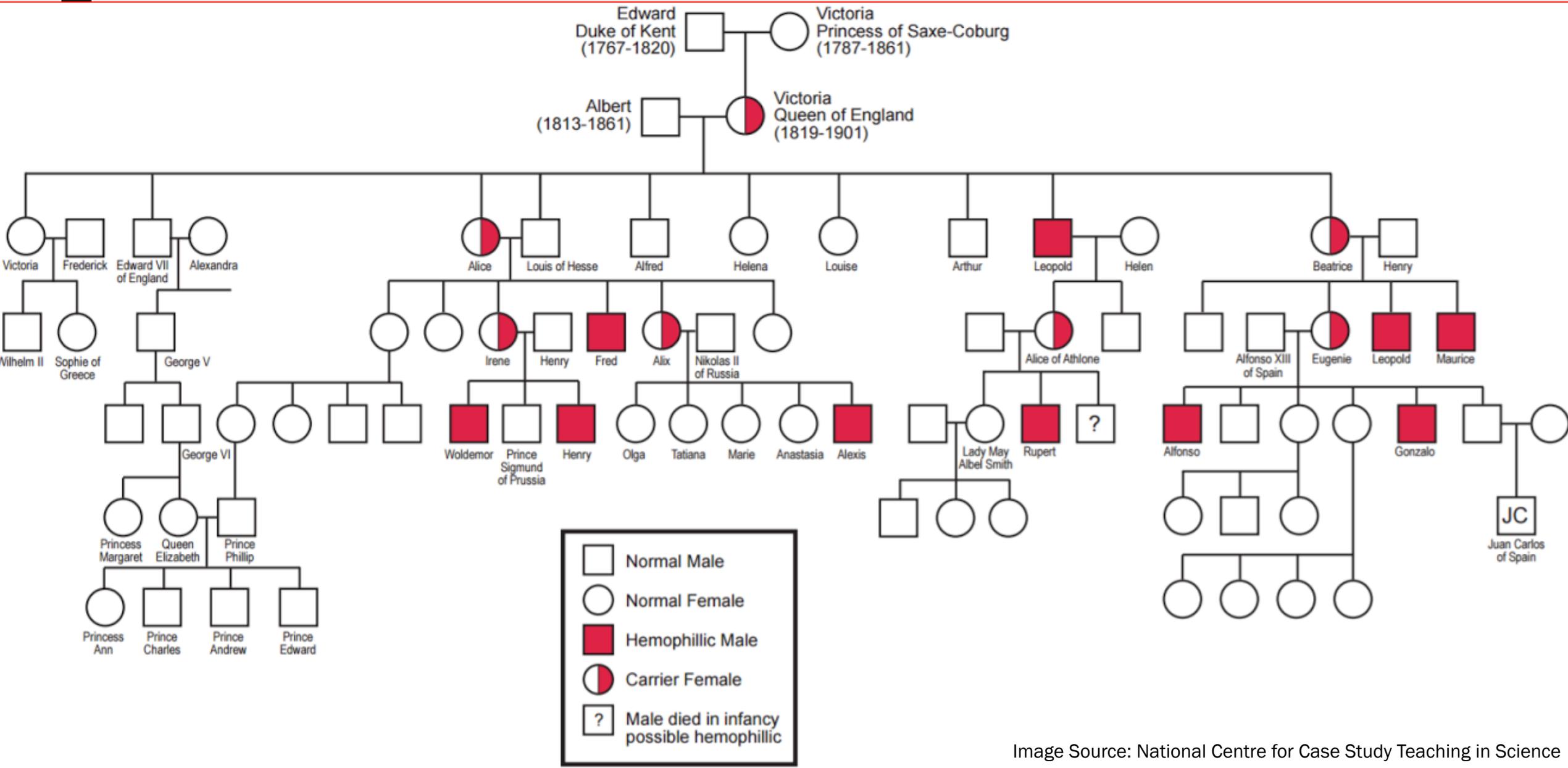
## Recessive



# Ability to taste the chemical PTC



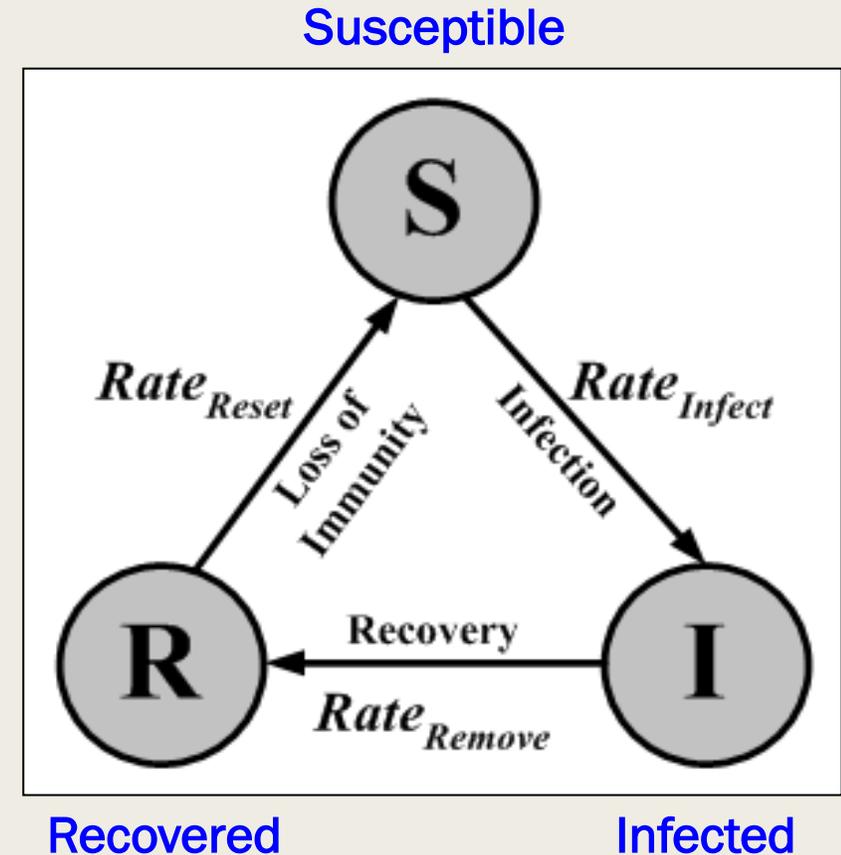
# Hemophilia in the Royal Family – X linked



# Infectious disease modeling

# SIR models for infectious disease

- Recent applications:
  - *H1N1*, “swine flu”, 2009
  - *Ebola*, 2015



“Influence of Local Information on Social Simulations in Small-World Network Models” (2005)

