

## 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

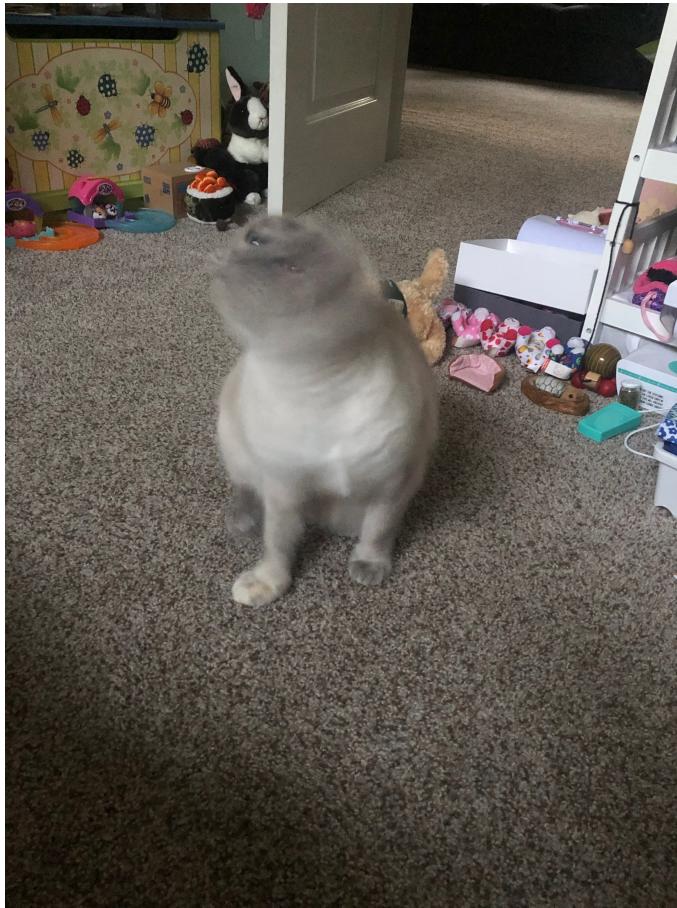


# The cat



W

# The cat



# The cat





MARION  
**COTILLARD**

MATT  
**DAMON**

LAURENCE  
**FISHBURNE**

JUDE  
**LAW**

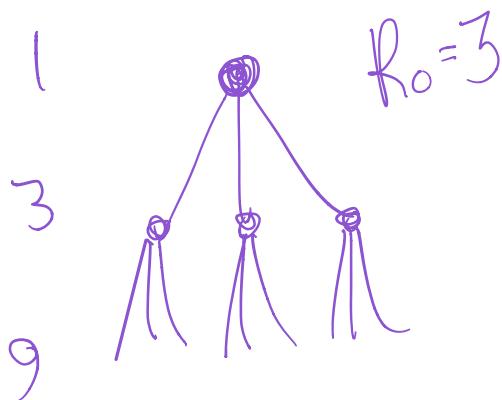
Gwyneth  
**PALTROW**

KATE  
**WINSLET**

# **NOTHING SPREADS LIKE FEAR** **CONTAGION**

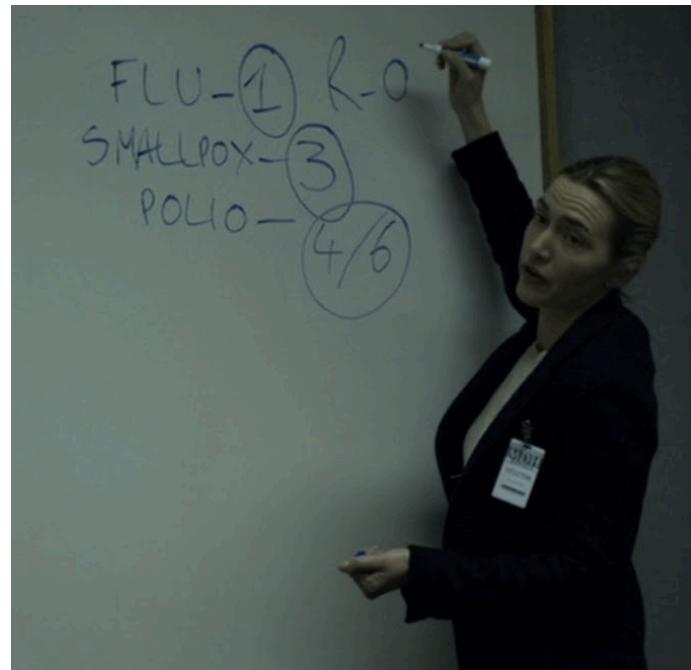
$R_0$

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.)



