

## Announcements Mar 25

- Class participation (Piazza polls) is optional for the rest of the semester.
- We will use Blue Jeans Meetings for the rest of the semester.
- The new schedule will be released March 30.
- Midterm 3 on **April 17**
- WeBWork 5.1 due Thu April 2.
- Practice quiz is open until Wed at 5. You have 25 minutes once you start.  
It is not for a grade.
- Official quiz next Friday on Canvas. It will be open all day Friday, but there will be a time limit.
- Lights out questions on Piazza!
- My office hours Monday 3-4 and Wed 2-3 on Blue Jeans starting next week
- TA office hours on Blue Jeans (you can go to any of these!)
  - ▶ Isabella Mon 11-12, Wed 11-12
  - ▶ Kyle Wed 3-6, Thu 1-4
  - ▶ Kalen Mon/Wed 1-2
  - ▶ Sidhanth Tue 10-12
- Supplemental problems and practice exams on the master web site

I made a video



# The cat



The cat



W



# The cat



# The cat





MARION  
**COTILLARD**    MATT  
**DAMON**    LAURENCE  
**FISHBURNE**    JUDE  
**LAW**    GWYNETH  
**PALTROW**    KATE  
**WINSLET**

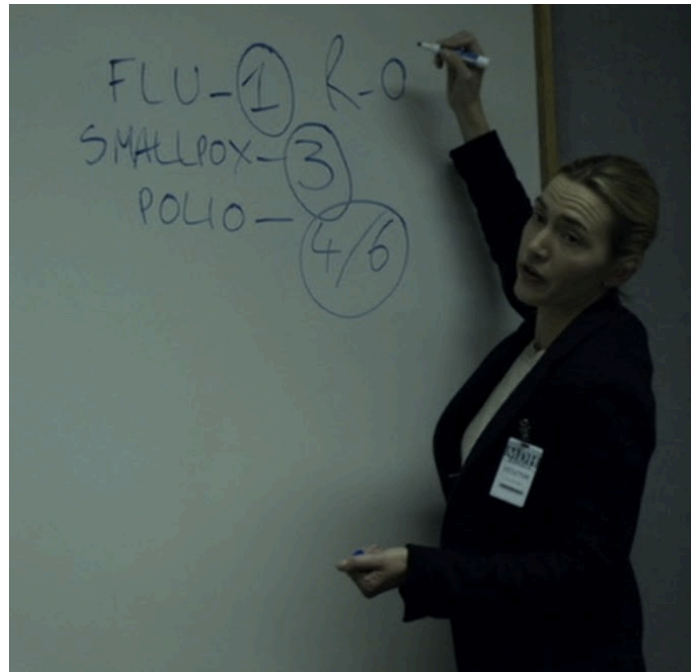
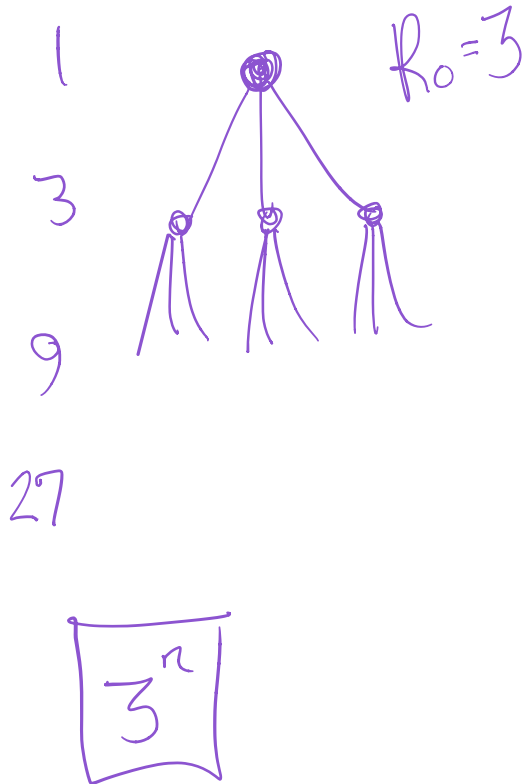
**NOTHING SPREADS LIKE FEAR**

**CONTAGION**



$R_0$

For a given virus,  $R_0$  is the average number of people that each infected person infects. If  $R_0$  is large, that is bad. Patient zero infects  $R_0$  people, who then infect  $R_0^2$  people, who then infect  $R_0^3$  people. That is exponential growth. (If  $R_0$  is less than 1, then that's good.)