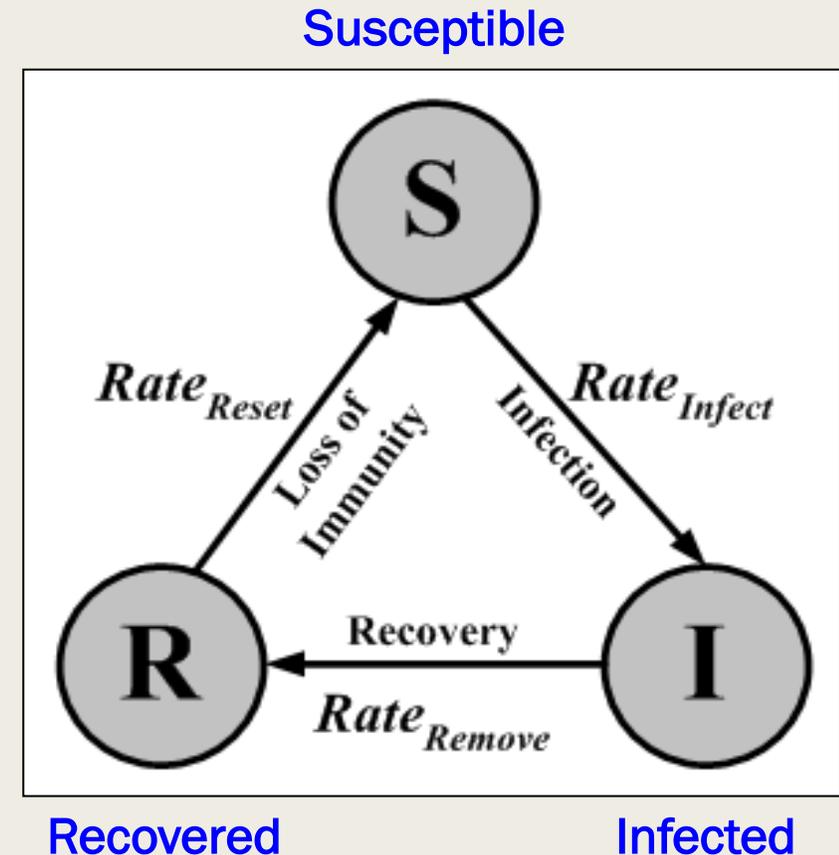
# SIR models for infectious disease

- Recent applications:

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- Ebola, 2015

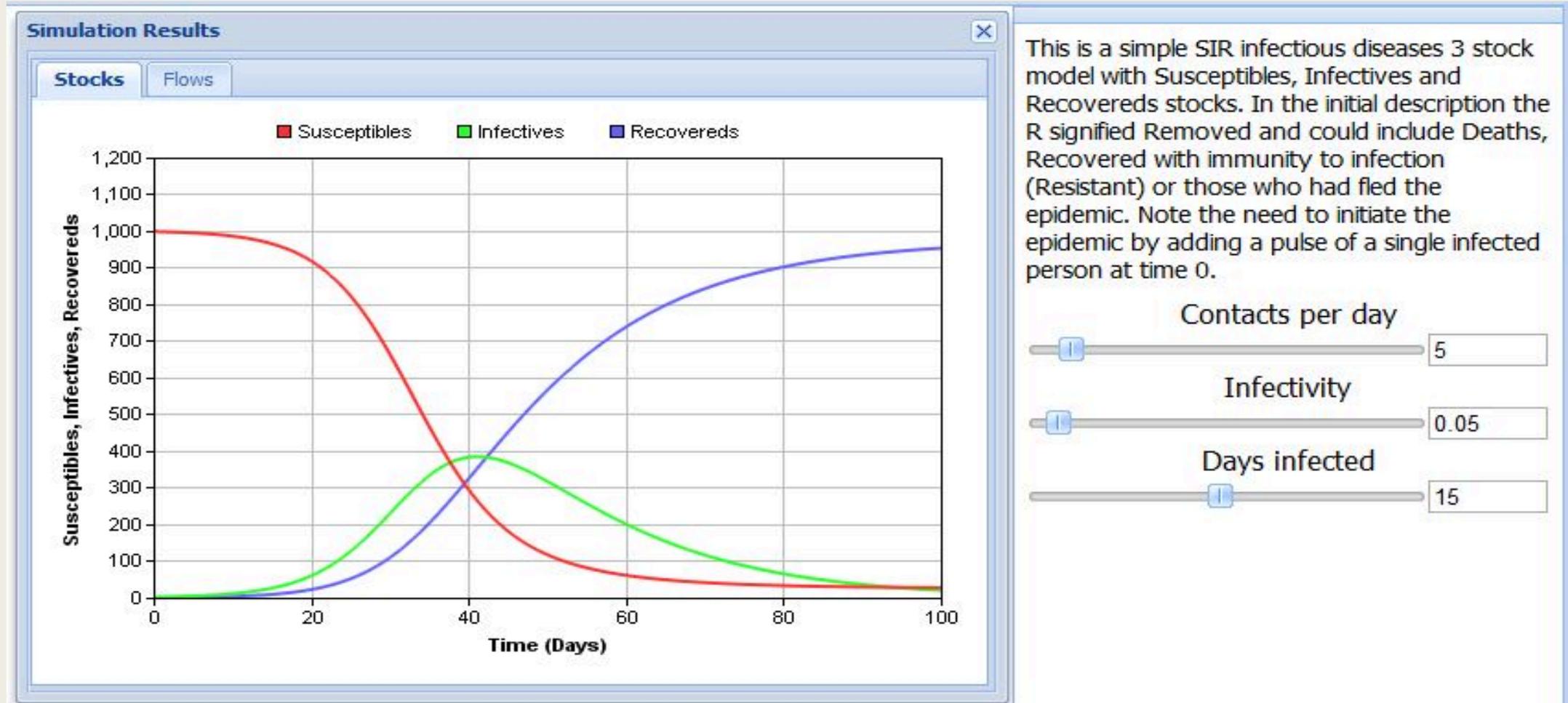
$$\frac{dS}{dt} = -\frac{\beta IS}{N},$$
$$\frac{dI}{dt} = \frac{\beta IS}{N} - \gamma I,$$
$$\frac{dR}{dt} = \gamma I.$$