27

$$3^n$$



# 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

$$Av = \lambda v$$

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

Can you find **all** eigenvectors/eigenvalues for the following matrix?

$x\text{-axis } \lambda=2$   
 $y\text{-axis } \lambda=3$

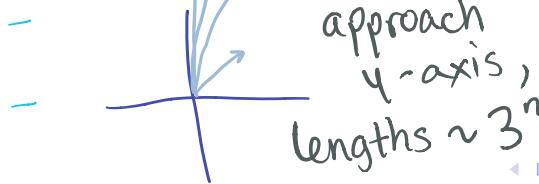
$$\lambda=3$$
$$A = \begin{pmatrix} 2 & 0 \\ 0 & 3 \end{pmatrix}$$

not

$$\begin{pmatrix} 2 & 0 \\ 0 & 3 \end{pmatrix} \begin{pmatrix} 1 \\ 1 \end{pmatrix} = \begin{pmatrix} 2 \\ 3 \end{pmatrix}$$
$$\begin{pmatrix} 2 & 0 \\ 0 & 3 \end{pmatrix} \begin{pmatrix} 3 \\ 2 \end{pmatrix} = \begin{pmatrix} 6 \\ 6 \end{pmatrix}$$
$$\begin{pmatrix} 2 & 0 \\ 0 & 3 \end{pmatrix} \begin{pmatrix} 2 \\ 0 \end{pmatrix} = \begin{pmatrix} 4 \\ 0 \end{pmatrix} \checkmark$$
$$\begin{pmatrix} 2 & 0 \\ 0 & 3 \end{pmatrix} \begin{pmatrix} 0 \\ 3 \end{pmatrix} = \begin{pmatrix} 0 \\ 9 \end{pmatrix} \checkmark$$

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

$\lim A^n v$



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

## 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.

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

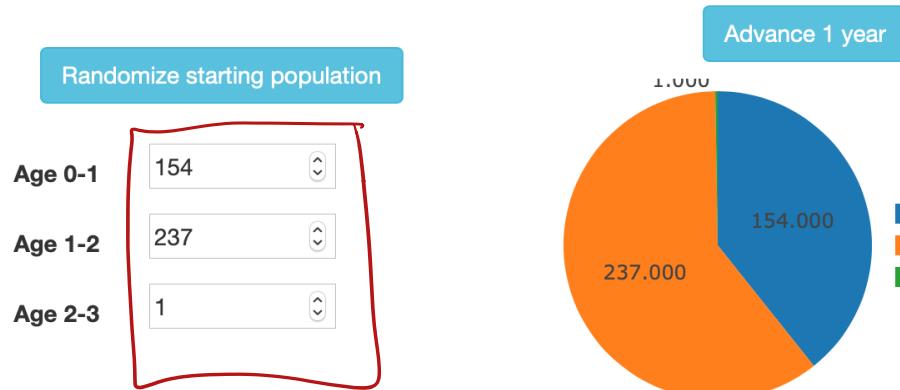
Answer. apply this matrix:

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

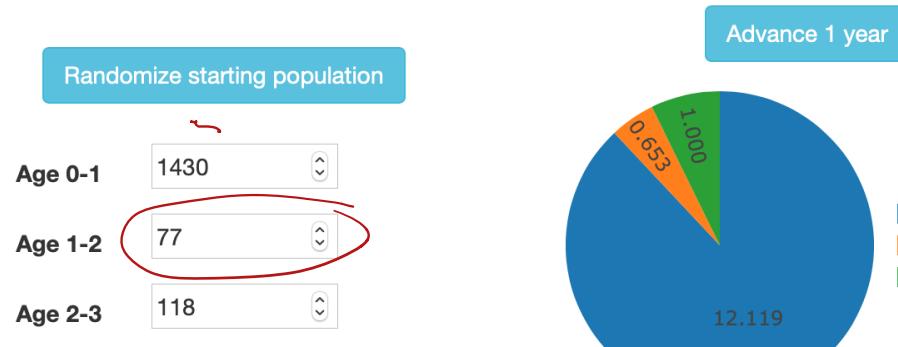
Now choose some starting population vector  $u$  and choose some number of years  $N$ . What is the new population after  $N$  years?