# Eigenvectors and Eigenvalues

Suppose  $A$  is an  $n \times n$  matrix and there is a  $v \neq 0$  in  $\mathbb{R}^n$  and  $\lambda$  in  $\mathbb{R}$  so that

$$\underline{Av} = \underline{\lambda v}$$

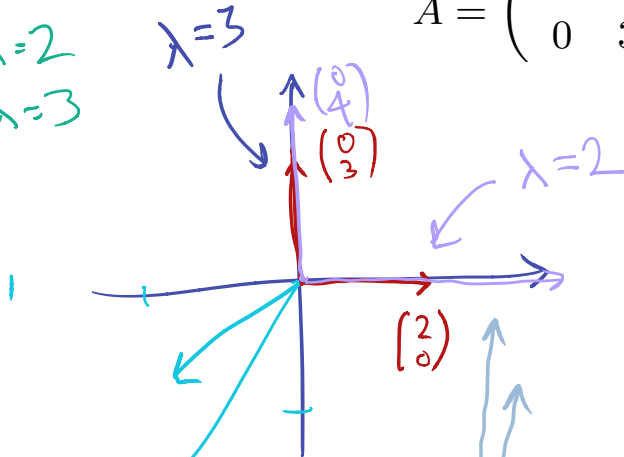


then  $v$  is called an **eigenvector** for  $A$ , and  $\lambda$  is the corresponding **eigenvalue**.

Can you find ~~any~~ <sup>all</sup> eigenvectors/eigenvalues for the following matrix?

$$A = \begin{pmatrix} 2 & 0 \\ 0 & 3 \end{pmatrix}$$

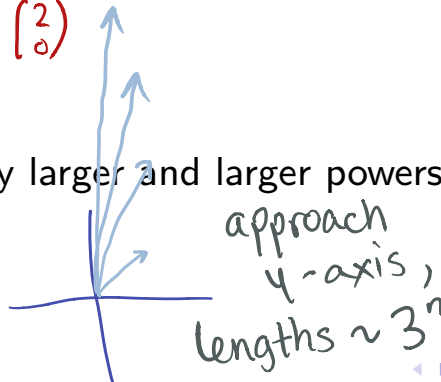
x-axis  $\lambda=2$   
y-axis  $\lambda=3$



$$\begin{aligned} \begin{pmatrix} 2 & 0 \\ 0 & 3 \end{pmatrix} \begin{pmatrix} 1 \\ 1 \end{pmatrix} &= \begin{pmatrix} 2 \\ 3 \end{pmatrix} \quad \text{not} \\ \begin{pmatrix} 2 & 0 \\ 0 & 3 \end{pmatrix} \begin{pmatrix} 3 \\ 2 \end{pmatrix} &= \begin{pmatrix} 6 \\ 6 \end{pmatrix} \\ \begin{pmatrix} 2 & 0 \\ 0 & 3 \end{pmatrix} \begin{pmatrix} 2 \\ 0 \end{pmatrix} &= \begin{pmatrix} 4 \\ 0 \end{pmatrix} \quad \checkmark \\ \begin{pmatrix} 2 & 0 \\ 0 & 3 \end{pmatrix} \begin{pmatrix} 0 \\ 3 \end{pmatrix} &= \begin{pmatrix} 0 \\ 9 \end{pmatrix} \quad \checkmark \\ \begin{pmatrix} 2 & 0 \\ 0 & 3 \end{pmatrix} \begin{pmatrix} x \\ y \end{pmatrix} &= \begin{pmatrix} 2x \\ 3y \end{pmatrix} \quad \checkmark \end{aligned}$$

What happens when you apply larger and larger powers of  $A$  to a vector?

$$\lim A^n v$$





# Eigenvectors and Eigenvalues

So for the matrix

$$A = \begin{pmatrix} 2 & 0 \\ 0 & 3 \end{pmatrix}$$

not x-axis.