Modeled through differential equations



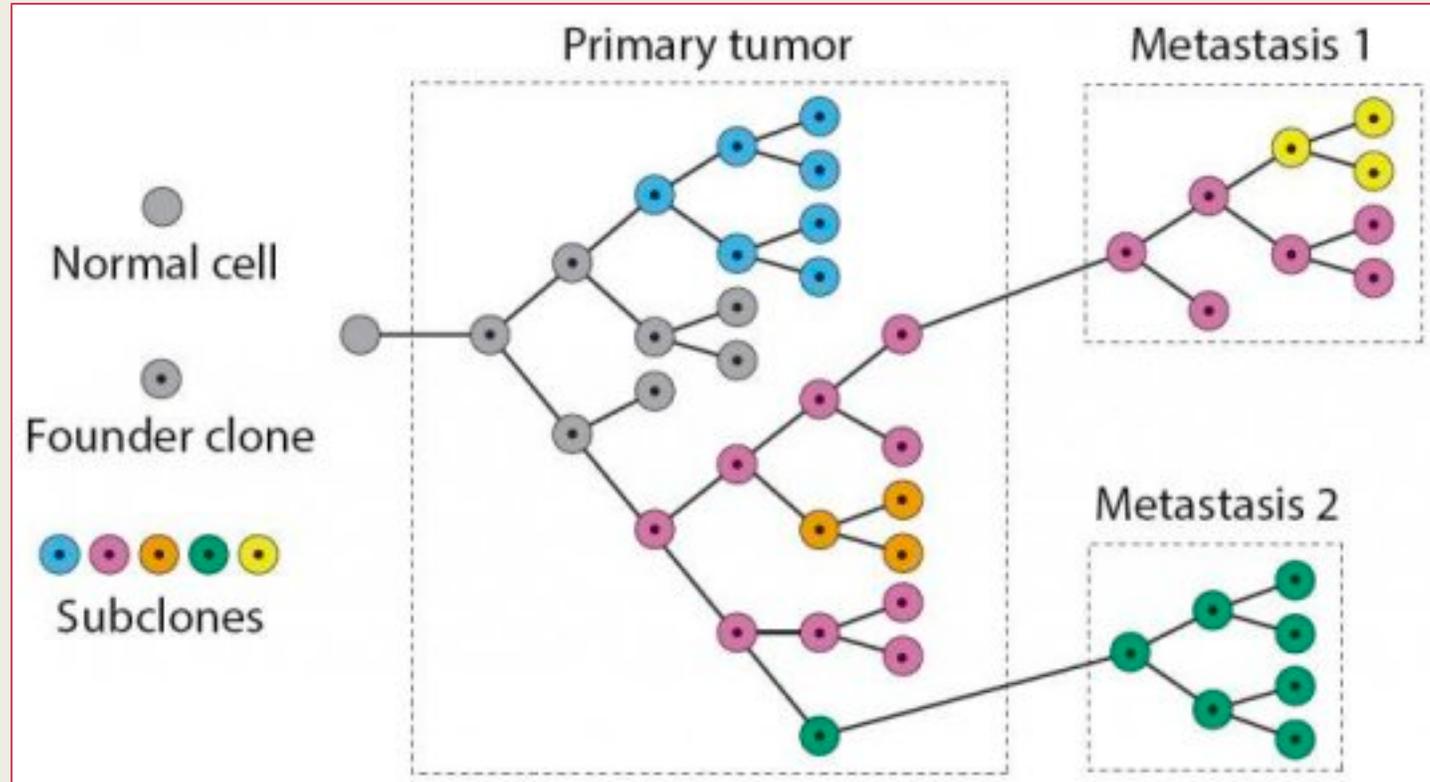
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# SIR models for infectious disease