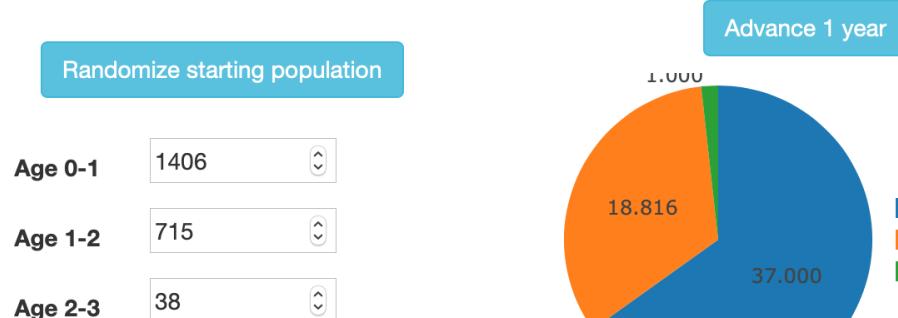
# Rabbits



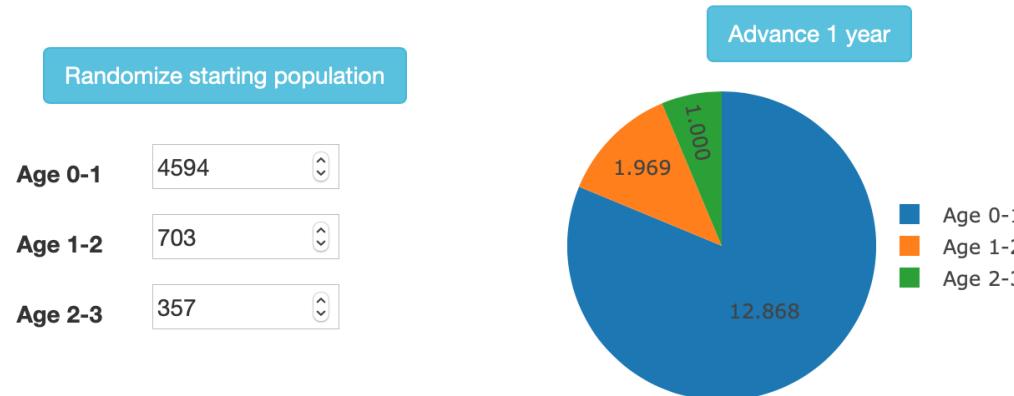
# Rabbits



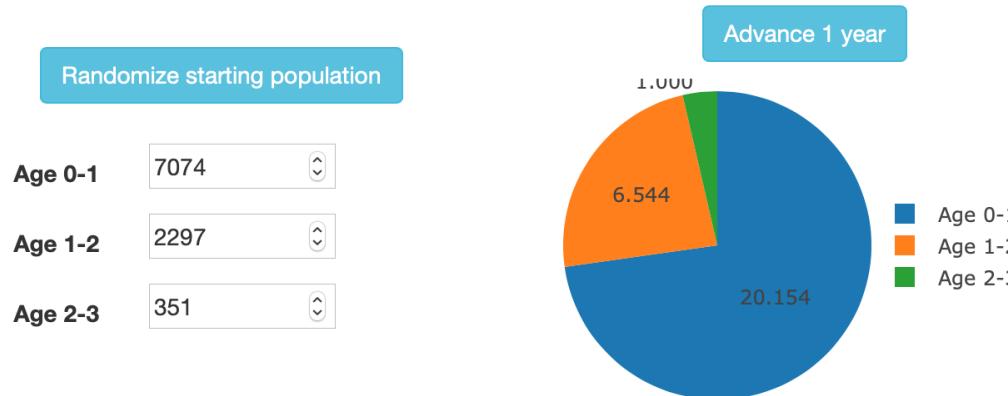
# Rabbits



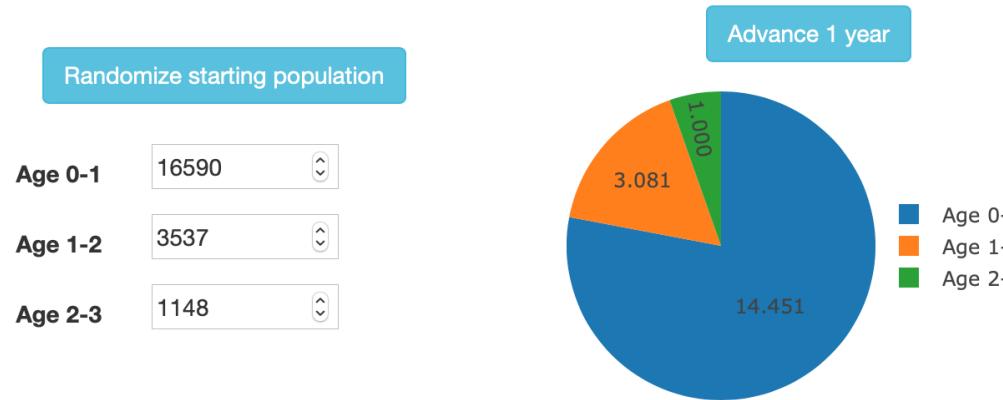
# Rabbits



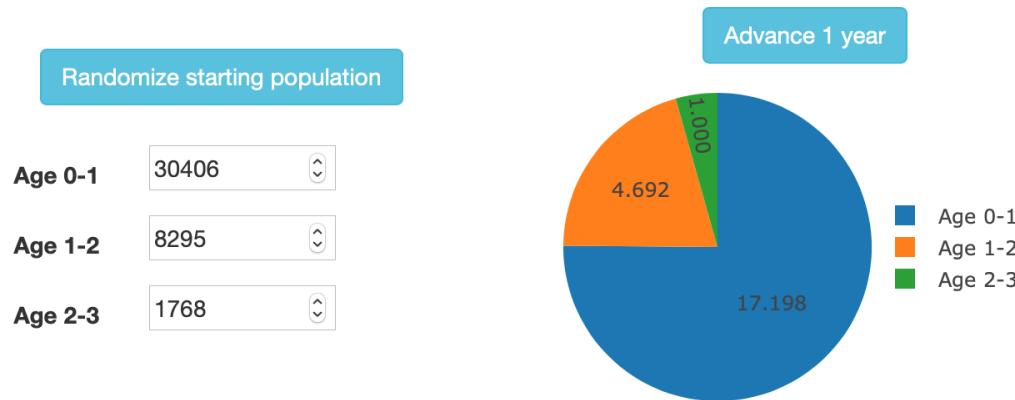
# Rabbits



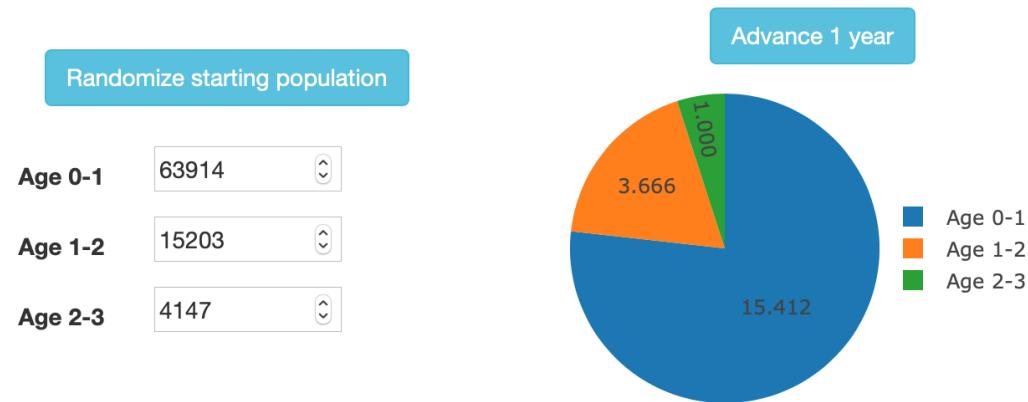