↑ another eigenspace.

we see that if we take (almost) any vector  $v$  and apply powers of  $A$ ...

$$v, Av, A^2v, A^3v, \dots$$

then eventually the vectors are pointing (almost) vertically, and the lengths multiply by (almost) 3 every time.

So the lengths of the vectors  $A^k v$  grow like  $3^k$  (exponential growth).

This is happening because 3 is the largest eigenvalue and the  $\begin{pmatrix} 0 \\ 1 \end{pmatrix}$  is its eigenvector.

y-axis is its eigenspace.

value

~~one of~~

~

# A Question from Biology



In a population of rabbits...

- half of the new born rabbits survive their first year
- of those, half survive their second year
- the maximum life span is three years
- rabbits produce 0, 6, 8 rabbits in their first, second, and third years

If I know the population one year - think of it as a vector - what is the population the next year?

$$A \begin{pmatrix} f \\ s \\ t \end{pmatrix}$$

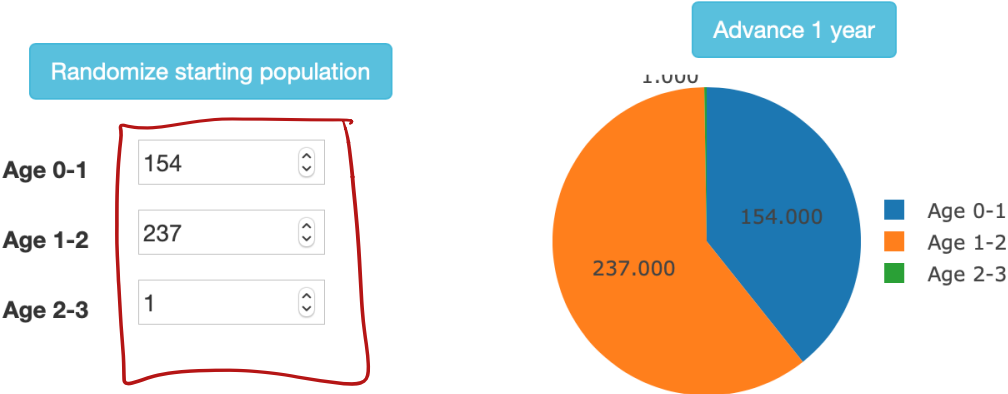
Answer. apply this matrix:

$$A = \begin{pmatrix} 0 & 6 & 8 \\ \frac{1}{2} & 0 & 0 \\ 0 & \frac{1}{2} & 0 \end{pmatrix}$$

Now choose some starting population vector  $u$  and choose some number of years  $N$ . What is the new population after  $N$  years?



