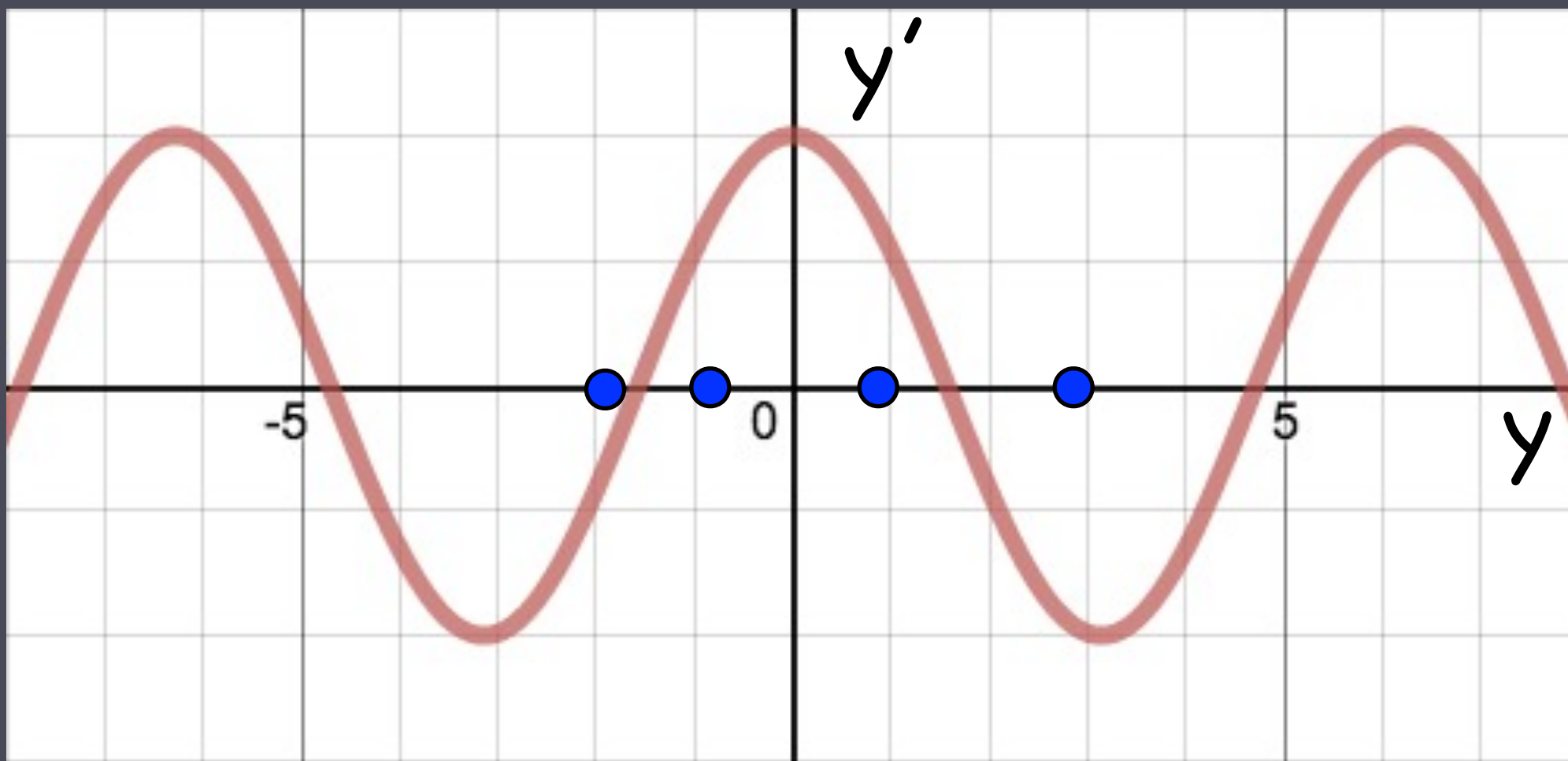


# Today

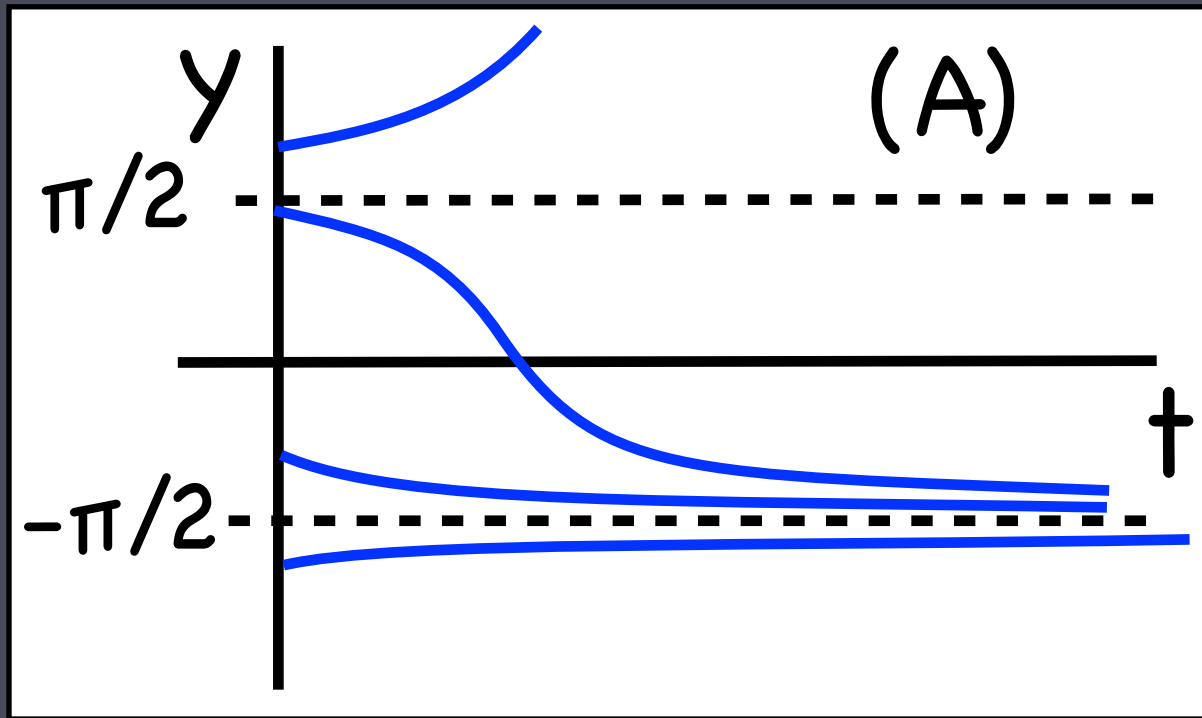
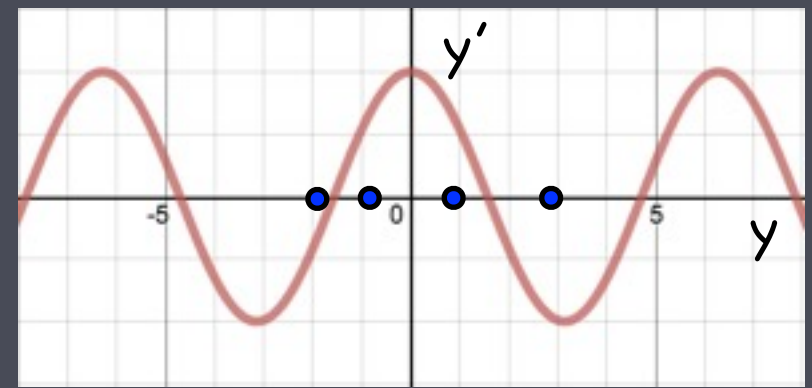
- Phase-line to solution-sketching example (cont).
- Logistic equation in many contexts
  - Classic example of the power of mathematics
    - one unifying description for many apparently unrelated phenomena.