# Rabbits



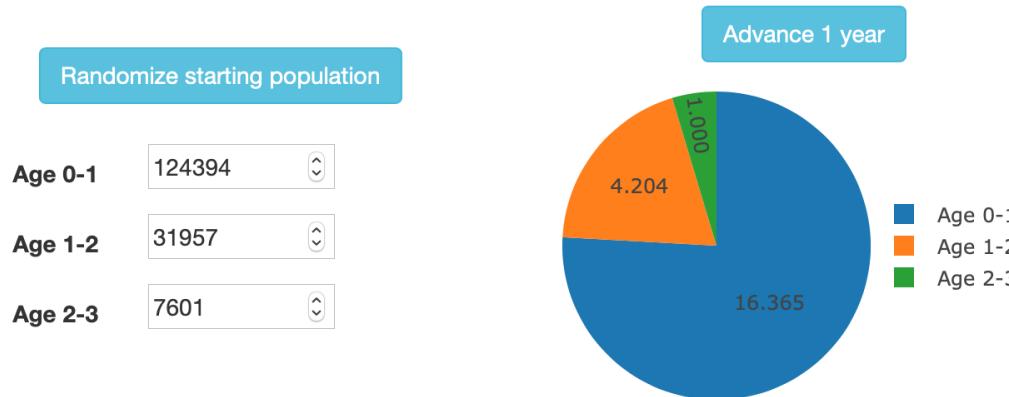
# Rabbits



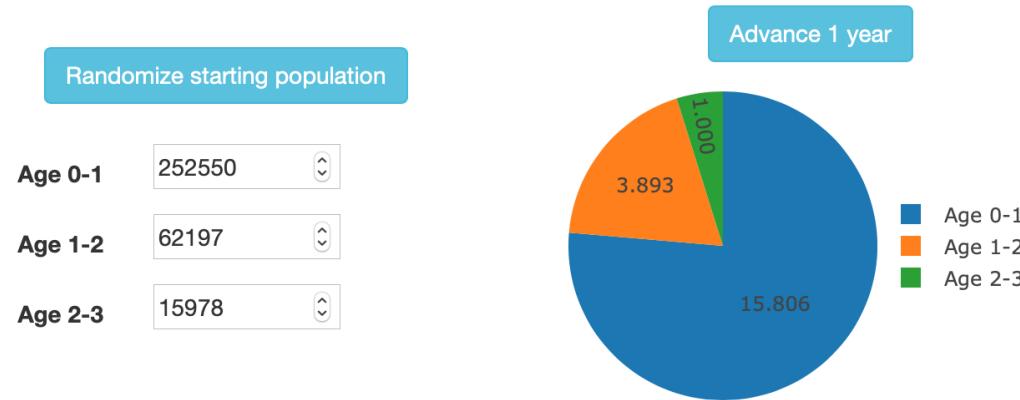
# Rabbits



# Rabbits



# Rabbits



# Rabbits

Randomize starting population

**Age 0-1**

501006



**Age 1-2**

126275

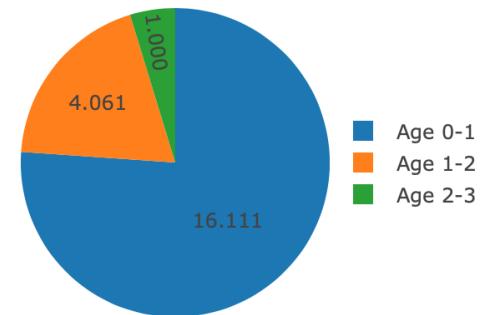


**Age 2-3**

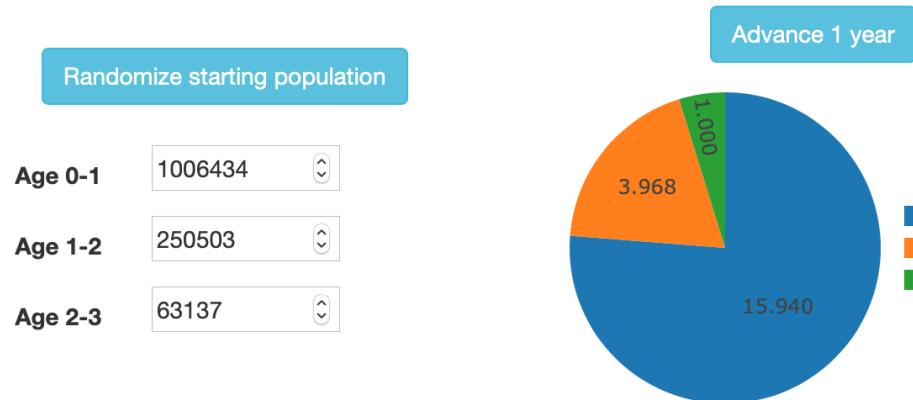
31098



Advance 1 year