# Rabbits



# Rabbits

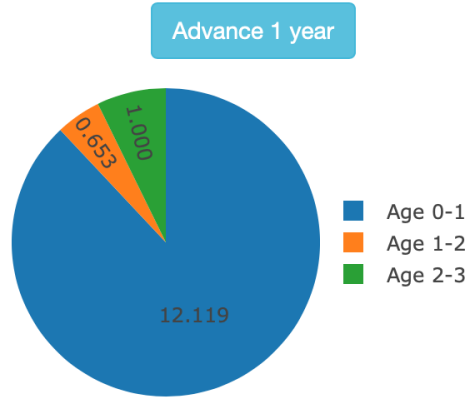


Randomize starting population

Age 0-1

Age 1-2

Age 2-3



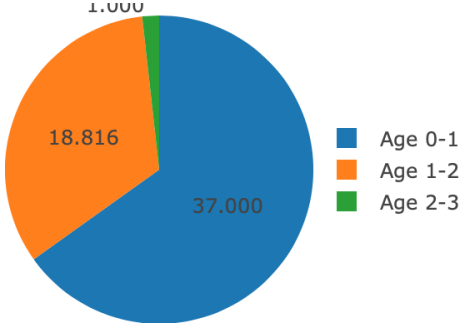
# Rabbits



Randomize starting population

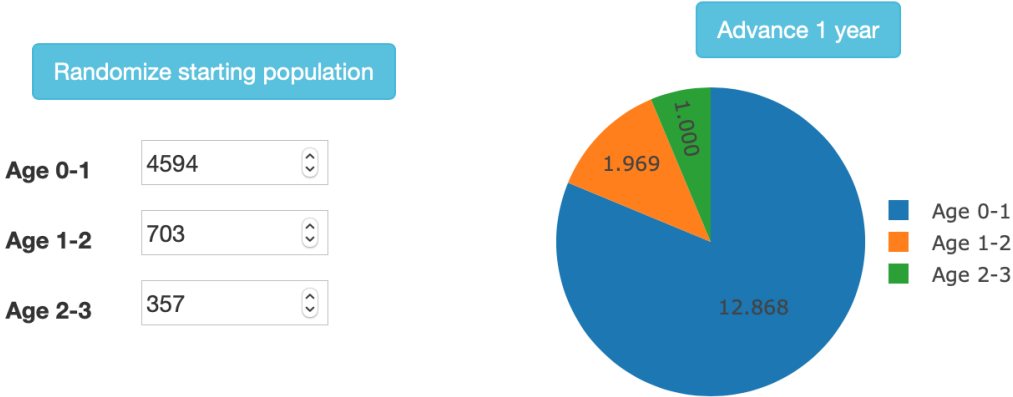
Age 0-1	<input type="text" value="1406"/>
Age 1-2	<input type="text" value="715"/>
Age 2-3	<input type="text" value="38"/>

Advance 1 year





# Rabbits



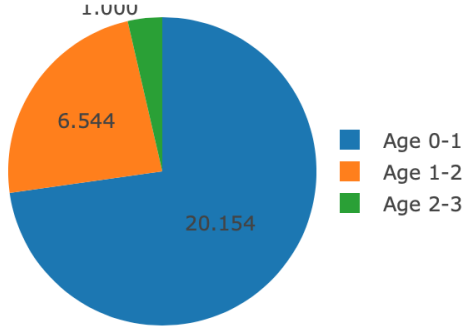
# Rabbits



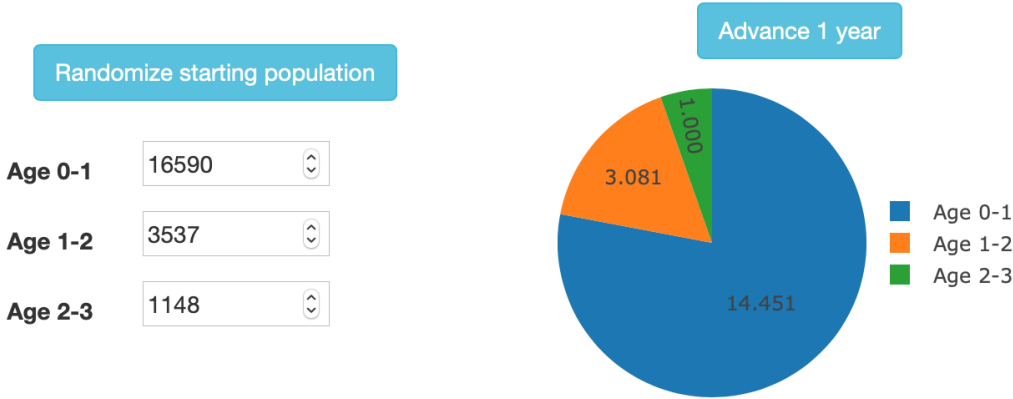
Randomize starting population

Age 0-1	<input type="text" value="7074"/>
Age 1-2	<input type="text" value="2297"/>
Age 2-3	<input type="text" value="351"/>