$$y' = \cos(y)$$

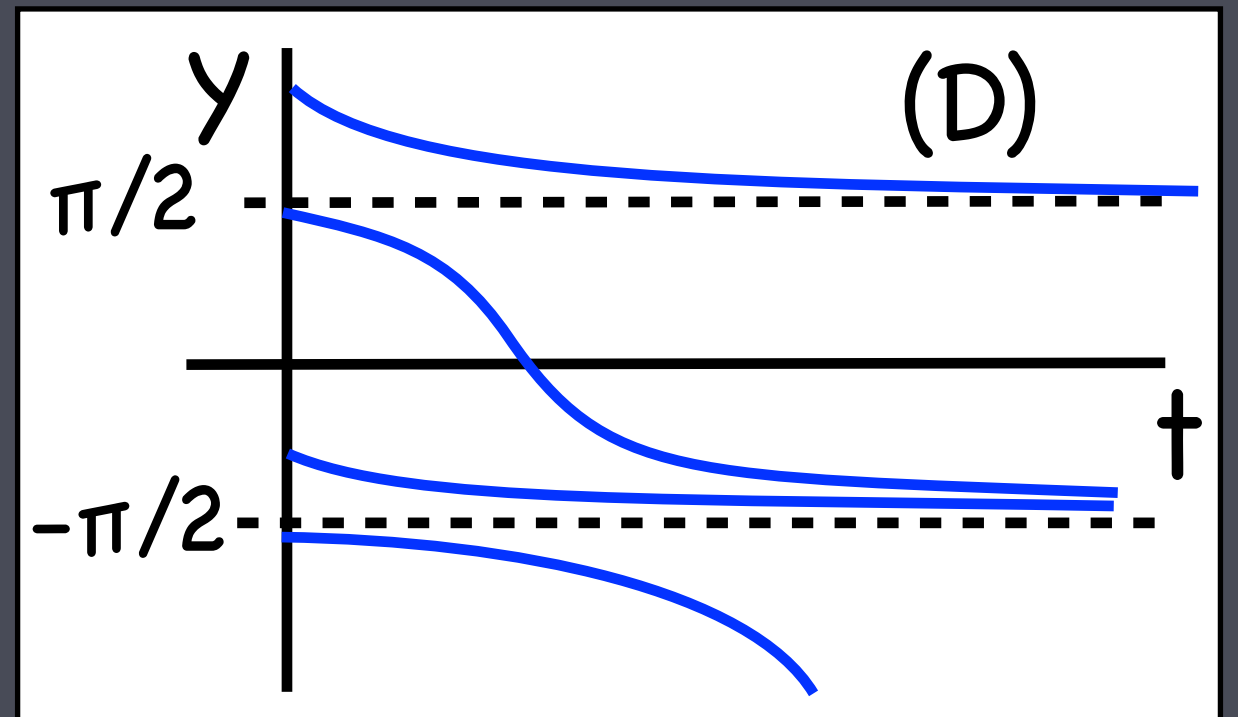
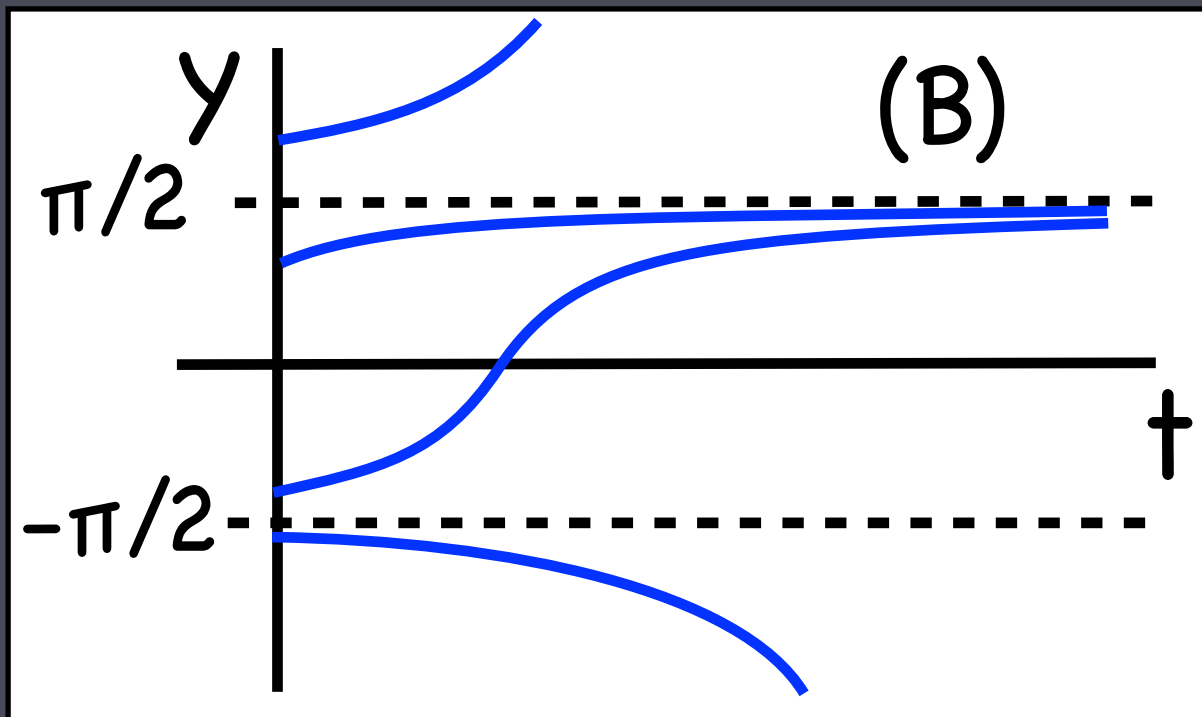
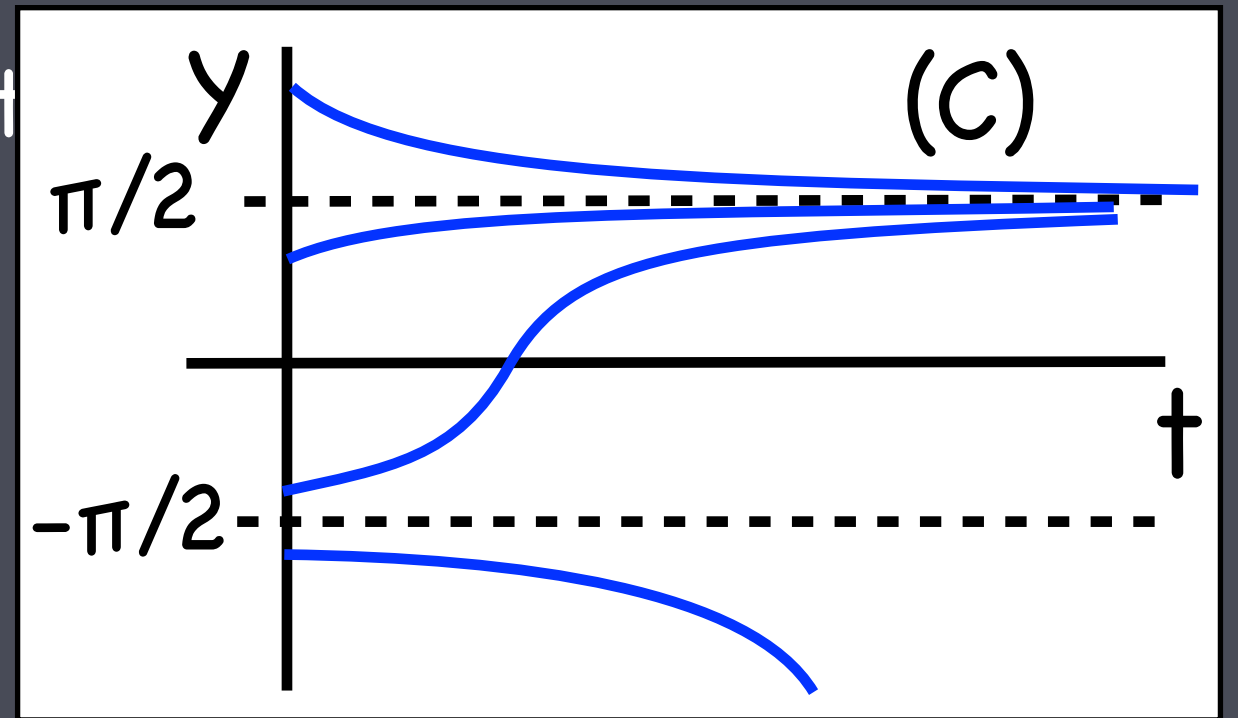
Sketch a few solutions  $y(t)$ .



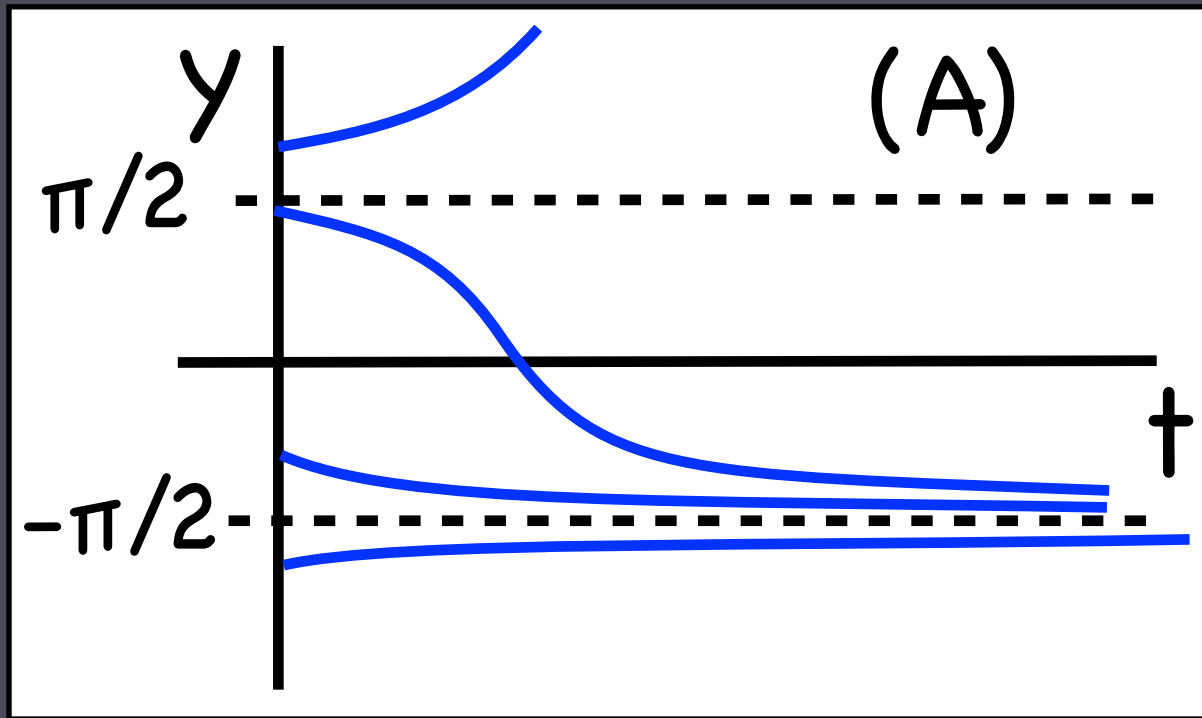
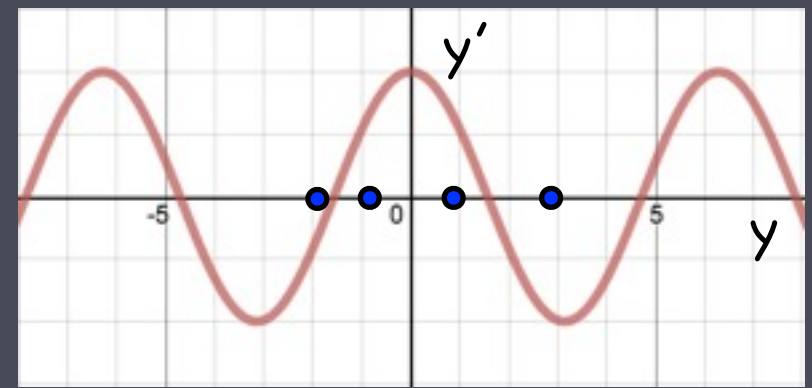
$$y' = \cos(y)$$