# Rabbits

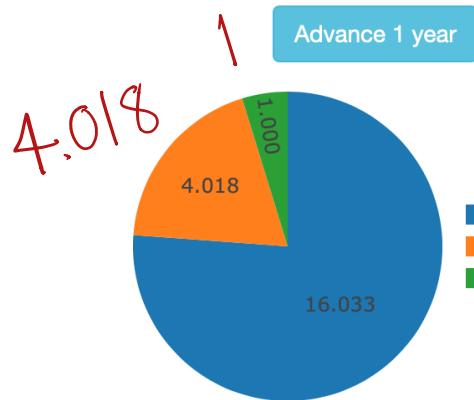


# Rabbits

doubled  
from  
prev.  
year

Randomize starting population

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



4.018

Advance 1 year

16.033

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.

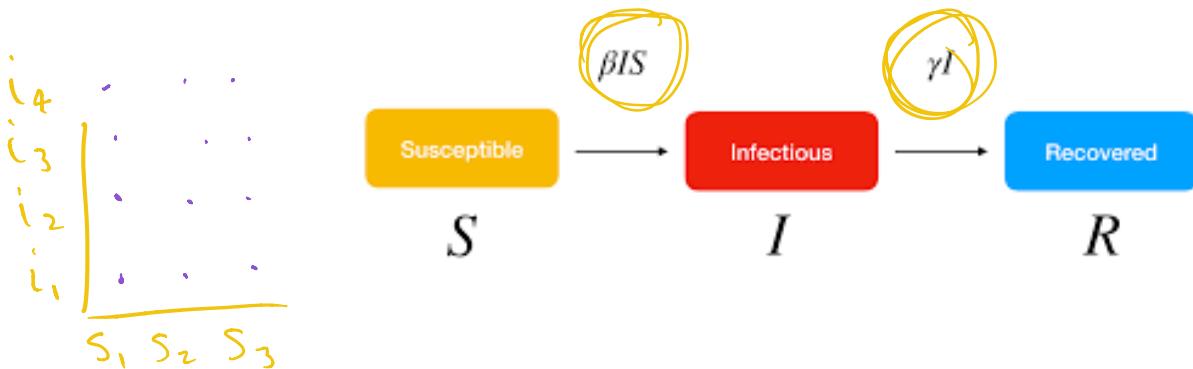
$2 \times 2$  matrix

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

## $R_0$ 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.

The SIR model has compartments for Susceptible, Infected, and Recovered.



The arrows are governed by differential equations (Math 2552). Why do the labels on the arrows make sense? (The greek letters are constants).

