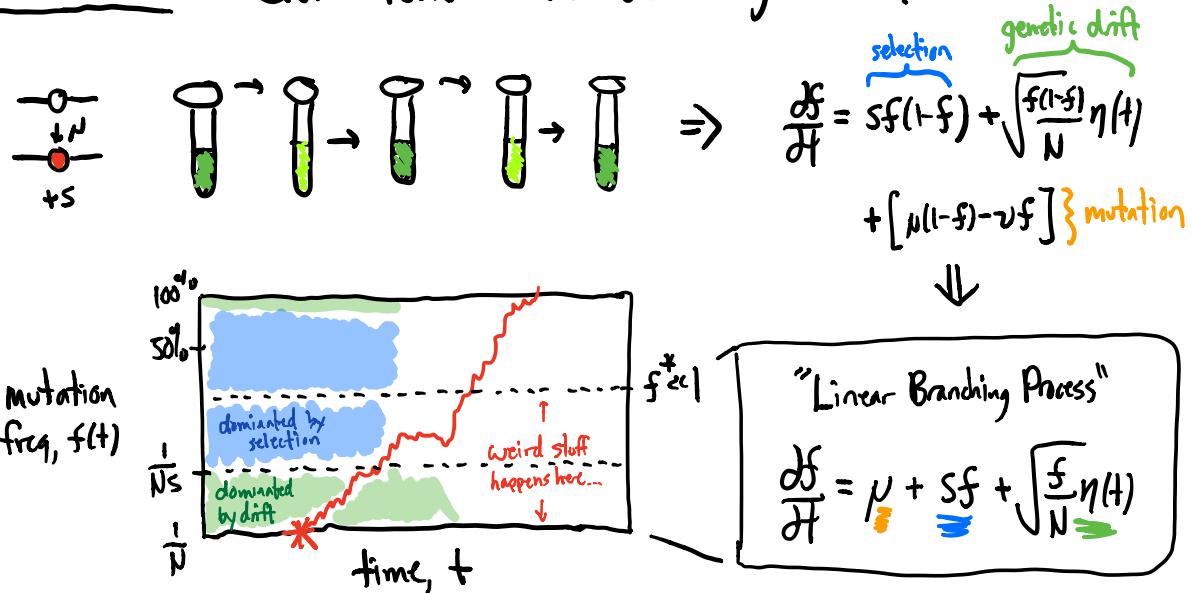


Last time: Quick review - how did we get here?



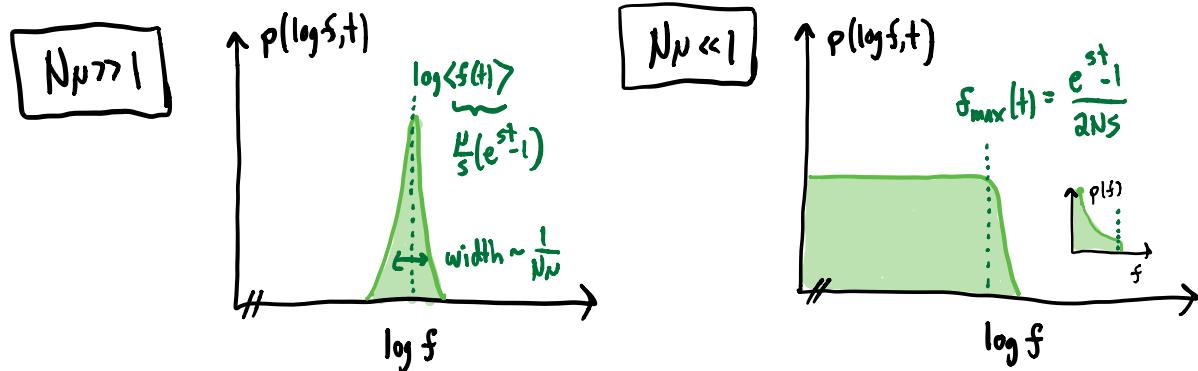
Dynamic mut-sel-drift balance:

$$p(f, t) \propto f^{2N\mu-1} e^{-f/f_{max}(t)}$$

w/  $f_{max}(t) = \langle s_i(t) | s_i > 0 \rangle = \frac{e^{st}-1}{2Ns}$

size of single mut  
conditioned on survival

$\Rightarrow$  2 characteristic behaviors depending on  $N \cdot \mu$ :