Advance 1 year



# Rabbits

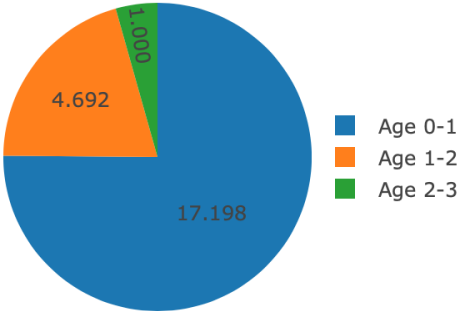


# Rabbits

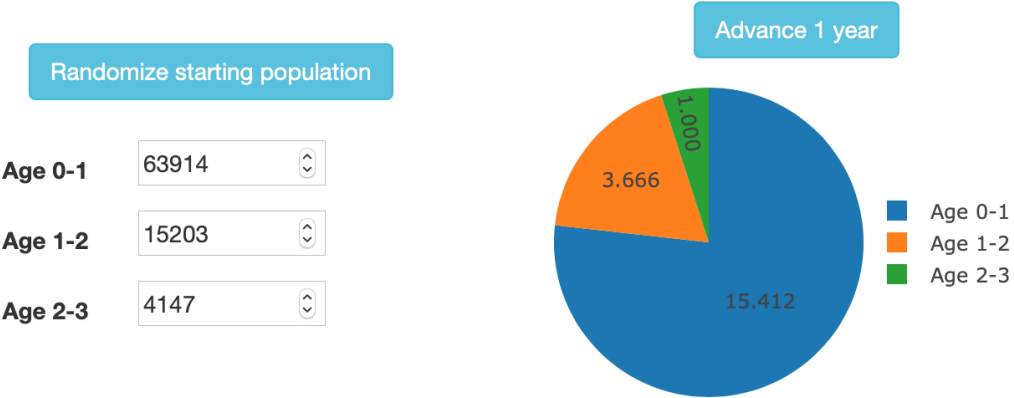
Randomize starting population

Age 0-1	<input type="text" value="30406"/>
Age 1-2	<input type="text" value="8295"/>
Age 2-3	<input type="text" value="1768"/>

Advance 1 year

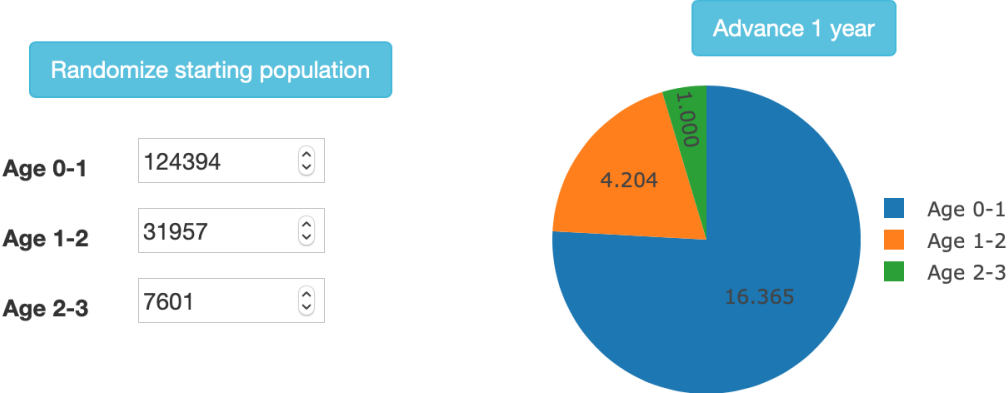


# Rabbits





# Rabbits

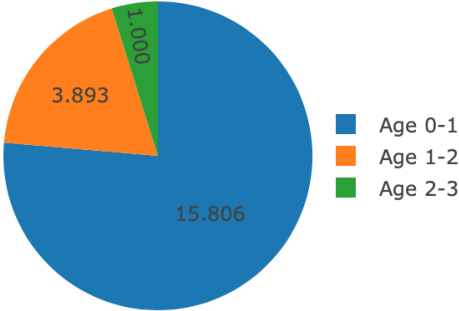


# Rabbits

Randomize starting population

Age 0-1	<input type="text" value="252550"/>
Age 1-2	<input type="text" value="62197"/>
Age 2-3	<input type="text" value="15978"/>