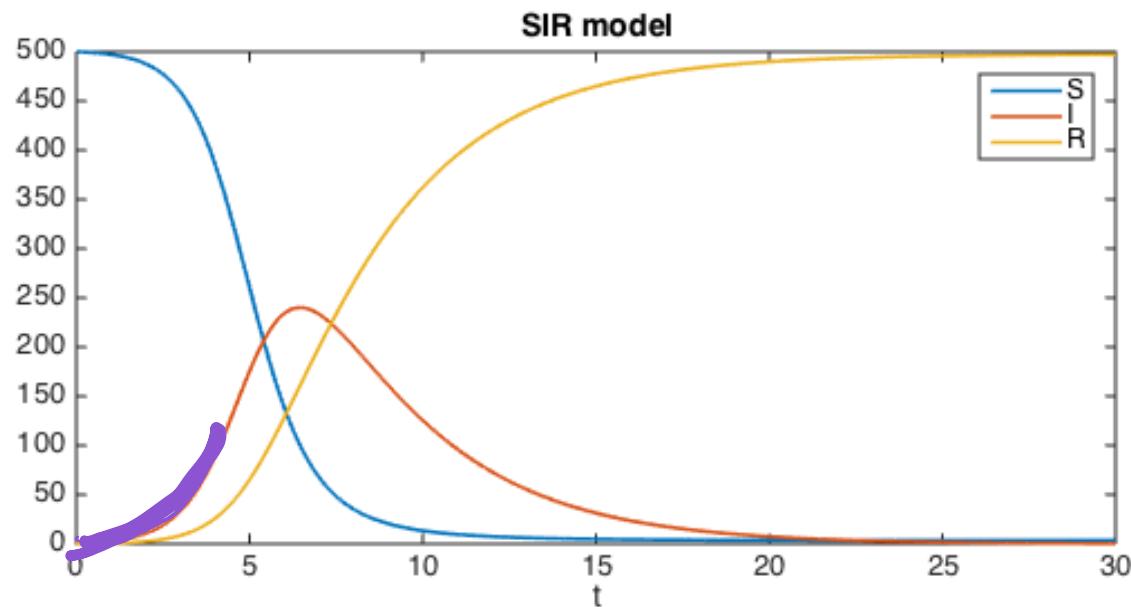
There is a nice discussion of this by James Holland Jones (Stanford).

► Paper

## Bell curves

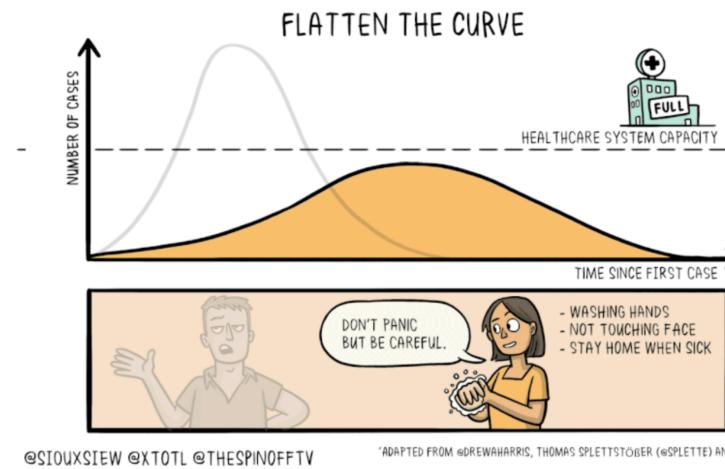
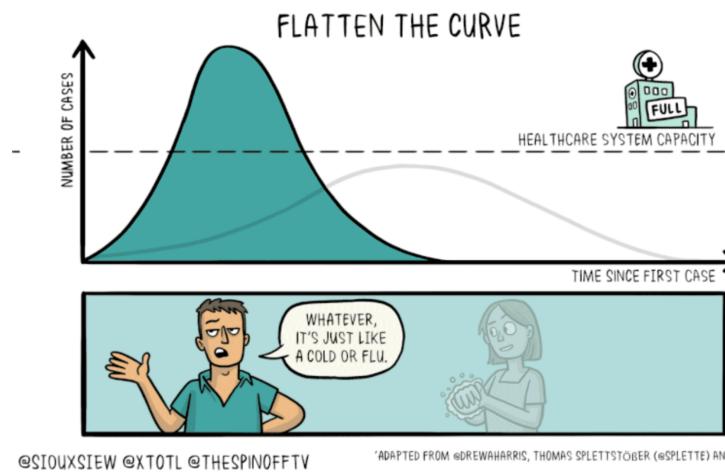


The growth rate of infection does not stay exponential forever, because the recovered population has immunity. That's where you get these bell curves.



# Public Service Announcement

Social distancing decreases  $R_0$



**Go Jackets!**



Keep learning. You guys will be the solution.