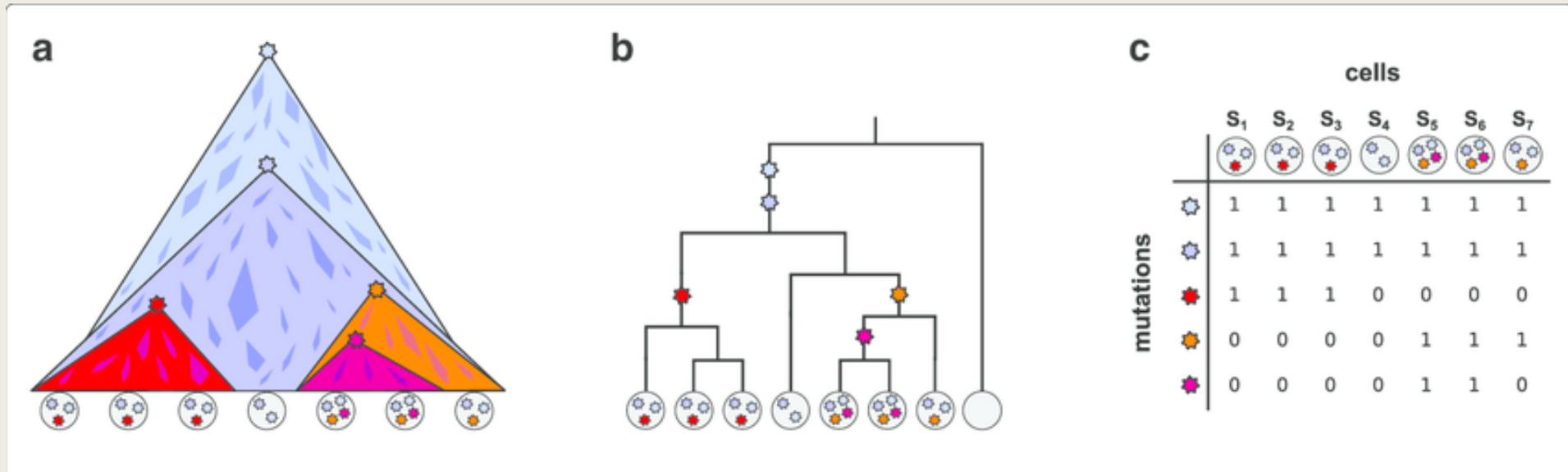
# Cancer biology

# Evolution of a cancerous tumor



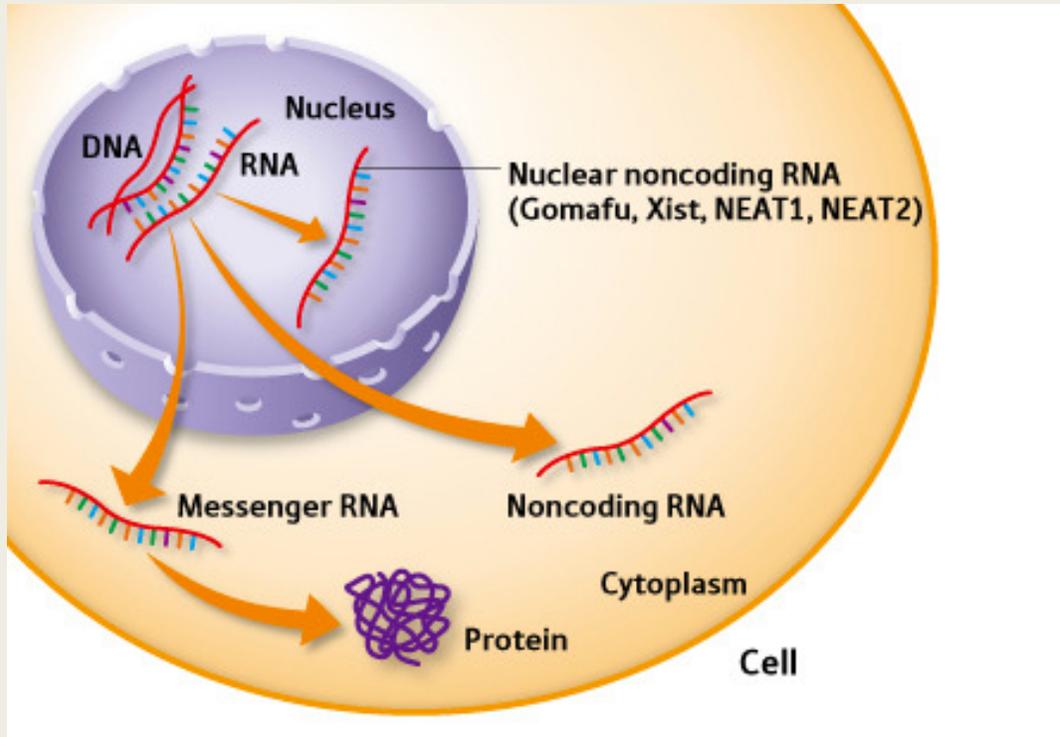
# Phylogenetic analysis of cancer cells

- Cancerous tumors often contain many different types of cells
- Once one mutation happens that causes the initial issue, mutations accumulate
- We can try to reconstruct the “ancestral” state to figure out what first went wrong



Beyond a linear sequence...