Advance 1 year

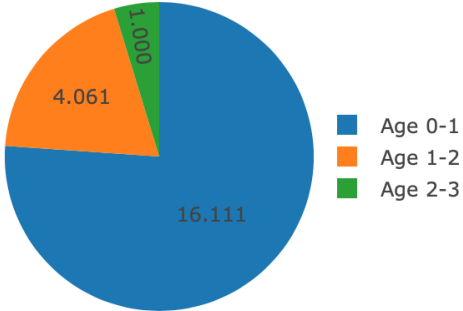


# Rabbits

Randomize starting population

Age 0-1	<input type="text" value="501006"/>
Age 1-2	<input type="text" value="126275"/>
Age 2-3	<input type="text" value="31098"/>

Advance 1 year



# Rabbits

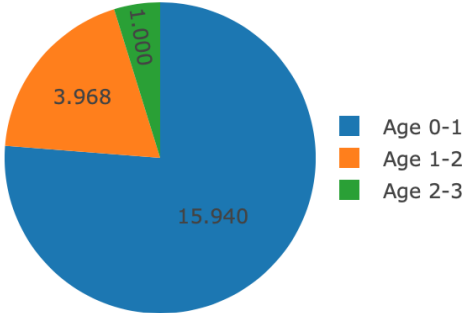
Randomize starting population

Age 0-1

Age 1-2

Age 2-3

Advance 1 year



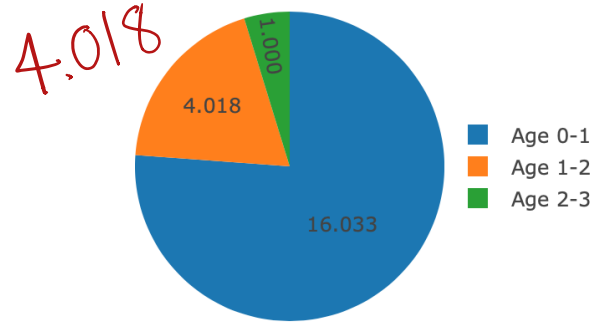
# Rabbits

doubled  
from  
prev.  
year

Randomize starting population

Age 0-1 2008114  
Age 1-2 503217  
Age 2-3 125251

Advance 1 year



(largest) eigenvalue 2  
eigenvector  $\begin{pmatrix} 16 \\ 4 \\ 1 \end{pmatrix}$

If I tell you  $\lambda=2$   
Find eigenvectors  
by solving  
 $(A-2I)v=0$



# Eigenvectors and Eigenvalues

So for the matrix

$$A = \begin{pmatrix} 0 & 6 & 8 \\ \frac{1}{2} & 0 & 0 \\ 0 & \frac{1}{2} & 0 \end{pmatrix}$$

not the eigenvectors for other eigenvalue.

we see that if we take (almost) any vector  $v$  and apply powers of  $A$ ...

$$v, Av, A^2v, A^3v, \dots$$

then eventually the vectors are pointing (almost) in the direction  $\begin{pmatrix} 16 \\ 4 \\ 1 \end{pmatrix}$ , and the lengths - or, total population - multiplies by (almost) 2 every time.

So the lengths of the vectors - or, total population -  $A^k v$  grow like  $2^k$  (exponential growth). That means it doubles every year.

Also, the ratio of first:second:third year rabbits approaches 16:4:1.

This is happening because 2 is the largest eigenvalue and  $\begin{pmatrix} 16 \\ 4 \\ 1 \end{pmatrix}$  is its eigenvector. (the span of  $(16, 4, 1)$  is the eigenspace)

$R_0$




For a given virus,  $R_0$  is the average number of people that each infected person infects. If  $R_0$  is large, that is bad. Patient zero infects  $R_0$  people, who then infect  $R_0^2$  people, who then infect  $R_0^3$  people. That is exponential growth.

Whenever we see an exponential growth rate, we should think: eigenvalue.

It turns out that  $R_0$  is an eigenvalue. The rough idea is very similar to our rabbit example: split the population into compartments, figure out how often each compartment infects each other compartment. That's a matrix. The largest eigenvalue is  $R_0$ .

## $R_0$ is an eigenvalue

It turns out that  $R_0$  is an eigenvalue. The rough idea is very similar to our rabbit example: split the population into compartments, figure out how often each compartment infects each other compartment. 

For malaria, the compartments might be mosquitoes and humans.