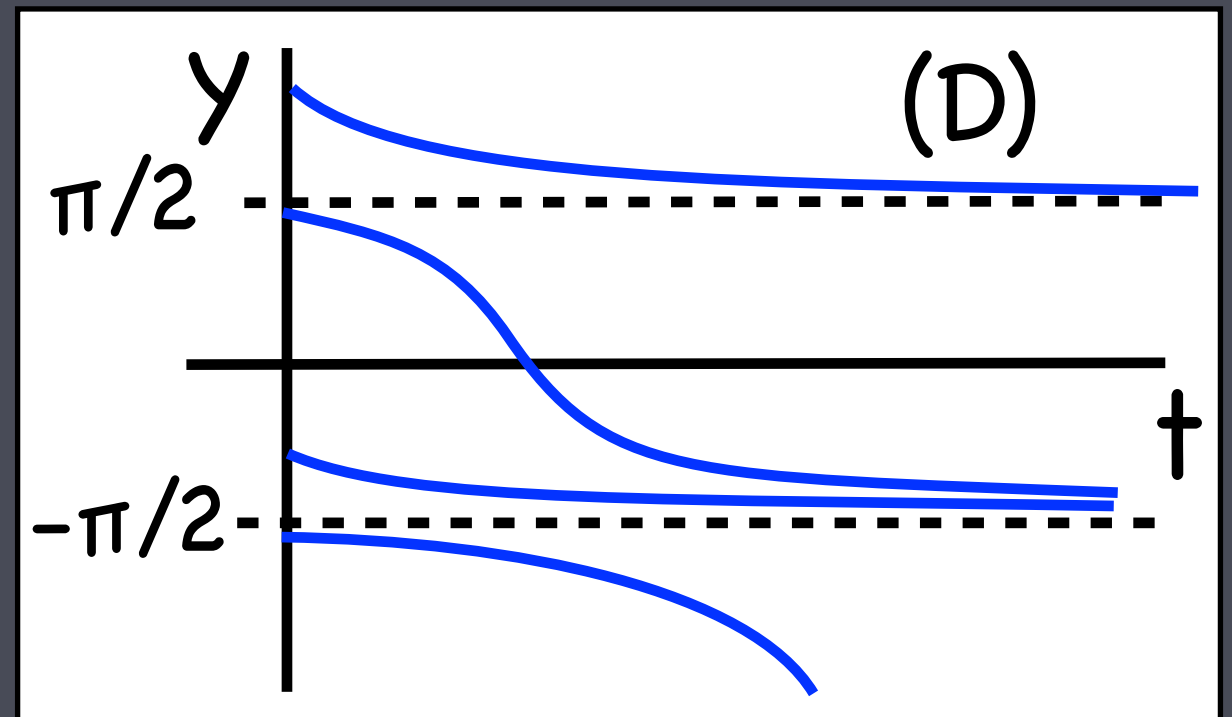
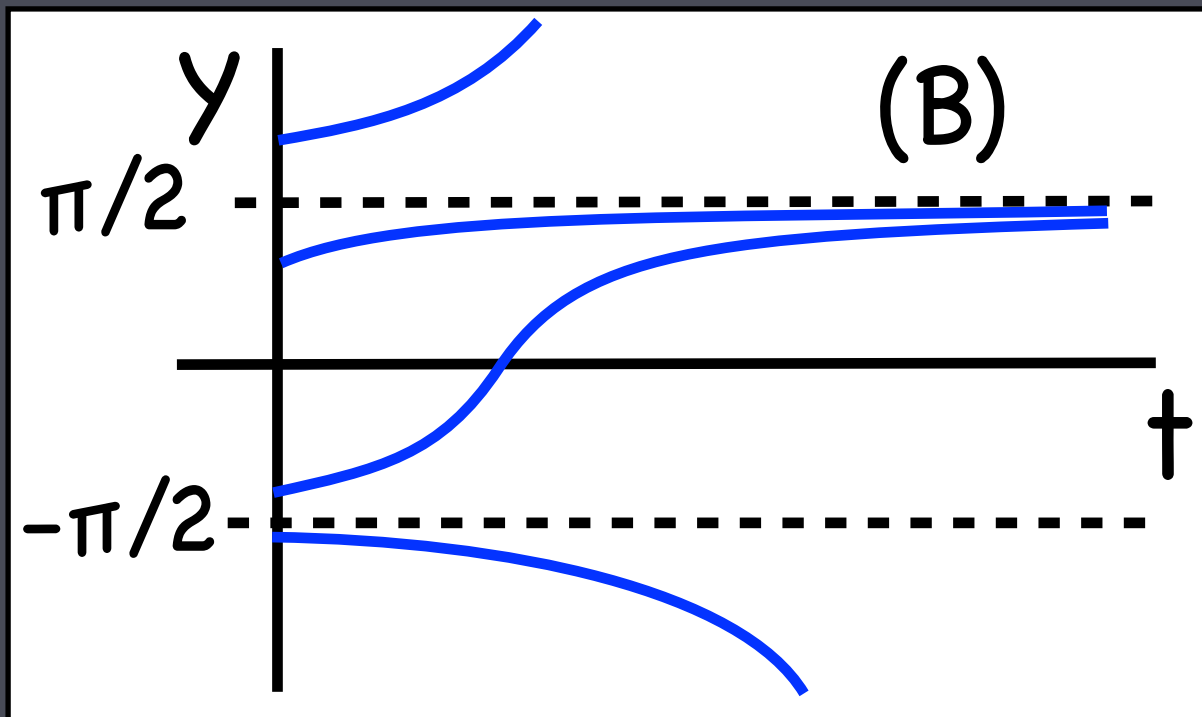
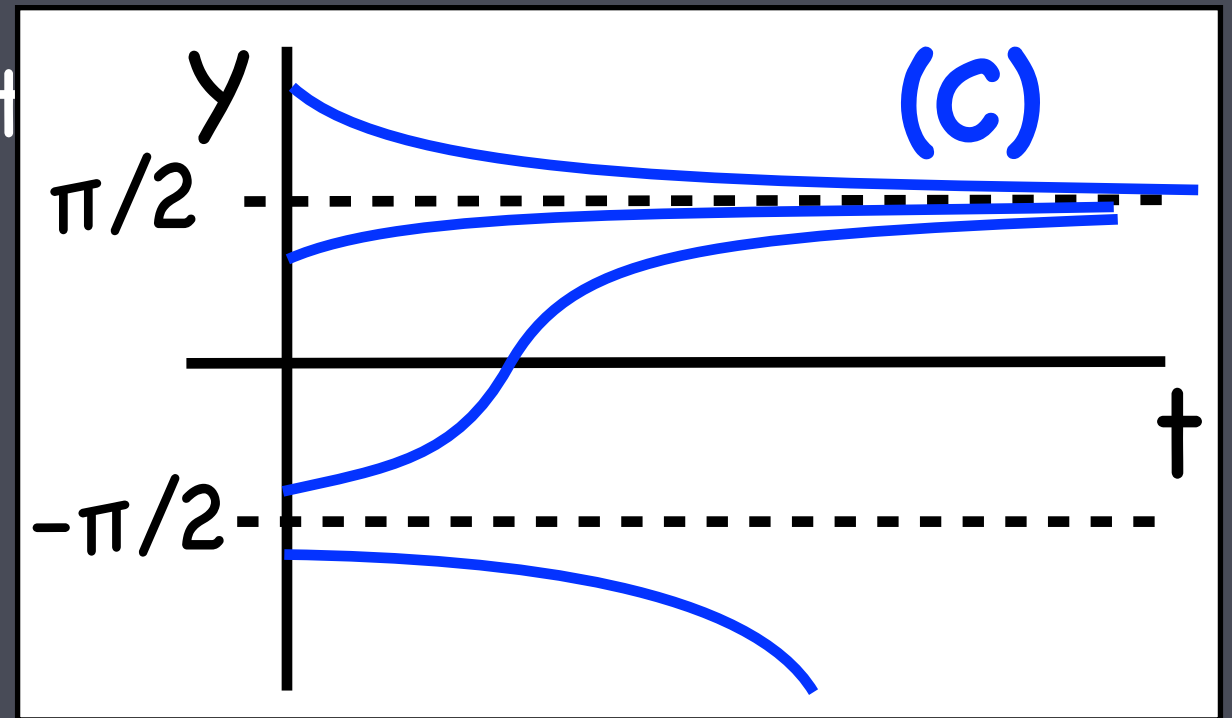
plot



$$y' = \cos(y)$$



plot



# What you should be able to do:

- Identify steady states for a DE.
- Draw/interpret the phase line for a DE.
- Draw/interpret a slope field for a DE.
- Determine stability of steady states.
- Determine long-term behaviour of solutions.
- Sketch the graphs of solutions using phase line and/or slope fields (slopes, concavity, IPs, h-asymptotes).

Rates of change that are  
proportional to two things

# Rates of change that are proportional to two things

- A chemical reaction with only one reactant occurs at a rate proportional to the how much reactant is present (e.g. radioactive decay):

$$\frac{dR}{dt} = -kR$$

# Rates of change that are proportional to two things

- A chemical reaction with only one reactant occurs at a rate proportional to the how much reactant is present (e.g. radioactive decay):

$$\frac{dR}{dt} = -kR$$

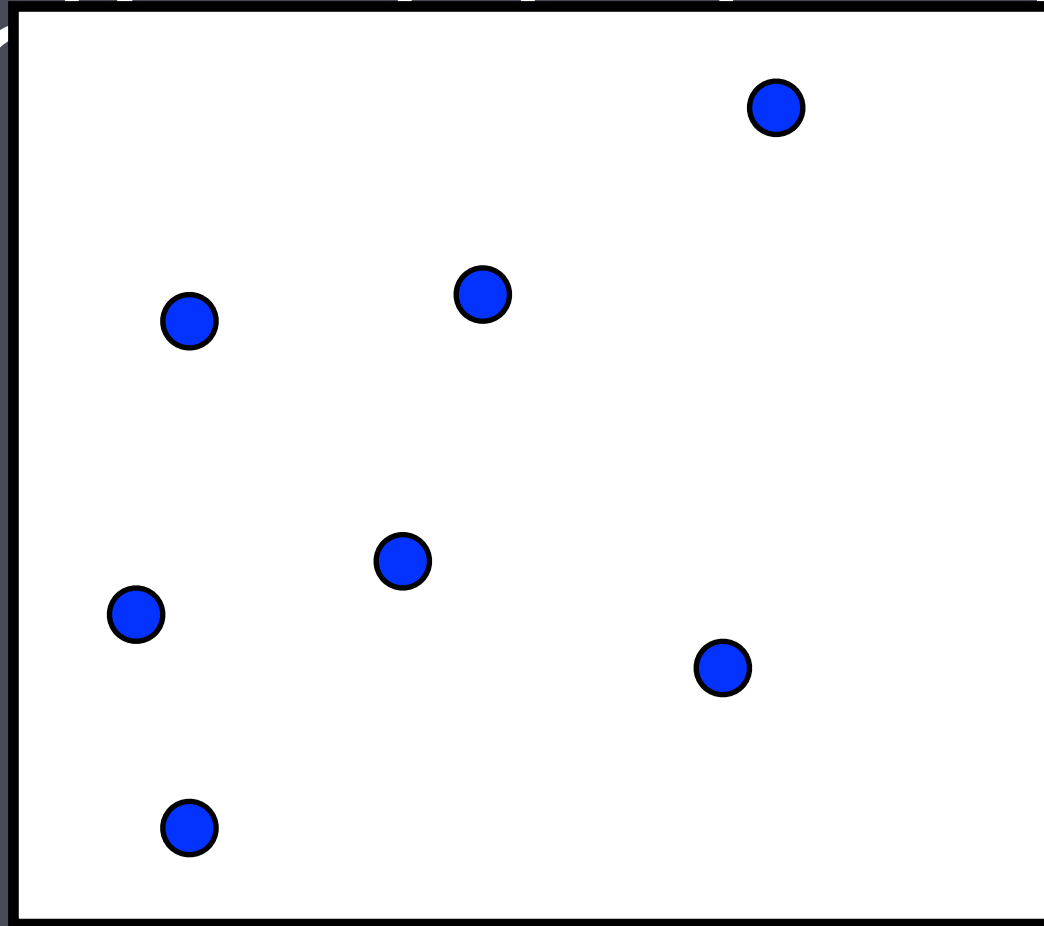
- A chemical reaction with two reactants occurs at a rate proportional to the how much of both reactants are present:

$$\frac{dR_1}{dt} = -kR_1R_2$$



# Rates of change that are proportional to two things

- A chemical reaction occurs at a rate proportional to how much of a reactant is present:



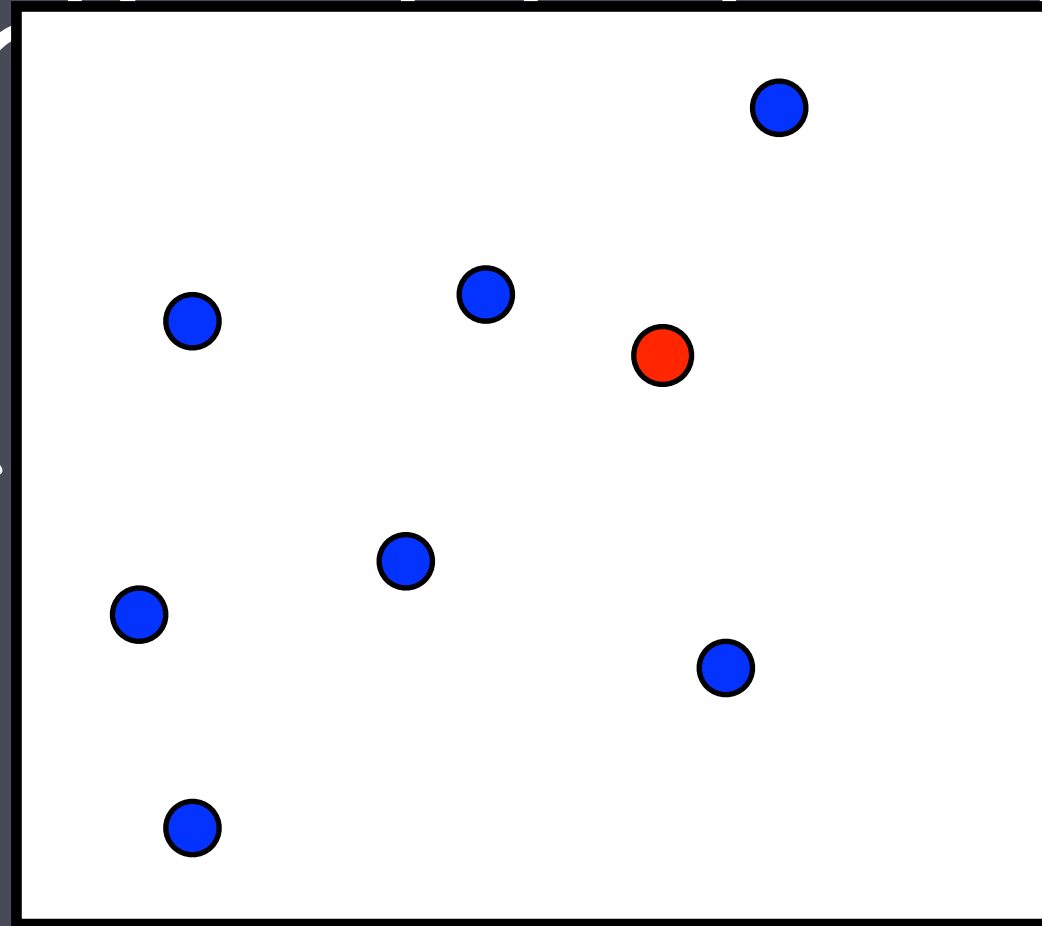
- A chemical reaction with two reactants occurs at a rate proportional to how much of both reactants are present:

- A chemical reaction with two reactants occurs at a rate proportional to the how much of both reactants are present:

$$\frac{dR_1}{dt} = -kR_1R_2$$

# Rates of change that are proportional to two things

- A chemical reaction occurs at a rate proportional to the amount of a reactant is



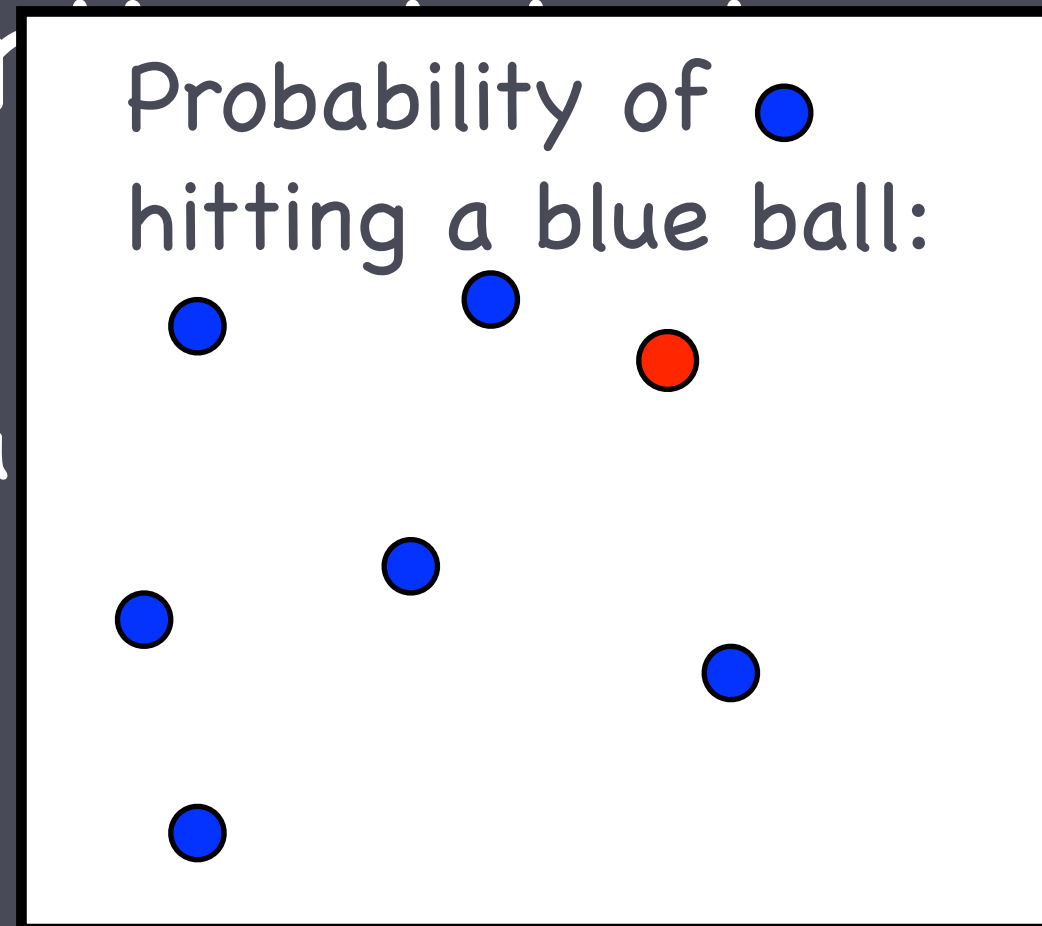
- reactant (how much decay):

- A chemical reaction with two reactants occurs at a rate proportional to the how much of both reactants are present:

$$\frac{dR_1}{dt} = -kR_1R_2$$

# Rates of change that are proportional to things

- A chemical reaction occurs at a rate proportional to the amount of reactant present (how much decay):



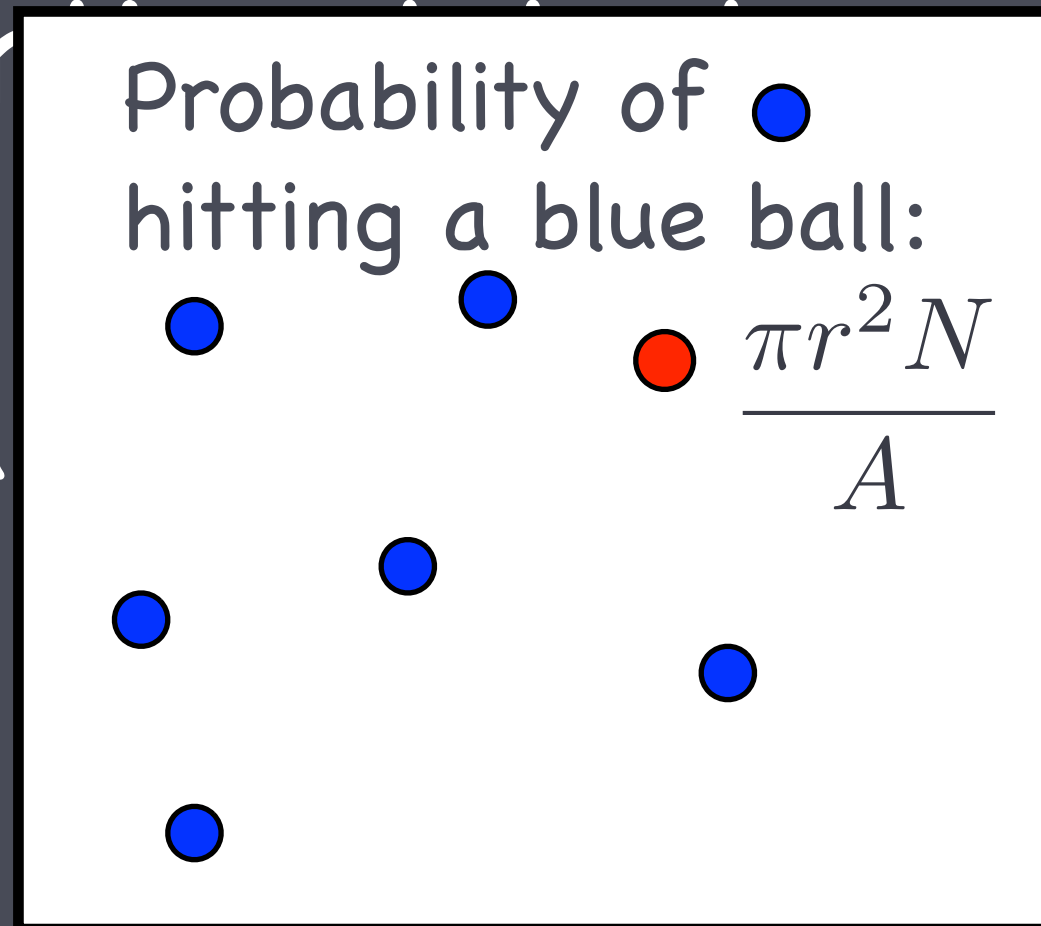
- A chemical reaction with two reactants occurs at a rate proportional to the how much of both reactants are present:

$$\frac{dR_1}{dt} = -kR_1R_2$$

# Rates of change that are proportional to things

- A chemical reaction occurs at a rate proportional to the amount of reactant present (how much decay):

Probability of hitting a blue ball:


$$\frac{\pi r^2 N}{A}$$

- A chemical reaction with two reactants occurs at a rate proportional to the how much of both reactants are present:

$$\frac{dR_1}{dt} = -kR_1R_2$$

# Rates of change that are proportional to things

- A chemical reaction occurs at a rate proportional to the concentration of a reactant (how much of the reactant is present):

Probability of hitting a blue ball:

$\frac{\pi r^2 N}{A}$

$\frac{N}{A} = \text{blue concentration}$

- reactant concentration (how much of the reactant is present):

- A chemical reaction with two reactants occurs at a rate proportional to the how much of both reactants are present:

$$\frac{dR_1}{dt} = -kR_1R_2$$

# Rates of change that are proportional to things

- A chemical reaction occurs at a rate proportional to the concentration of a reactant (how much of the reactant is present):

Probability of hitting a blue ball:

$\frac{\pi r^2 N}{A}$

$\frac{N}{A} = \text{blue concentration}$

- A chemical reaction with two reactants occurs at a rate proportional to the how much of both reactants are present:

$$\frac{dR_1}{dt} = -kR_1R_2$$

Logistic equation in  
different contexts...

Rates of change that are  
proportional to two things



# Rates of change that are proportional to two things

- Infectious disease:  $bSI$  (S=susceptible, I=infected)

# Rates of change that are proportional to two things

- Infectious disease:  $bSI$  (S=susceptible, I=infected)
- Spread of rumour:  $bNH$  (N = not heard rumour, H = heard rumour)

# Rates of change that are proportional to two things

- Infectious disease:  $bSI$  (S=susceptible, I=infected)
- Spread of rumour:  $bNH$  (N = not heard rumour, H = heard rumour)
- Spread of new words:  $bNU$  (use word or not).

# Rates of change that are proportional to two things

- Infectious disease:  $bSI$  (S=susceptible, I=infected)
- Spread of rumour:  $bNH$  (N = not heard rumour, H = heard rumour)
- Spread of new words:  $bNU$  (use word or not).
- Spread of new technologies:  $bNU$  (use tech or not).

# Rates of change that are proportional to two things

- Infectious disease: **bSI** (S=susceptible, I=infected)
- Spread of rumour: **bNH** (N = not heard rumour, H = heard rumour)
- Spread of new words: **bNU** (use word or not).
- Spread of new technologies: **bNU** (use tech or not).
- Active oil exploration sites: **bUD** (undiscovered and discovered).

# Rates of change that are proportional to two things

- Infectious disease: **bSI** (S=susceptible, I=infected)
- Spread of rumour: **bNH** (N = not heard rumour, H = heard rumour)
- Spread of new words: **bNU** (use word or not).
- Spread of new technologies: **bNU** (use tech or not).
- Active oil exploration sites: **bUD** (undiscovered and discovered).
- Waterlillies in a pond: **bSW** (waterlillies and space for waterwillies).

...two things that are just  
different forms of a single thing

...two things that are just  
different forms of a single thing

- When X meets Y, there's a chance Y turns into X.



...two things that are just different forms of a single thing

• When X meets Y, there's a chance Y turns into X.

• Lose Y:  $\frac{dY}{dt} = -bXY$  and gain X:  $\frac{dX}{dt} = bXY$

...two things that are just different forms of a single thing

• When X meets Y, there's a chance Y turns into X.

• Lose Y:  $\frac{dY}{dt} = -bXY$  and gain X:  $\frac{dX}{dt} = bXY$

•  $X+Y = \text{constant} = C$  so  $Y=C-X$ .

...two things that are just different forms of a single thing

• When X meets Y, there's a chance Y turns into X.

• Lose Y:  $\frac{dY}{dt} = -bXY$  and gain X:  $\frac{dX}{dt} = bXY$

•  $X+Y = \text{constant} = C$  so  $Y=C-X$ .