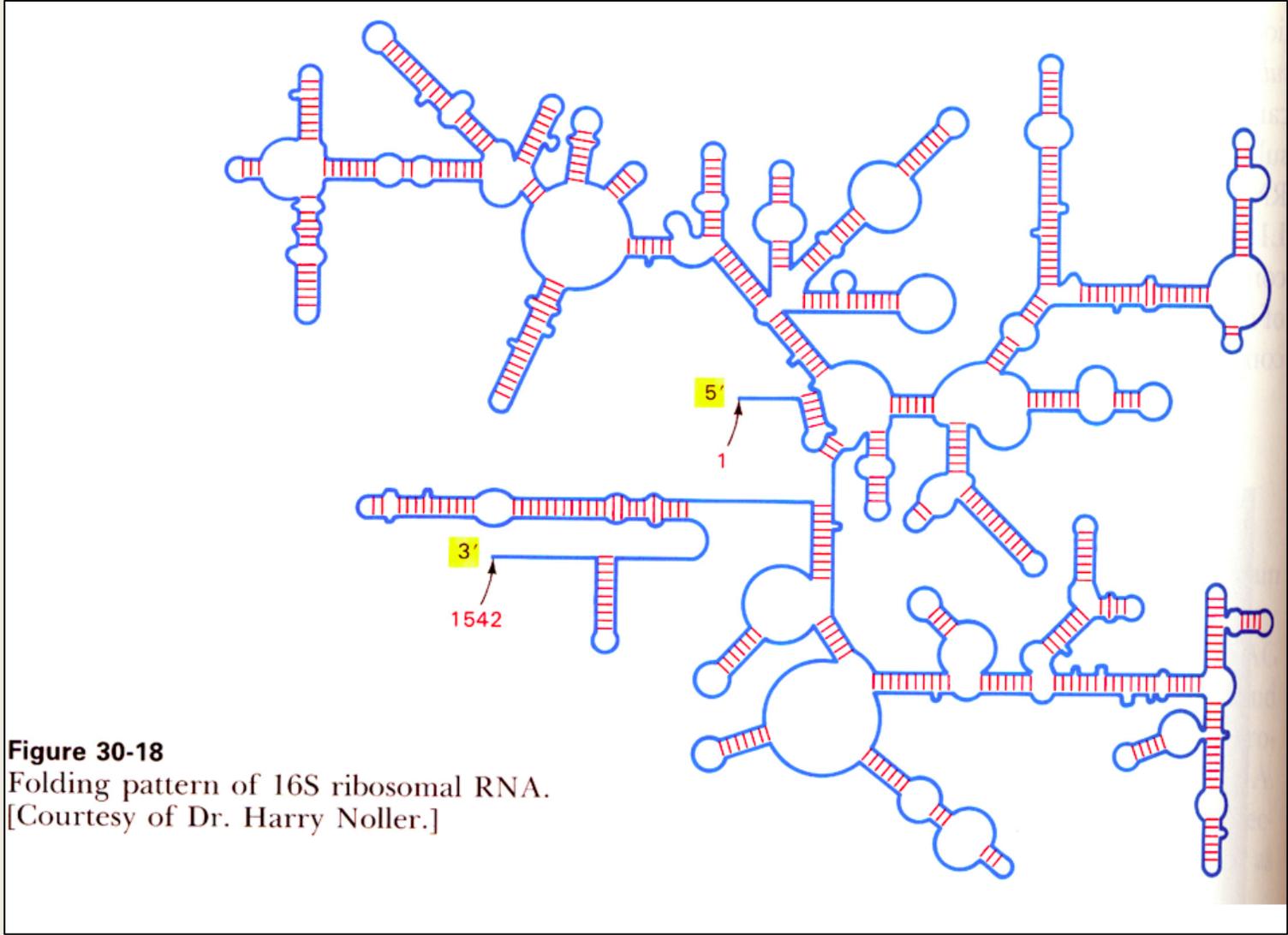
# RNA folding



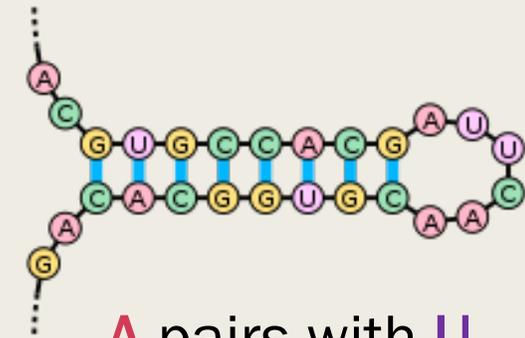
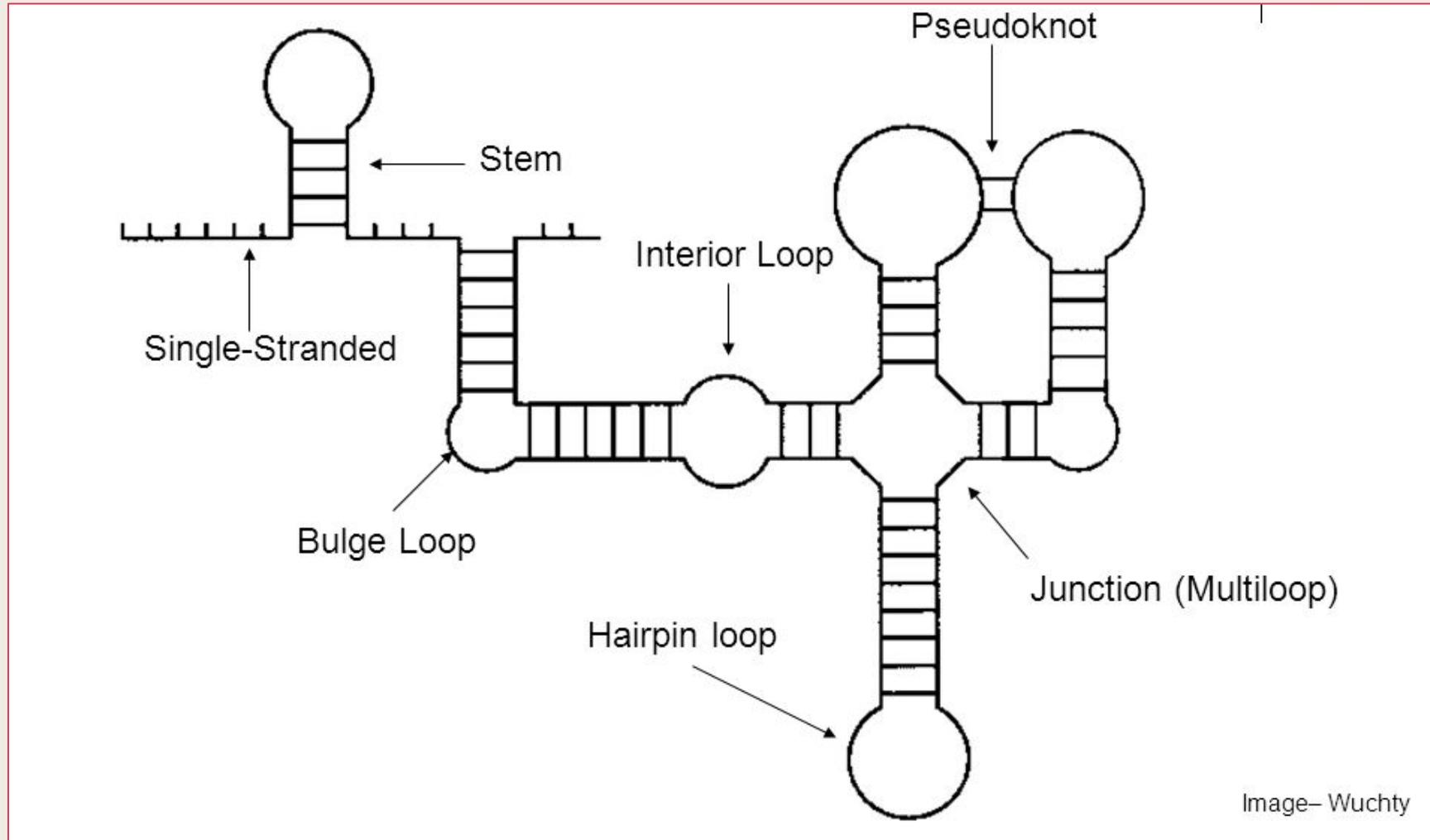
- RNA does not stay as a linear sequence
- It folds into a secondary structure that minimizes energy

<https://www.youtube.com/watch?v=KBI69y2ziXw>

# RNA secondary structure: larger example



# Features of RNA secondary structure

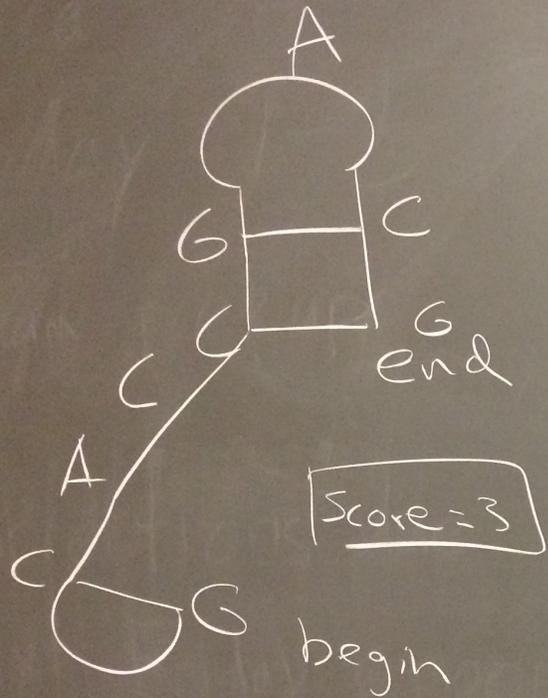


**A** pairs with **U**  
**C** pairs with **G**

Image: wikipedia

# Enter: computational biology

- Goal: how could we predict RNA secondary structure?
- Inspiration: sequence alignment
- Answer: dynamic programming (Nussinov's algorithm)



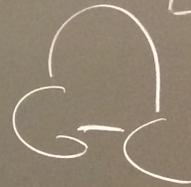
Goal. maximize the # of matches

$$\text{match}(A, A) = 1$$

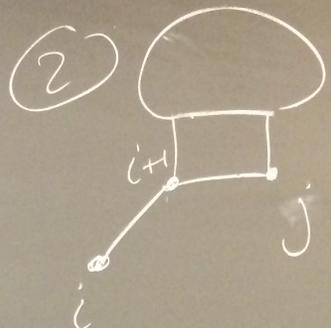
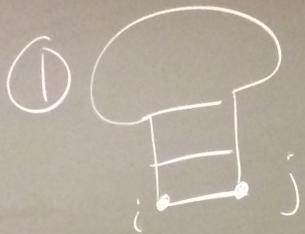
$$\text{match}(C, G) = 1$$

$$\text{otherwise} = 0$$

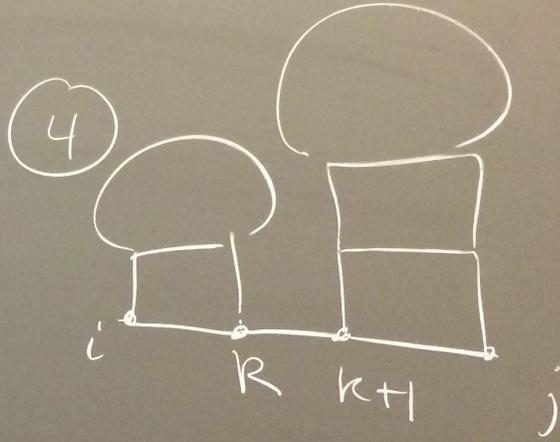
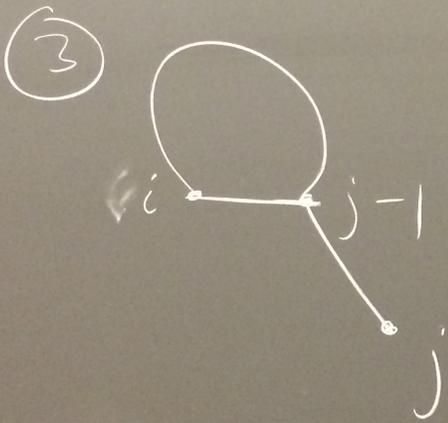
	1	2	3	4	5	6	7	8
GCACCGACG								
			3-5					
			i-j					