$2 \times 2$  matrix

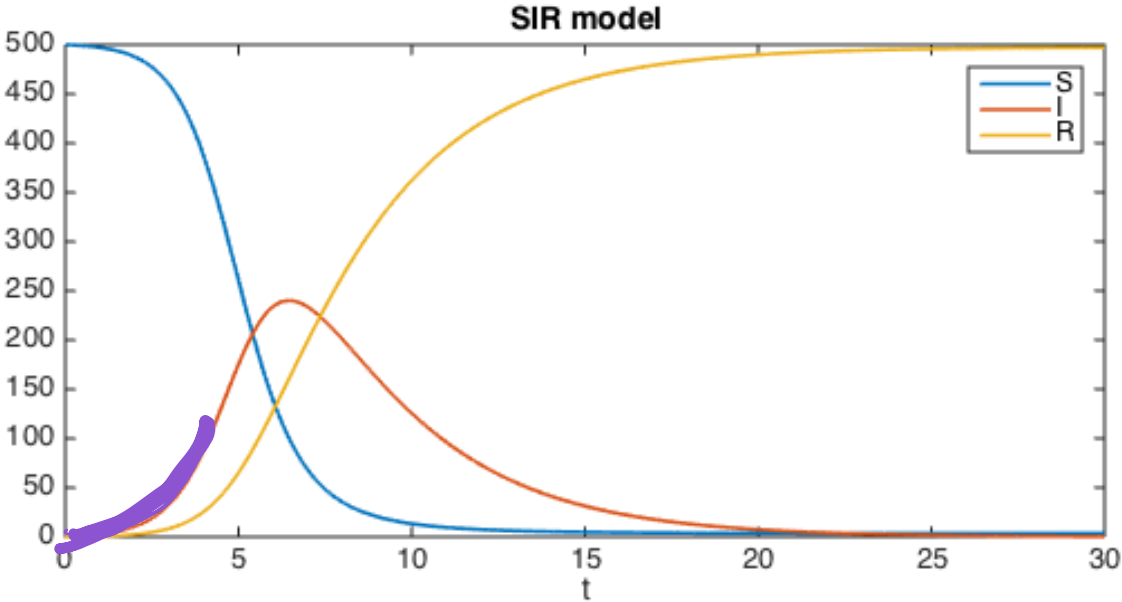
For a sexually transmitted disease in a heterosexual population, the compartments might be males and females.



# Bell curves

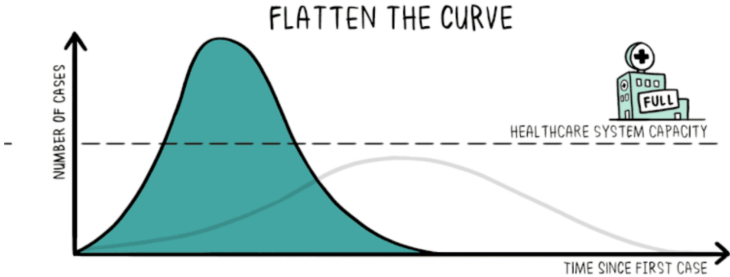


The growth rate of infection does not stay exponential forever, because the recovered population has immunity. That's where you get these bell curves.



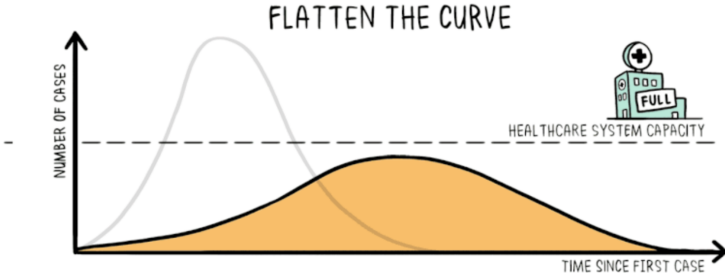
# Public Service Announcement

Social distancing decreases  $R_0$



@SIOUXSIEW @XTOTL @THESPINOFFTV

'ADAPTED FROM @DREWAHARRIS, THOMAS SPLETTSTOBER (@SPLETTE) AND THE CDC' CC-BY-SA



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# Go Jackets!



Keep learning. You guys will be the solution.