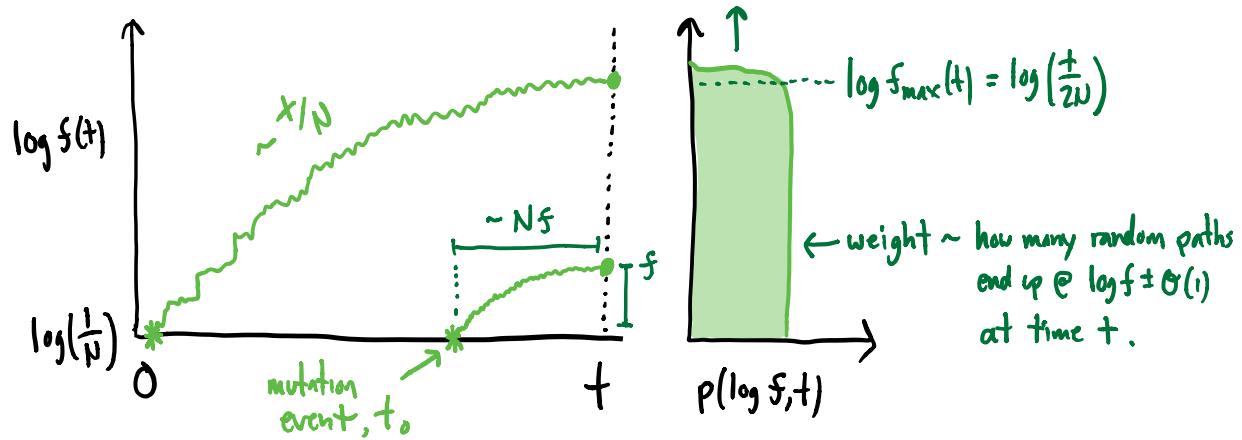


Today: ① what's going on in  $N\mu \ll 1$  case? ② DNA sequencing

E.g. for neutral mutation,

$$p(f, t) \approx 2N\mu f^{-1} e^{-2Nf/t} \quad (N\mu \ll 1)$$

\* can understand dist'n as contribution from @ most 1 mutation event:



\* What range of times contribute to  $p(\log f)$ ?

$$\Rightarrow \text{since } f \sim t/N \Rightarrow \log f \pm O(1) \quad \Delta t_0 \sim Nf$$

\* Putting everything together  $\Rightarrow$  heuristic formula for  $p(\log f)$

$$p(\log f, t) \cdot \underbrace{\Delta \log f}_{O(1)} \sim \underbrace{N\mu}_{p(\text{mutation per gen.})} \times \underbrace{\Delta t_0}_{\text{range of origination times}} \times \underbrace{p\left(\frac{1}{N} \rightarrow f\right)}_{\text{probability of drifting to } f} \sim N\mu \times Nf \times \frac{1}{Nf} \rightarrow 1$$

$$\Rightarrow p(\log f, t) \sim N\mu \quad (f \ll f_{\max}) \quad \checkmark \Rightarrow p(f, t) = \frac{N\mu}{f} \quad \checkmark$$

(f << f<sub>max</sub>)

What about selected mutations?

$$\Rightarrow f_{\max}(t) = \frac{e^{st} - 1}{2Ns} \xrightarrow{+ \ll |s|} \frac{t}{2N} \Rightarrow \text{just like single trajectory, indistinguishable from neutral mutations when } + \ll |s|$$

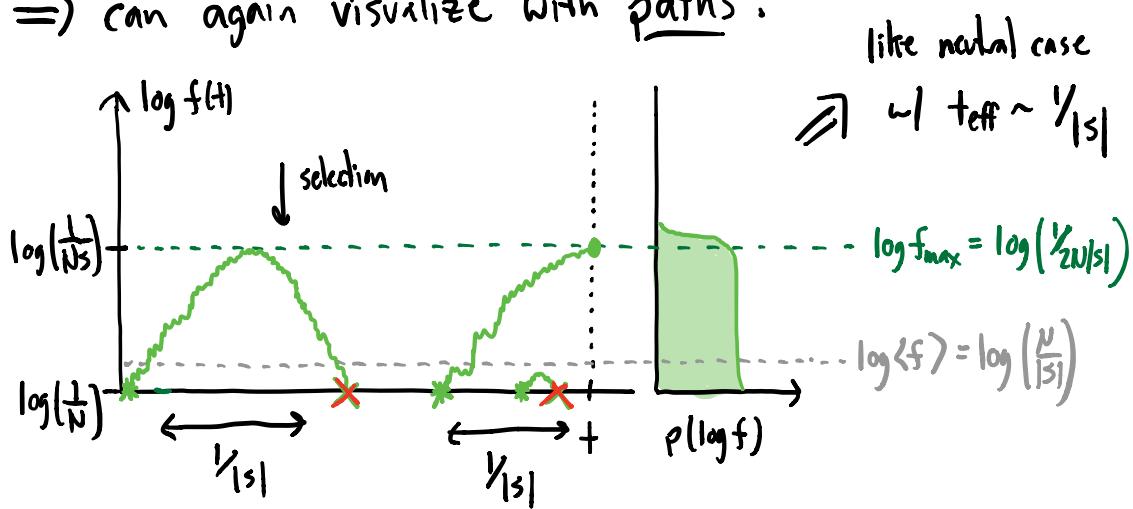
$\Rightarrow$  At longer times, strongly depends on sign of  $s$ ...