•  $\frac{dX}{dt} = bX(C - X)$

# Infectious disease

**Dr. Erin Mears:** Once we know the  $R_0$ , we'll be able to get a handle on the scale of the epidemic.

**Minnesota Health #4:** So, it's an epidemic now. An epidemic of what?

**Dave:** We sent samples to the CDC.

**Dr. Erin Mears:** In seventy two hours, we'll know what it is, if we're lucky.

**Minnesota Health #4:** Clearly, we're not lucky.



# Infectious disease

# Infectious disease

- $N$  individuals,  $I$  of them have a flu,  $S=N-I$  do not.

# Infectious disease

- $N$  individuals,  $I$  of them have a flu,  $S=N-I$  do not.
- If everyone interacts, new cases appear at a rate proportional to  $SI$ .

# Infectious disease

- $N$  individuals,  $I$  of them have a flu,  $S=N-I$  do not.
- If everyone interacts, new cases appear at a rate proportional to  $SI$ .
- The DE describing the spread of disease:



# Infectious disease

- $N$  individuals,  $I$  of them have a flu,  $S=N-I$  do not.
- If everyone interacts, new cases appear at a rate proportional to  $SI$ .
- The DE describing the spread of disease:

$$(A) \quad \frac{dI}{dt} = -bI(N - I)$$

$$(C) \quad \frac{dS}{dt} = -bSI$$

$$(B) \quad \frac{dI}{dt} = bI(N - I)$$

$$(D) \quad \frac{dI}{dt} = bSI$$

# Infectious disease

- $N$  individuals,  $I$  of them have a flu,  $S=N-I$  do not.
- If everyone interacts, new cases appear at a rate proportional to  $SI$ .
- The DE describing the spread of disease:

$$(A) \quad \frac{dI}{dt} = -bI(N - I)$$

$$(C) \quad \frac{dS}{dt} = -bSI$$

$$(B) \quad \frac{dI}{dt} = bI(N - I)$$

$$(D) \quad \frac{dI}{dt} = bSI$$

- Compare this with  $\frac{dP}{dt} = rP \left(1 - \frac{P}{K}\right)$ .

# Infectious disease

What is the carrying capacity?

$$\frac{dI}{dt} = bI(N - I)$$

(A)  $b/N$

(C)  $I$

(B)  $N/b$

(D)  $N$

# Infectious disease

What is the carrying capacity?

$$\frac{dI}{dt} = bI(N - I)$$

(A)  $b/N$

(C)  $I$

(B)  $N/b$

(D)  $N$

$$\frac{dP}{dt} = rP \left( 1 - \frac{P}{K} \right)$$

# Infectious disease

What is the carrying capacity?

$$\frac{dI}{dt} = bI(N - I) = bNI \left(1 - \frac{I}{N}\right)$$

(A)  $b/N$

(C)  $I$

(B)  $N/b$

(D)  $N$

$$\frac{dP}{dt} = rP \left(1 - \frac{P}{K}\right)$$

# Infectious disease

What is the carrying capacity?

$$\frac{dI}{dt} = bI(N - I) = \underbrace{bNI}_r \left(1 - \frac{I}{N}\right)$$

(A)  $b/N$

(C)  $I$

(B)  $N/b$

(D)  $N$

$$\frac{dP}{dt} = rP \left(1 - \frac{P}{K}\right)$$

# Infectious disease

What is the carrying capacity?

$$\frac{dI}{dt} = bI(N - I) = \underbrace{bNI}_r \left( 1 - \underbrace{\frac{I}{N}}_K \right)$$

(A)  $b/N$

(C)  $I$

(B)  $N/b$

(D)  $N$

$$\frac{dP}{dt} = rP \left( 1 - \frac{P}{K} \right)$$

# Infectious disease

What is the carrying capacity?

$$\frac{dI}{dt} = bI(N - I) = \underbrace{bNI}_r \left( 1 - \underbrace{\frac{I}{N}}_K \right)$$

(A)  $b/N$

(C)  $I$

(B)  $N/b$

(D)  $N$

Everyone  
gets sick!

$$\frac{dP}{dt} = rP \left( 1 - \frac{P}{K} \right)$$



# Infectious disease

# Infectious disease

- Suppose infected people recover at a rate proportional to how many there are.

# Infectious disease

- Suppose infected people recover at a rate proportional to how many there are.
- The DE describing the spread of disease with recovery:

$$(A) \quad \frac{dI}{dt} = bI(N - I) - \mu S \qquad (C) \quad \frac{dI}{dt} = -bI(N - I) + \mu I$$

$$(B) \quad \frac{dI}{dt} = bI(N - I) - \mu I \qquad (D) \quad \frac{dI}{dt} = bI(N - I) + \mu I$$

# Infectious disease

$$\frac{dI}{dt} = bI(N - I) - \mu I$$

# Infectious disease

$$\begin{aligned}\frac{dI}{dt} &= bI(N - I) - \mu I \\ &= bIN - bI^2 - \mu I\end{aligned}$$

# Infectious disease

$$\begin{aligned}\frac{dI}{dt} &= bI(N - I) - \mu I \\ &= bIN - bI^2 - \mu I \\ &= bI \left( N - \frac{\mu}{b} - I \right)\end{aligned}$$

# Infectious disease

$$\frac{dI}{dt} = bI(N - I) - \mu I$$

$$= bIN - bI^2 - \mu I$$

$$= bI \left( N - \frac{\mu}{b} - I \right)$$

$K$

# Infectious disease

$$\frac{dI}{dt} = bI(N - I) - \mu I$$

$$= bIN - bI^2 - \mu I$$

$$= bI \left( N - \frac{\mu}{b} - I \right)$$

$K$

If  $\frac{\mu}{b} > N$  then

$$K = N - \frac{\mu}{b} < 0$$



# Infectious disease

$$\frac{dI}{dt} = bI(N - I) - \mu I$$

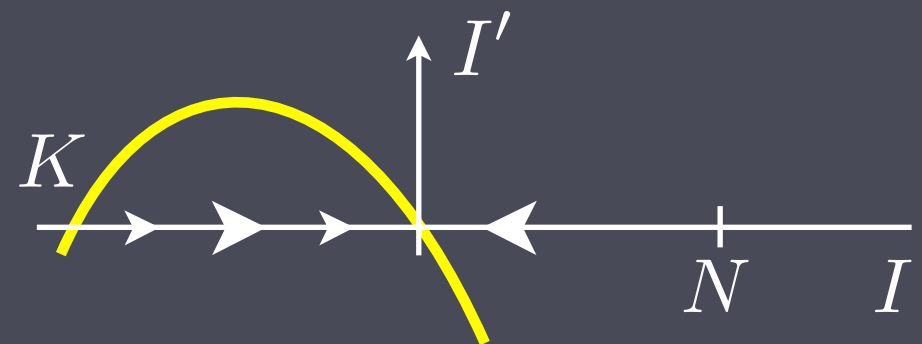
$$= bIN - bI^2 - \mu I$$

$$= bI \left( N - \frac{\mu}{b} - I \right)$$

$K$

If  $\frac{\mu}{b} > N$  then

$$K = N - \frac{\mu}{b} < 0$$



# Infectious disease

$$\frac{dI}{dt} = bI(N - I) - \mu I$$

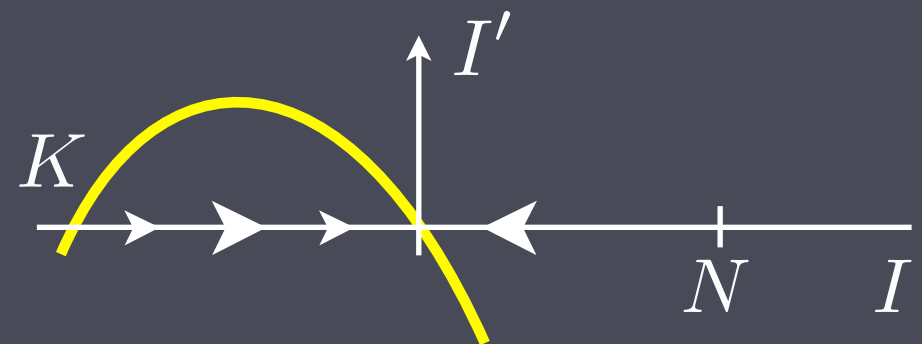
$$= bIN - bI^2 - \mu I$$

$$= bI \left( N - \frac{\mu}{b} - I \right)$$

$K$

If  $\frac{\mu}{b} > N$  then

$$K = N - \frac{\mu}{b} < 0$$



and the disease dies out.

# Infectious disease

$$\frac{dI}{dt} = bI(N - I) - \mu I$$

$$= bIN - bI^2 - \mu I$$

$$= bI \left( N - \frac{\mu}{b} - I \right)$$

$K$

# Infectious disease

$$\frac{dI}{dt} = bI(N - I) - \mu I$$

$$= bIN - bI^2 - \mu I$$

$$= bI \left( N - \frac{\mu}{b} - I \right)$$

$K$

If  $\frac{\mu}{b} < N$  then

$$K = N - \frac{\mu}{b} > 0$$

# Infectious disease

$$\frac{dI}{dt} = bI(N - I) - \mu I$$

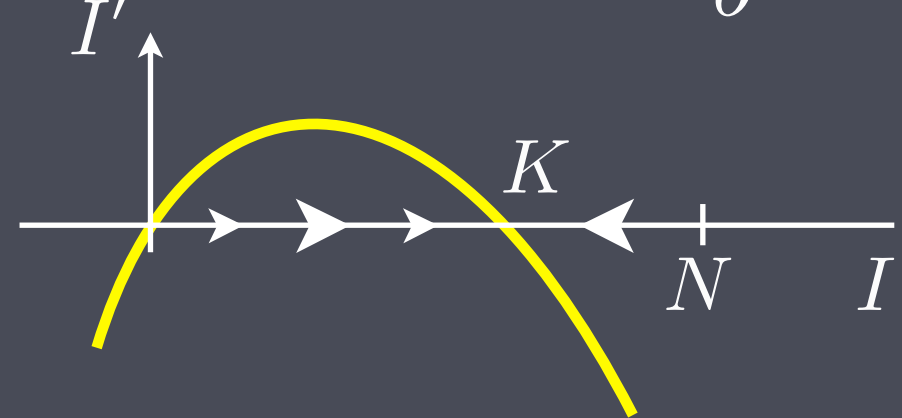
$$= bIN - bI^2 - \mu I$$

$$= bI \left( N - \frac{\mu}{b} - I \right)$$

$K$

If  $\frac{\mu}{b} < N$  then

$$K = N - \frac{\mu}{b} > 0$$



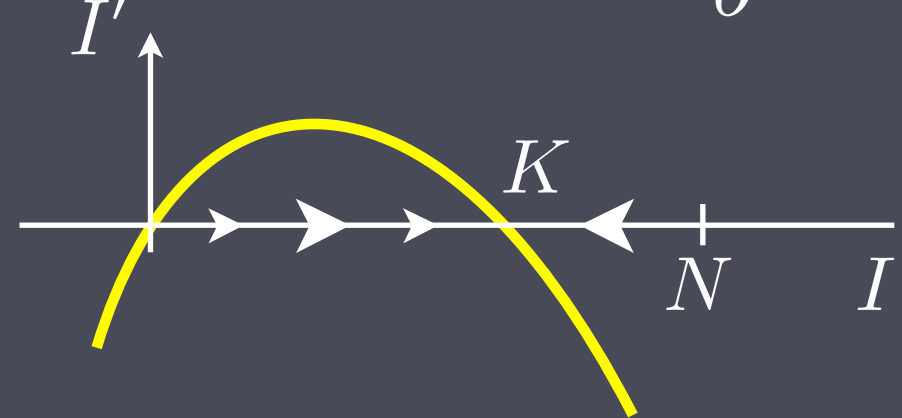
# Infectious disease

$$\begin{aligned}\frac{dI}{dt} &= bI(N - I) - \mu I \\ &= bIN - bI^2 - \mu I \\ &= bI \left( N - \frac{\mu}{b} - I \right)\end{aligned}$$

$K$

If  $\frac{\mu}{b} < N$  then

$$K = N - \frac{\mu}{b} > 0$$



and the disease becomes an epidemic.