①  
③

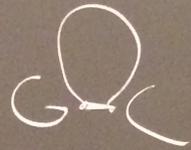
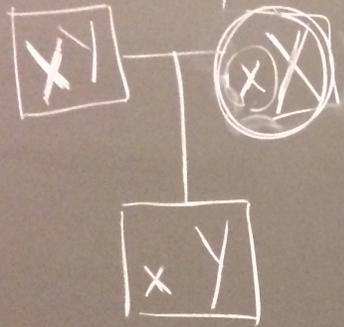


5 6 7 8  
 G A C G  
 ( )  
 S



$$\gamma(i, j) = \max \begin{cases} \gamma(i+1, j-1) + \text{match}(i, j) \\ \gamma(i+1, j) \\ \gamma(i, j-1) \end{cases}$$

$$\star \max_{i < k < j} \{ \gamma(i, k) + \gamma(k+1, j) \}$$



$\gamma(1,3)$

$i$	1	2	3	4	5	6	7	8	$j$
1	G	C	A	C	G	A	C	G	1
2	0	1	1	0	2	0	0	3	2
3	0	0	0	0	0	0	0	0	3
4	0	0	0	0	1	0	0	0	4
5	0	0	0	0	0	0	0	0	5
6	0	0	0	0	0	0	0	1	6
7	0	0	0	0	0	0	1	0	7
8	0	0	0	0	0	0	0	0	8

$\gamma(2,1)$

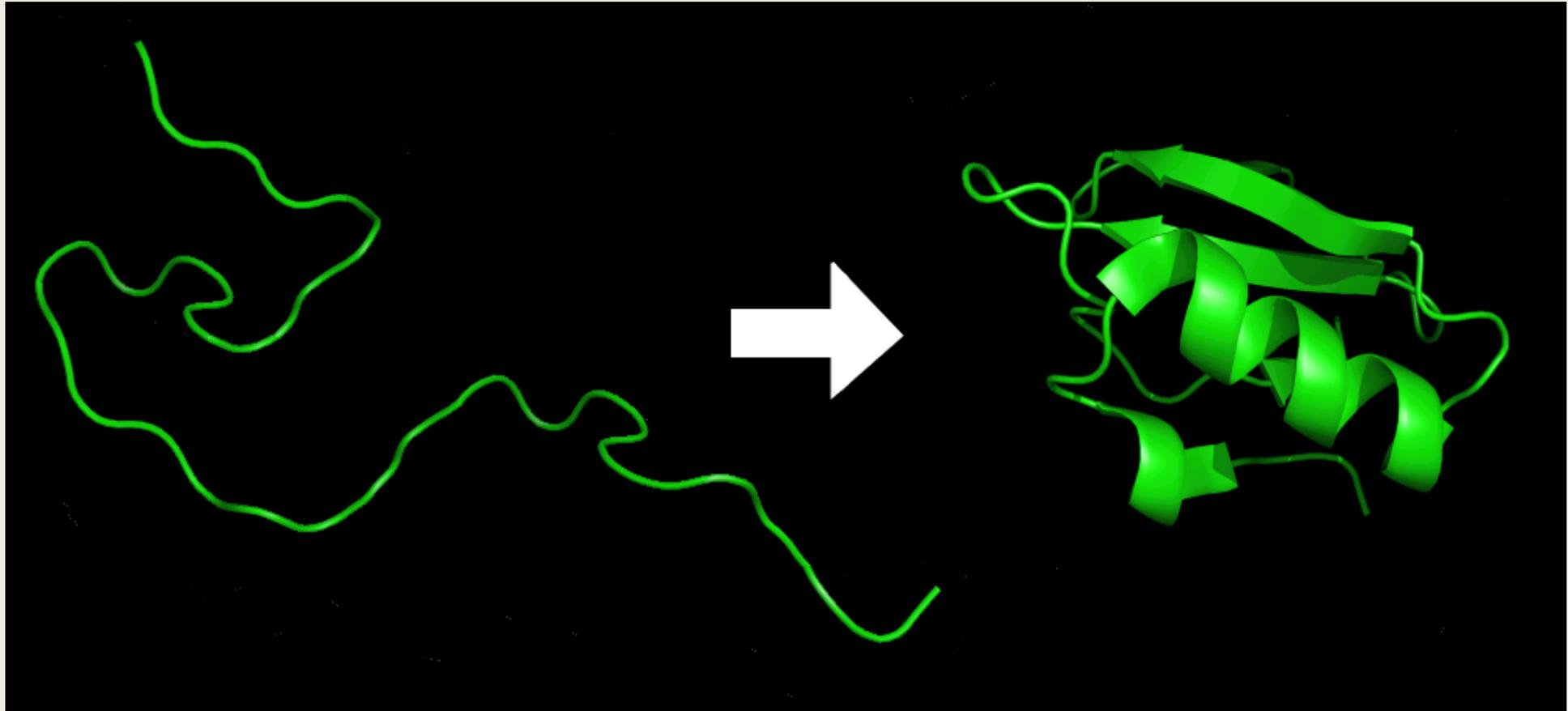
# Example

	1	2	3	4	5	6	7	8	
G	0								G 1
C	0	0							C 2
A		0	0						A 3
C			0	0					C 4
G				0	0				G 5
A					0	0			A 6
C						0	0		C 7
G							0	0	G 8