① For deleterious mutations:  $f_{\max}(t) \xrightarrow{t \gg |s|} \frac{1}{2N|s|}$  independent of time!

$$\Rightarrow p(f, t) \approx 2N \nu f^{-1} e^{-2N|s|f}$$

Intuition: "mostly  $f=0$ , but small probability ( $\sim N_N$ ) of growing as large as  $f_{\max} \sim \frac{1}{N|s|}$ "

$\Rightarrow$  can again visualize with paths:



$\Rightarrow$  Typical frequencies very different from avg!

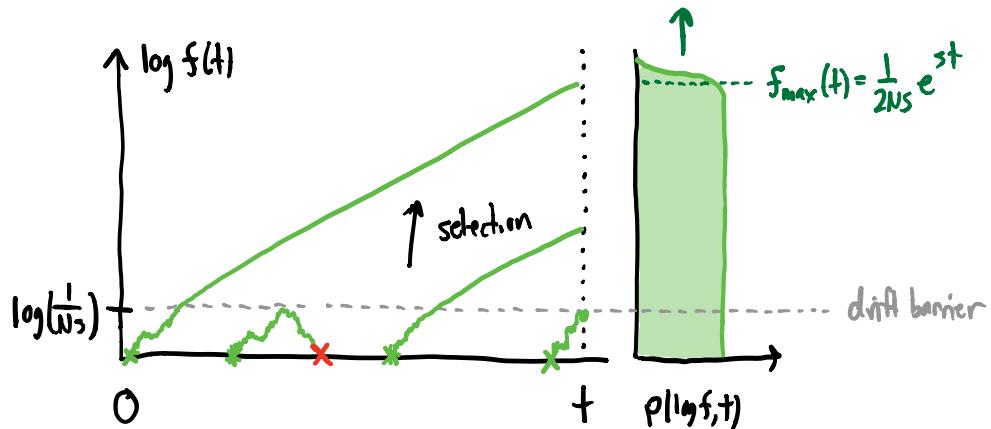
e.g. ABX resistance mut w/ cost  $|s| \sim 10^{-2}$  in absence of drug.

$$\text{w/ } N \sim 10^{10}, \quad N \sim 10^6$$

$$\Rightarrow N \cdot \frac{N}{|s|} \approx 10^2 \text{ cells} \underset{\text{w/ mutation}}{\approx} 0 \Rightarrow \text{but } \frac{1}{2N|s|} \cdot N \approx 100 \text{ cells!}$$

② For beneficial mutations,  $f_{\max}(t) \xrightarrow{+\gg \frac{1}{Ns}} \frac{1}{2Ns} e^{st}$  ( $\gg \frac{1}{Ns}$ )

Can again visualize w/ paths:



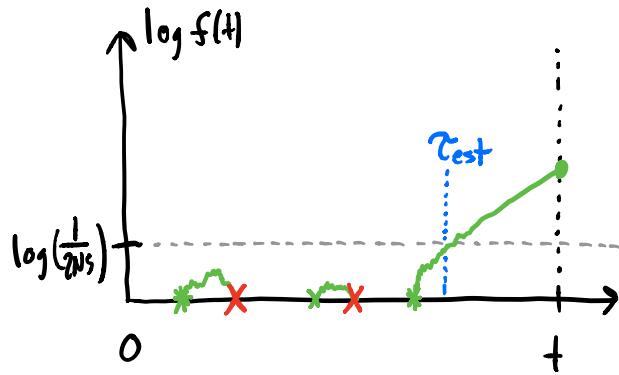
$\Rightarrow$  Distribution is still broad, but paths deterministic once  $f \gg \frac{1}{Ns}$