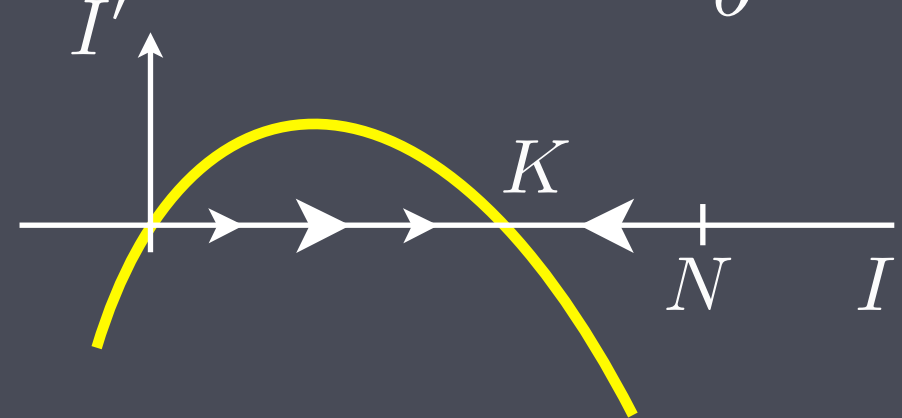
# Infectious disease

$$\begin{aligned}\frac{dI}{dt} &= bI(N - I) - \mu I \\ &= bIN - bI^2 - \mu I \\ &= bI \left( N - \frac{\mu}{b} - I \right)\end{aligned}$$

$K$

If  $\frac{\mu}{b} < N$  then

$$K = N - \frac{\mu}{b} > 0$$



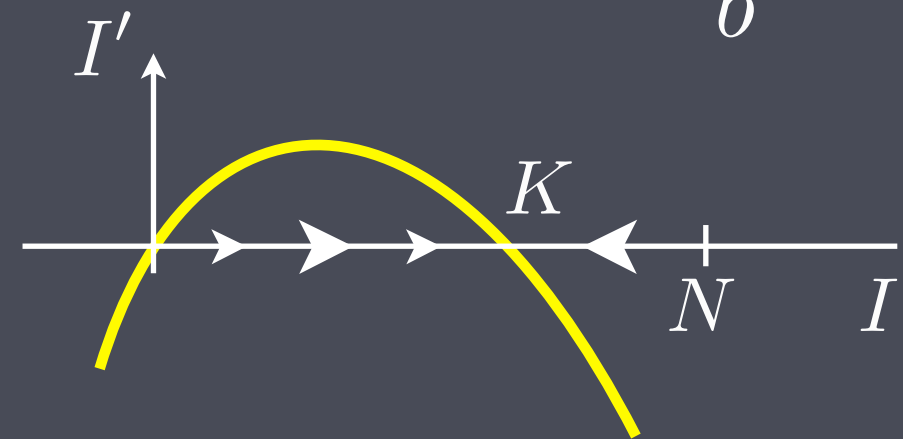
and the disease becomes an epidemic.

$$R_0 = \frac{Nb}{\mu} > 1$$

# Infectious disease

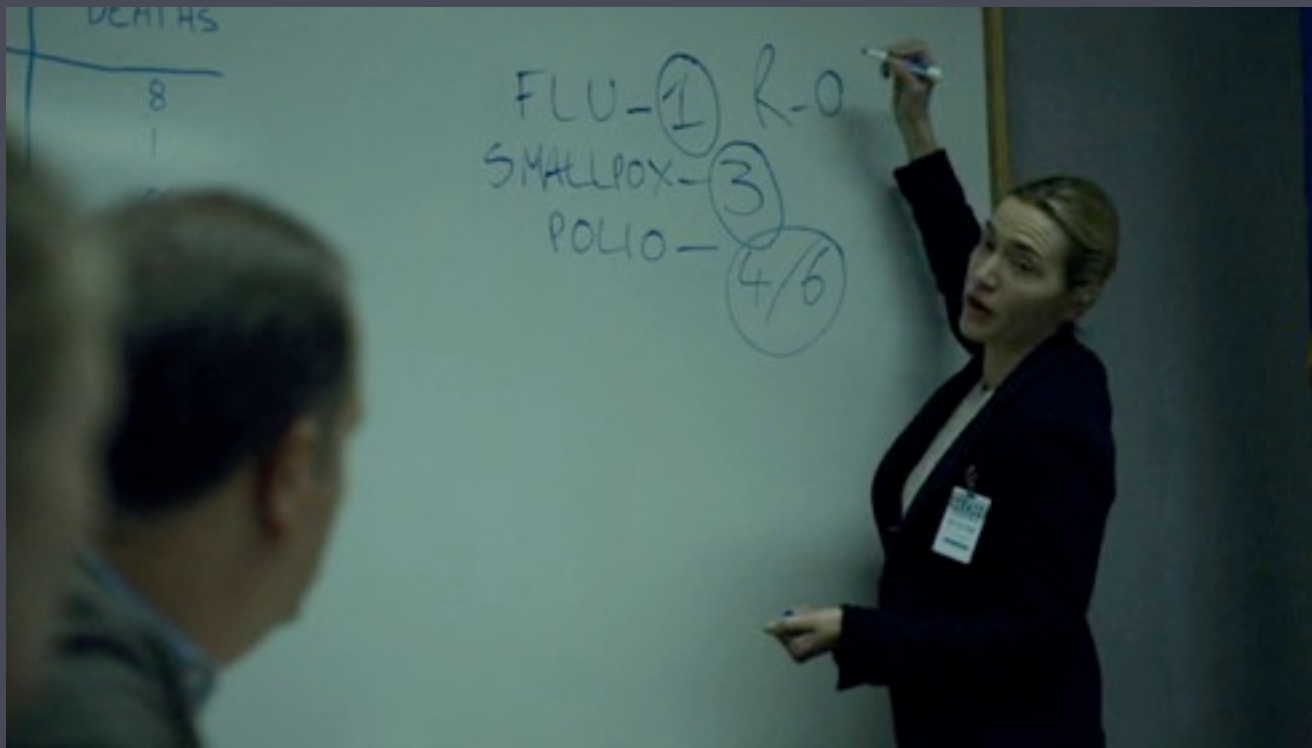
If  $\frac{\mu}{b} < N$  then

$$K = N - \frac{\mu}{b} > 0$$



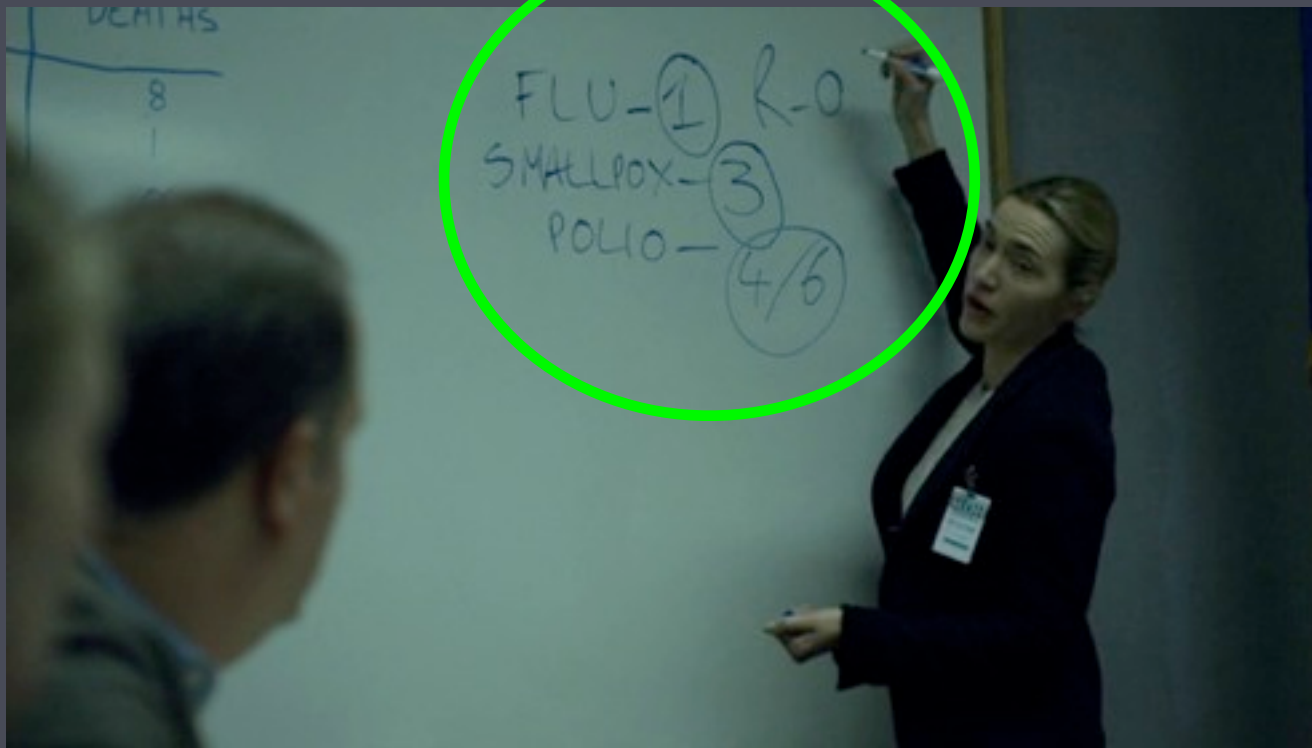
and the disease becomes an epidemic.