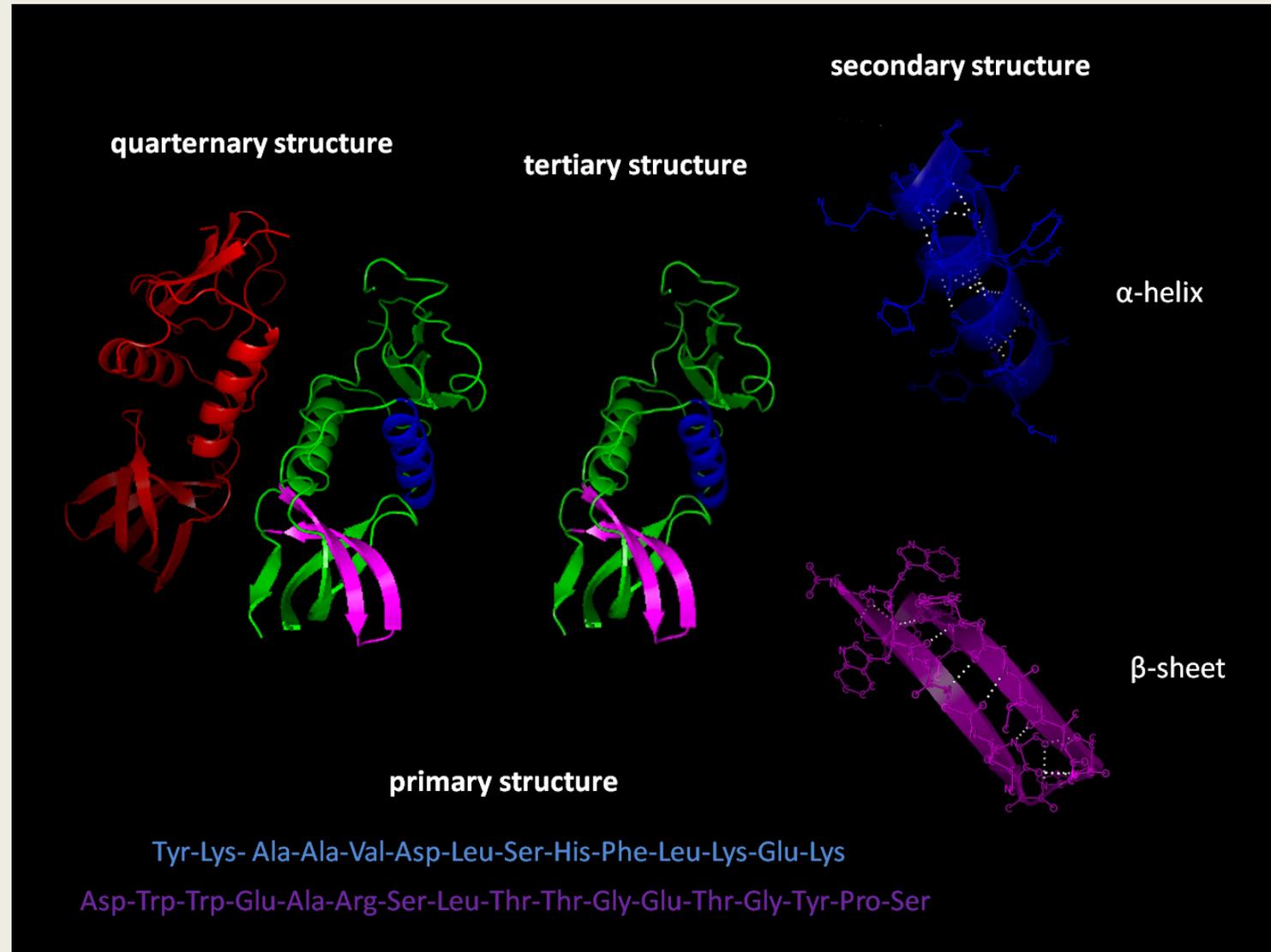
# Example solution. Exercise: back-tracing

1	2	3	4	5	6	7	8		
<b>G</b>	<b>C</b>	<b>A</b>	<b>C</b>	<b>G</b>	<b>A</b>	<b>C</b>	<b>G</b>		
0	1	1	1	2	2	2	3	<b>G</b>	<b>1</b>
0	0	0	0	1	1	1	2	<b>C</b>	<b>2</b>
	0	0	0	1	1	1	2	<b>A</b>	<b>3</b>
		0	0	1	1	1	2	<b>C</b>	<b>4</b>
			0	0	0	1	1	<b>G</b>	<b>5</b>
				0	0	0	1	<b>A</b>	<b>6</b>
					0	0	1	<b>C</b>	<b>7</b>
						0	0	<b>G</b>	<b>8</b>

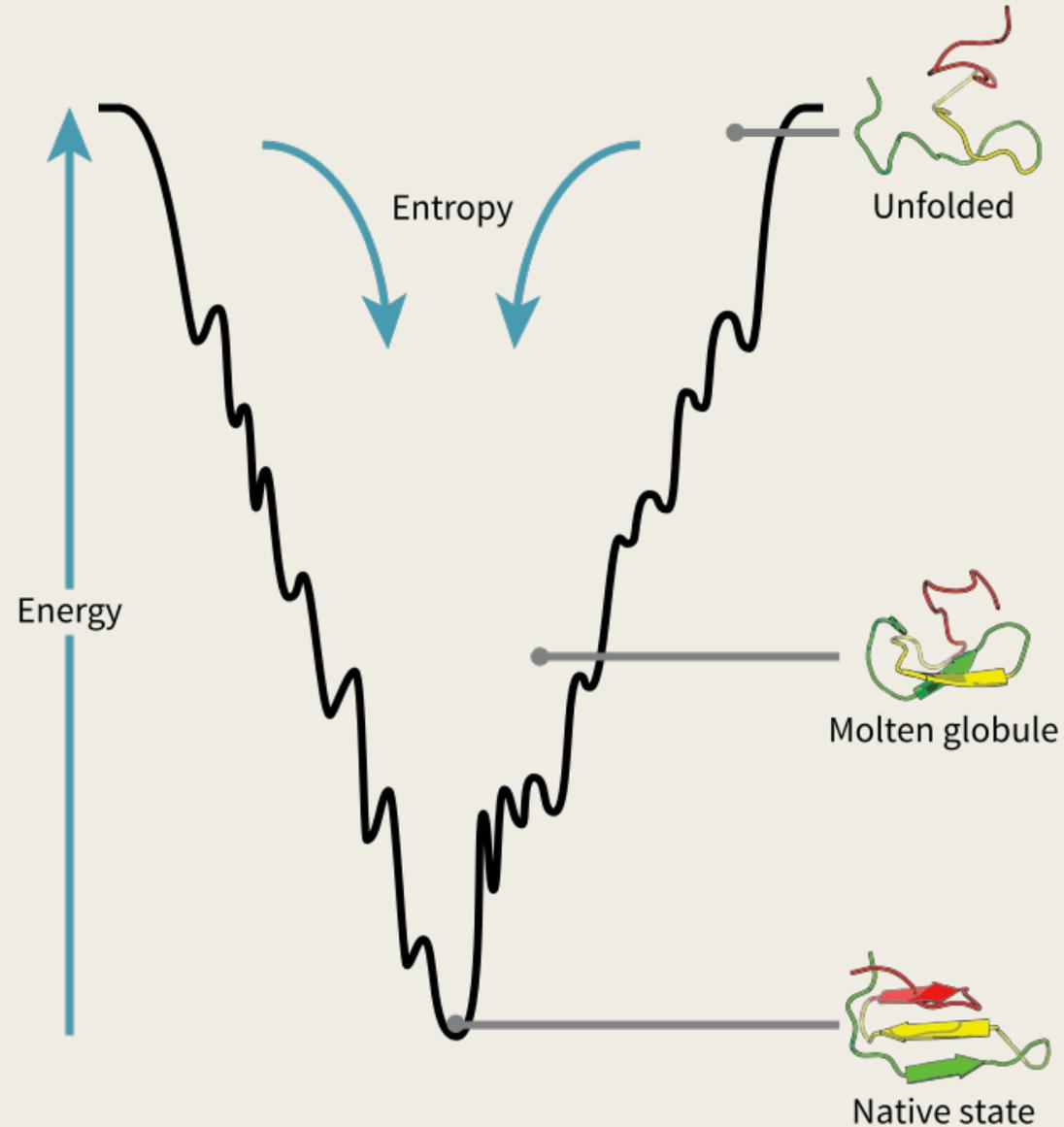
# Protein folding: from sequence to structure



# Protein structure beyond the sequence



# Proteins seek a low-energy configuration



# Breakthrough in protein folding

- Bonnie Berger and Tom Leighton prove protein folding is NP-Complete (1998)
- Helped pave the way for approximation algorithms

Protein Folding in the Hydrophobic-Hydrophilic (*HP*) Model is  
NP-Complete

Bonnie Berger\*

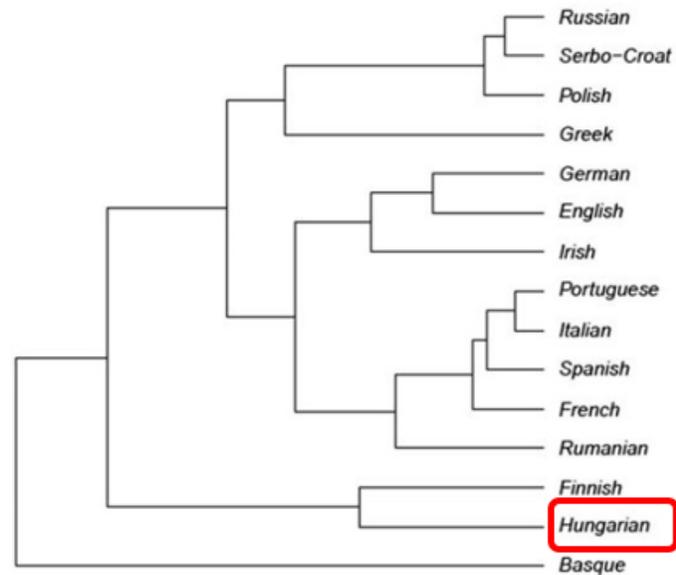
Tom Leighton<sup>†</sup>

Final thoughts

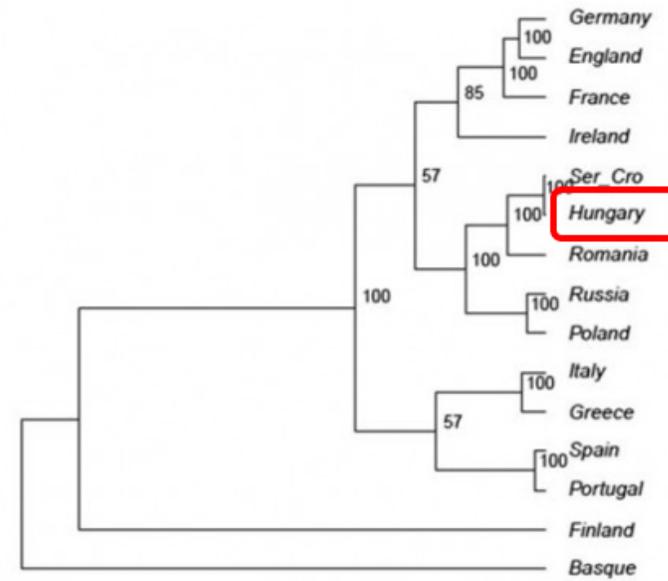
# Combining linguistics and genetics

## Syntactic tree vs. Genetic tree

C



D



# Other thoughts

- Interested in evolution vs. creationism debate? Recommend following Nick Matzke

## **Nick Matzke**

@NickJMatzke

I dig evolution. Evo of: biogeography, complex adaptations (carnivorous plants, flagella), evolutionary thought, R packages, texts, & creationist/ID silliness.

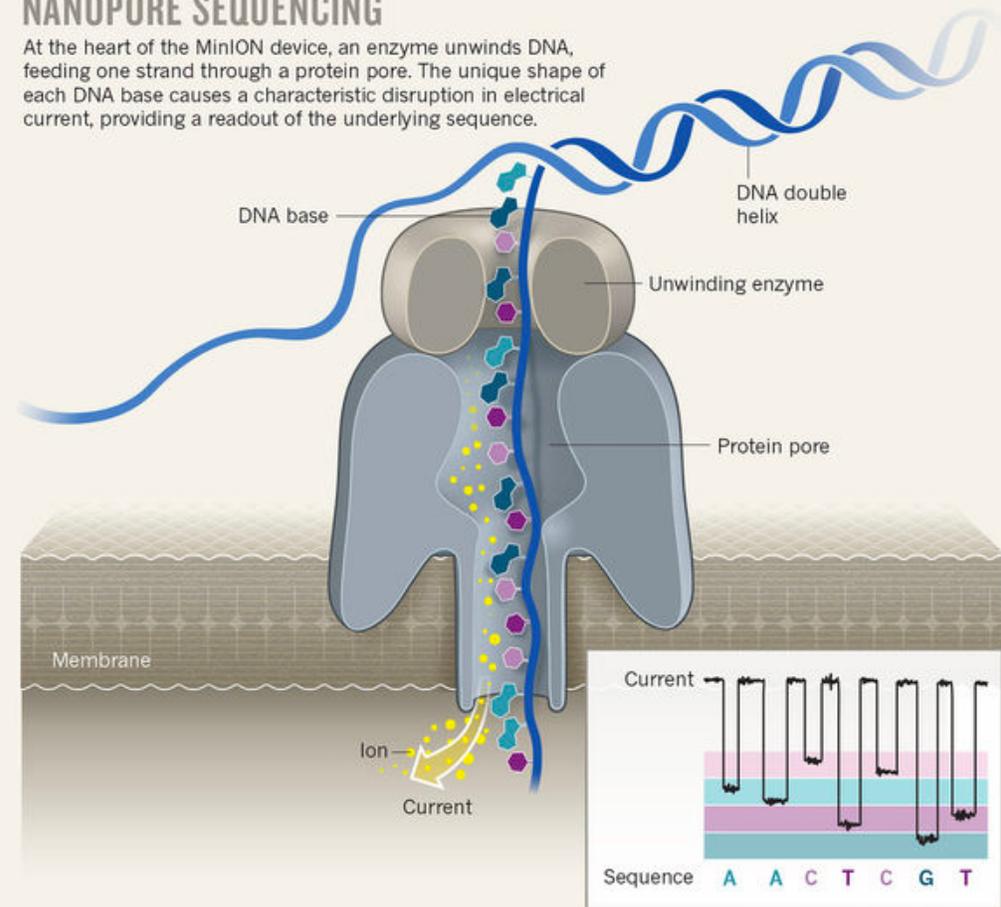
- Industry:
  - *Genentech*
  - *Illumina*
  - *23andMe*
  - *Ancestry.com*
  - *Invitae*
  - *Google Genomics*

# Areas of Opportunity

- *Managing and analyzing data quickly and in a more automated way*
- *Intersecting with biochemistry to make sequencing better*
- *Sequencing more species, especially to assist conservation efforts*
- *Microbiome sequencing and understanding*

## NANOPORE SEQUENCING

At the heart of the MinION device, an enzyme unwinds DNA, feeding one strand through a protein pore. The unique shape of each DNA base causes a characteristic disruption in electrical current, providing a readout of the underlying sequence.



Example: Oxford Nanopore