$$R_0 = \frac{Nb}{\mu} > 1$$



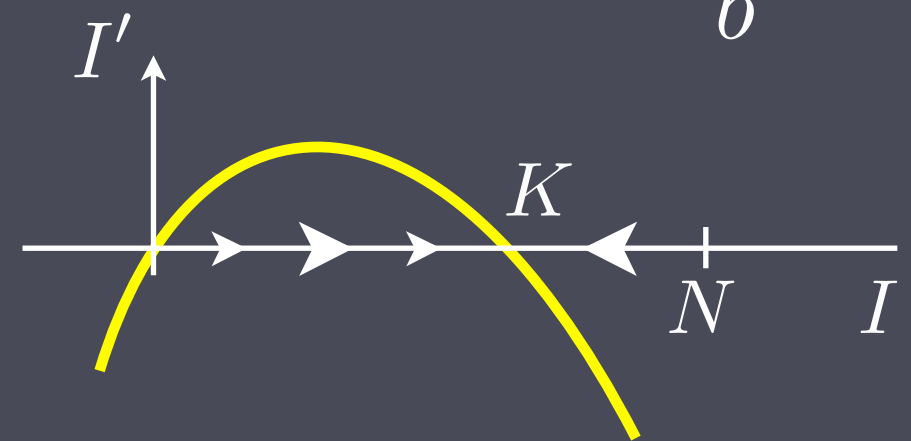


# Infectious disease



If  $\frac{\mu}{b} < N$  then

$$K = N - \frac{\mu}{b} > 0$$

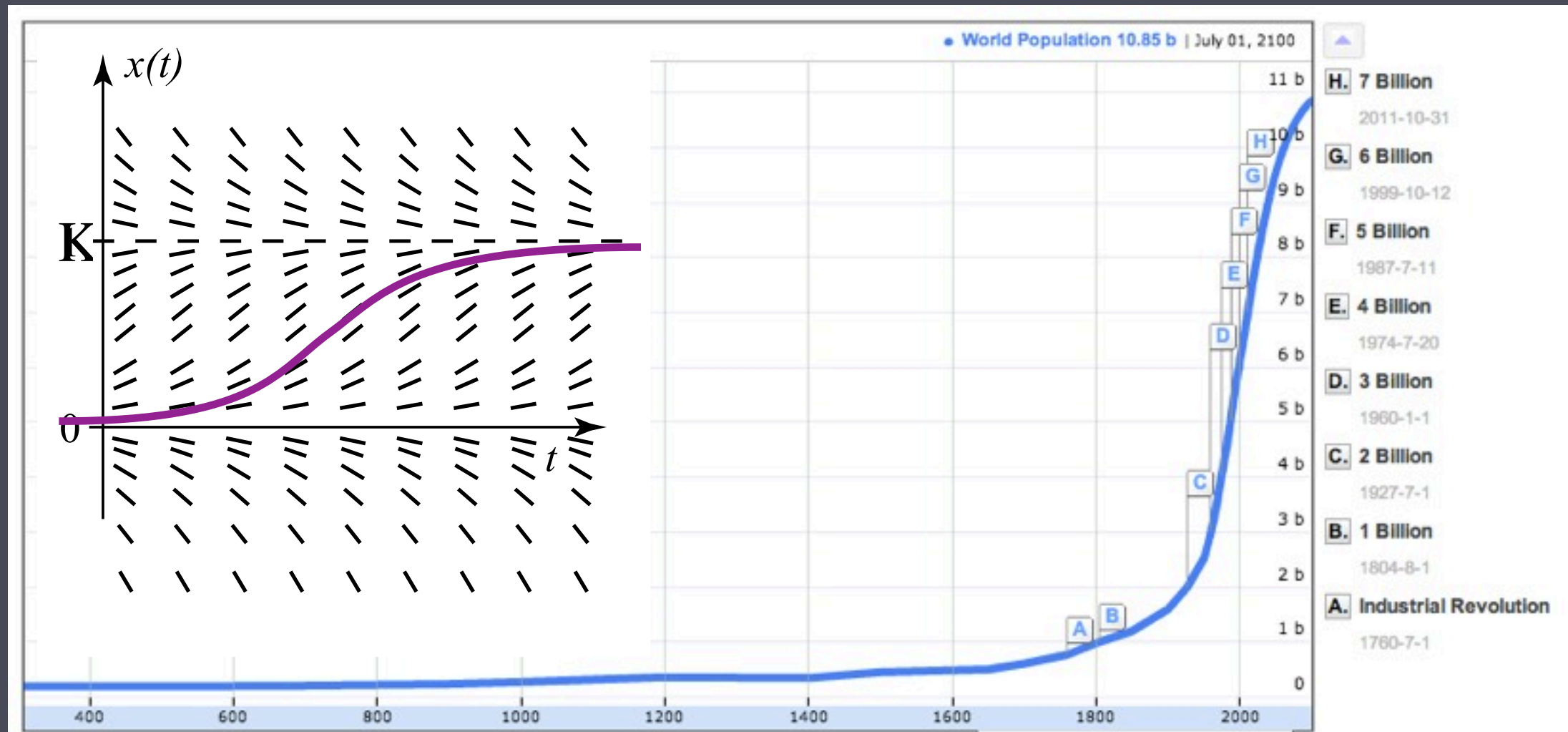


and the disease becomes an epidemic.

$$R_0 = \frac{Nb}{\mu} > 1$$

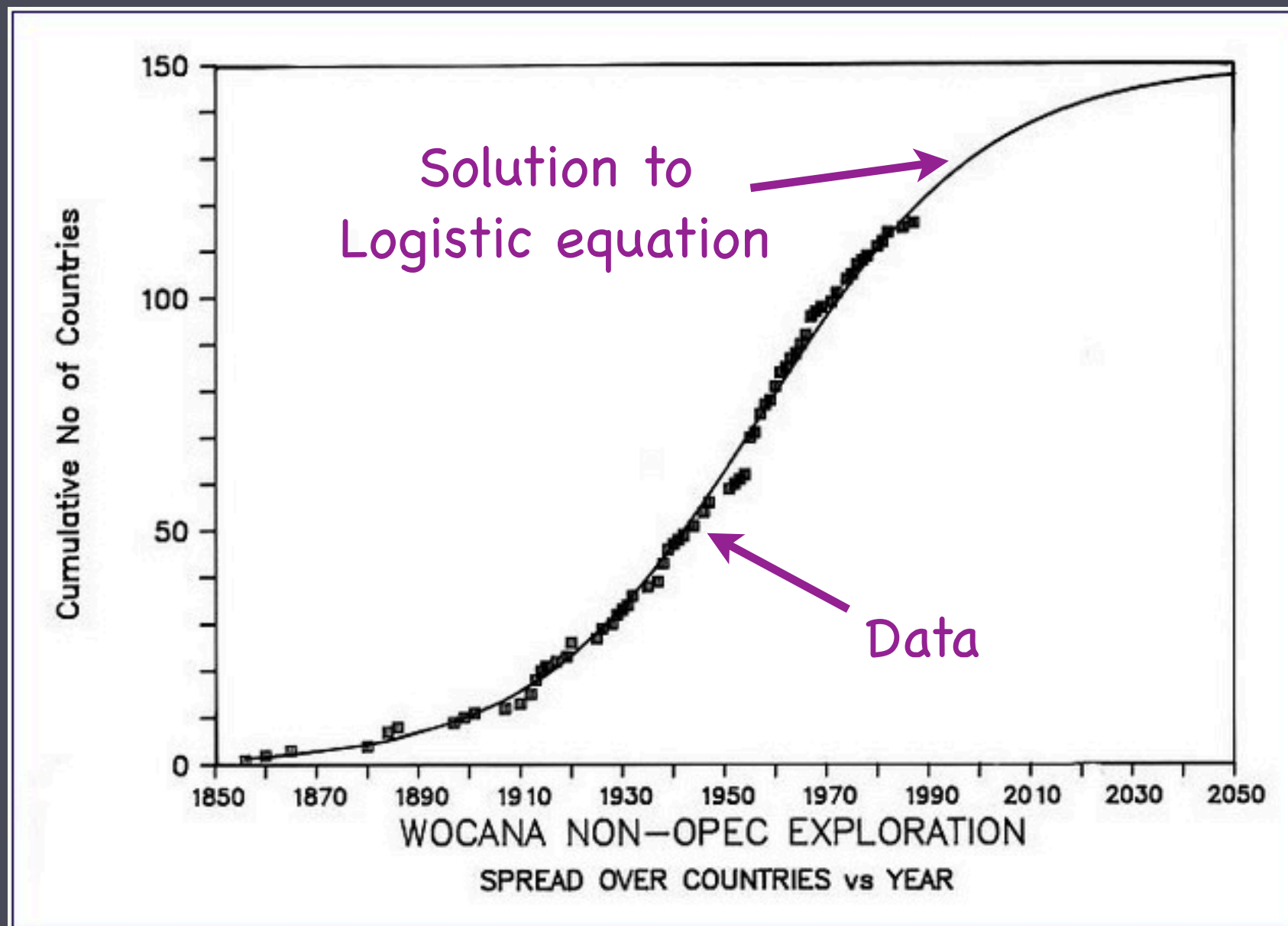
# Some other logistic systems

# Human population



We're past the inflection point  
- estimate  $K \approx 10$  billion

# Number of countries with active oil exploration



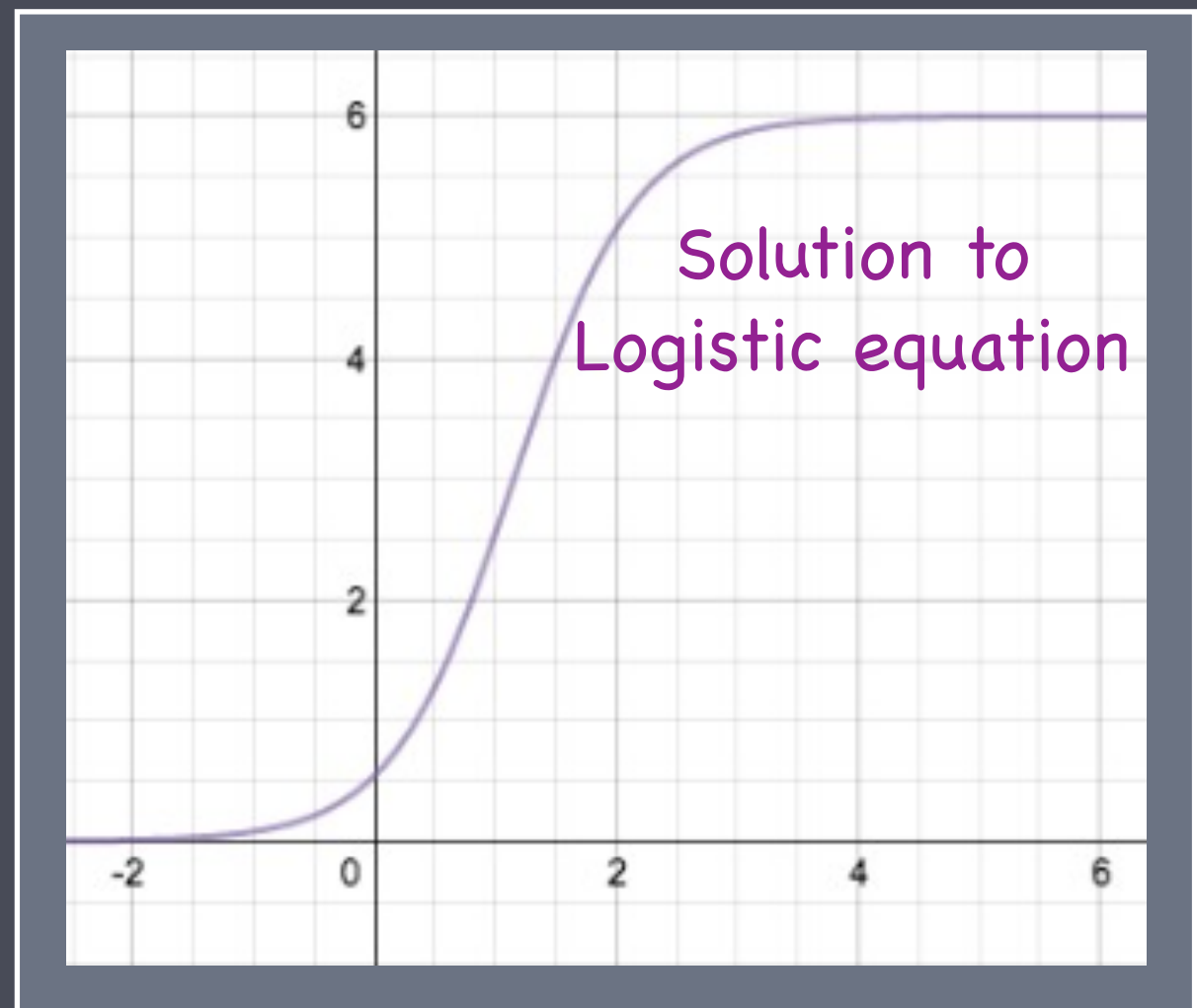
<http://www.mhnederlof.nl/kinghubbert.html>

# American peak oil production

Oil economists talk  
about production rate  
rather than total  
produced so...

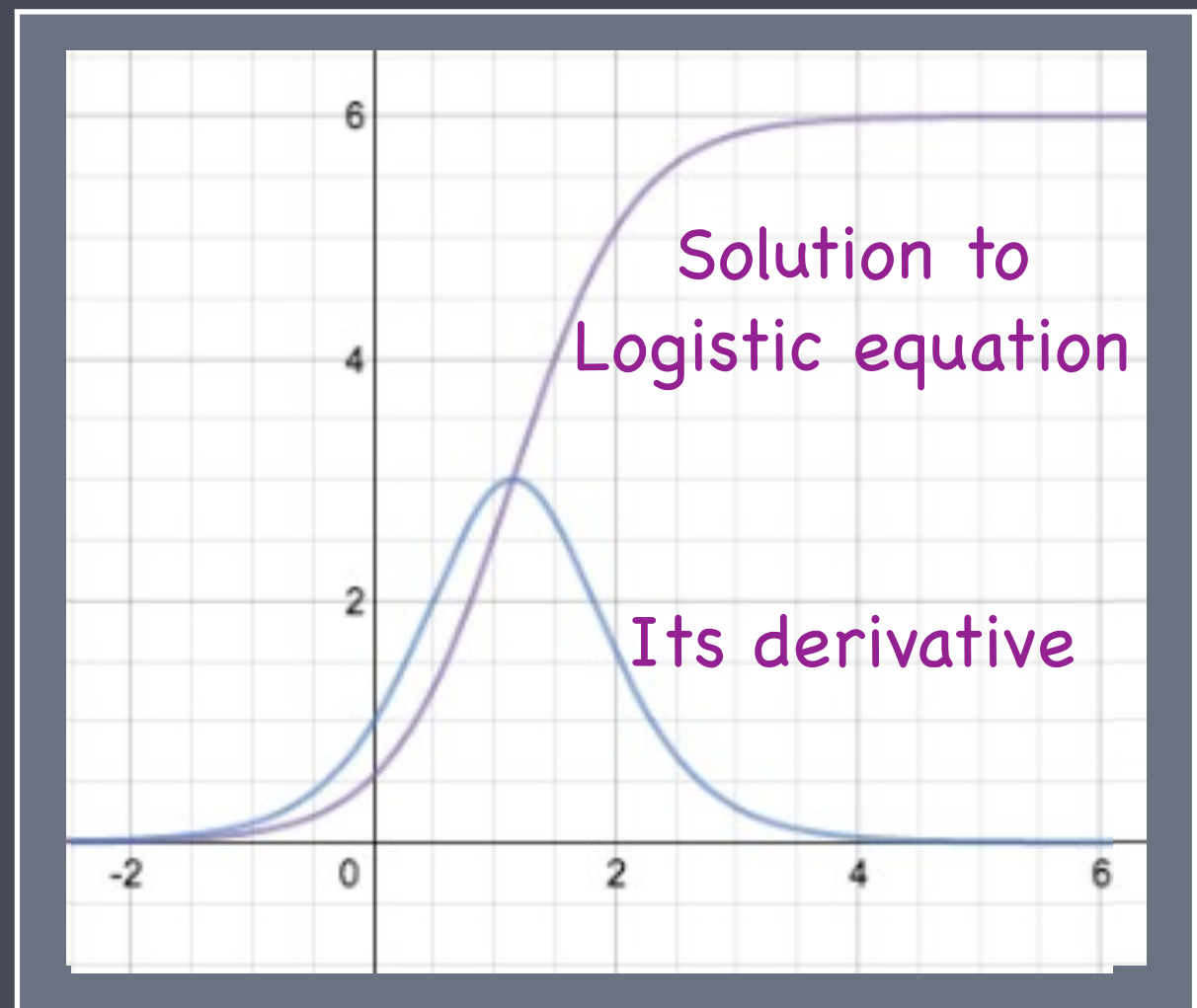
# American peak oil production

Oil economists talk about production rate rather than total produced so...

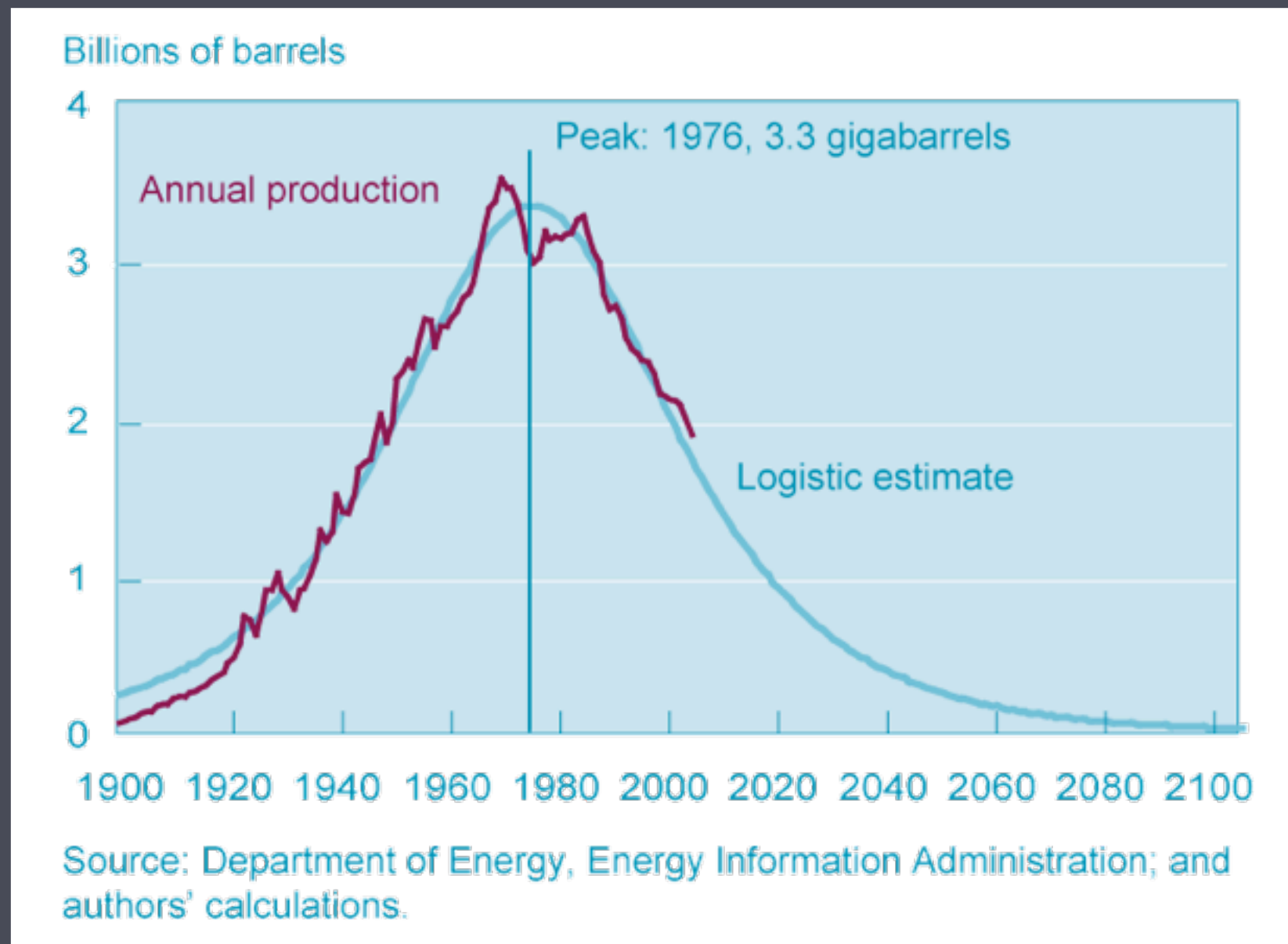


# American peak oil production

Oil economists talk about production rate rather than total produced so...



# American peak oil production

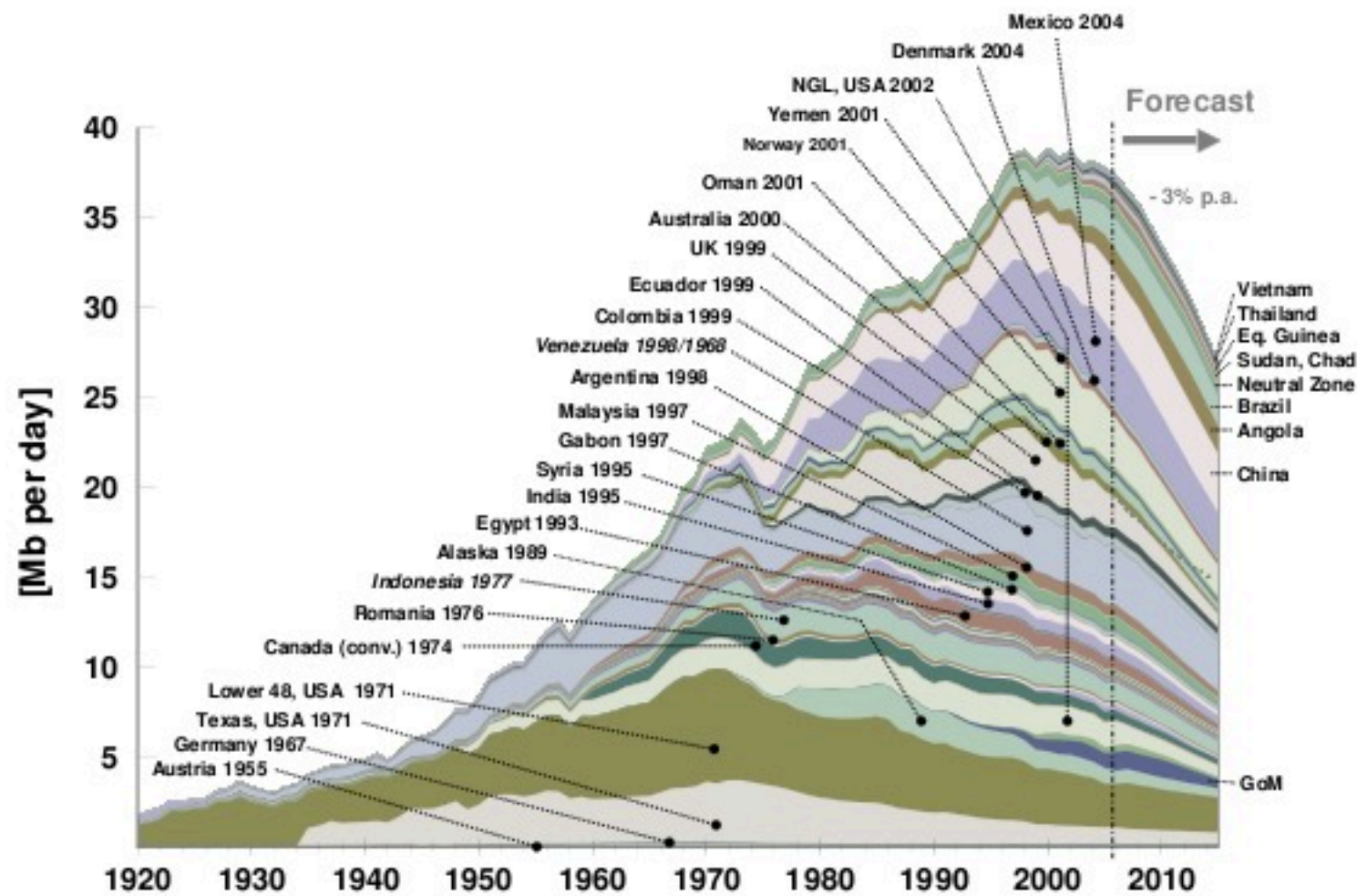


<http://www.clevelandfed.org/research/commentary/2007/081507.cfm>



# World peak oil production

Figure 5: Oil producing countries past peak



Ludwig-Bölkow-Systemtechnik GmbH, 2007

Source: IHS 2006; PEMEX, petrobras; NPD, DTI, ENS(Dk), NEB, RRC, US-EIA, January 2007

Forecast: LBST estimate, 25 January 2007