$\Rightarrow$  can again try to capture randomness in single random #:

$$f(t) \equiv v(t) e^{st} \quad (\text{just like for } \mu=0 \text{ case})$$

$\Rightarrow$  find that  $v(t) \xrightarrow{+\gg \frac{1}{Ns}} v \sim \text{Gamma}\left(2N_N, \frac{1}{2Ns}\right)$   
*independent of time!*

$\Rightarrow$  also useful to rewrite  $v$  as a time,  $f(t) = \frac{1}{2Ns} e^{s(t-\tau_{\text{est}})}$



$$\Rightarrow \tau_{\text{est}} = \frac{1}{s} \log\left(\frac{1}{2Ns} v\right)$$

"establishment time"

$\approx$  "when mutation arose + survived drift"

("time that  $f(t)$  would have reached  $\frac{1}{2Ns}$  if it grew deterministically back in time.")

$$\Rightarrow \text{when } N\mu \ll 1 \Rightarrow \tau_{\text{est}} \sim \underbrace{\text{Exponential}\left(\frac{1}{2Ns}\right)}_{\substack{\text{randomness in when} \\ \text{successful mutation arose}}} \pm \underbrace{\Theta\left(\frac{1}{s}\right)}_{\substack{\text{randomness} \\ \text{in path} \\ \text{from } \frac{1}{N} \text{ to } \frac{1}{Ns}}}$$

$\Rightarrow$  interpretation: ① mutations arise  $\propto$  rate  $N\cdot\mu$  per gen  
② survive drift ("establish") w/ prob  $\sim s$

$\Rightarrow$  successful mutations occur as Poisson process w/ rate  $N\cdot\mu\cdot s$

$$\Rightarrow \text{similarly, for } t_{1/2} : f(t_{1/2}) = \frac{\frac{1}{2Ns} e^{s(t_{1/2} - T_{\text{test}})}}{\frac{1}{2Ns} e^{s(t_{1/2} - T_{\text{test}})} + 1} = \frac{1}{2}$$

$$\Rightarrow t_{1/2} = \underbrace{\frac{1}{s} \log(Ns)}_{\text{from single mutation trajectory}} + \underbrace{T_{\text{test}}}_{\text{from when mutation occurred}} \xrightarrow{N \rightarrow 0} \frac{c}{2Ns} \sim \text{Exp}(1)$$

"limited by supply of new mutations"



↳ e.g. increase  $N$  or increase  $N$  by const factor  
 $\Rightarrow$  decrease  $t_{1/2}$  by the same amount.

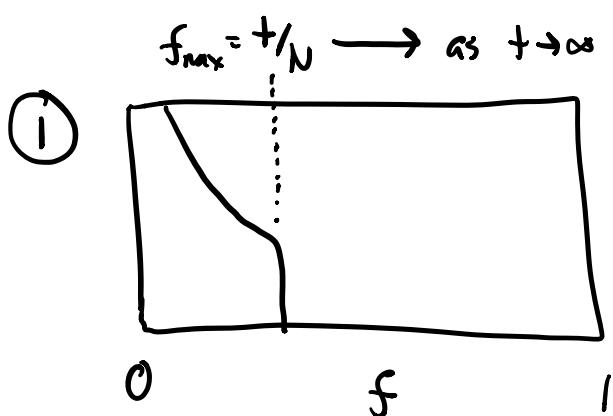
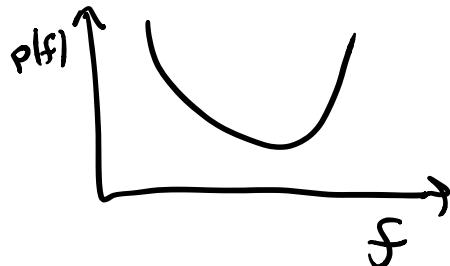
$$\Rightarrow \text{compare to } N \gg 1 \text{ case : } f(t) \approx \langle f(t) \rangle = \frac{N}{s} e^{st}$$

$$\Rightarrow \text{if try to set } f(t) = \frac{1}{2Ns} e^{s(t - T_{\text{test}})} \quad \xleftarrow{\text{set equal}}$$

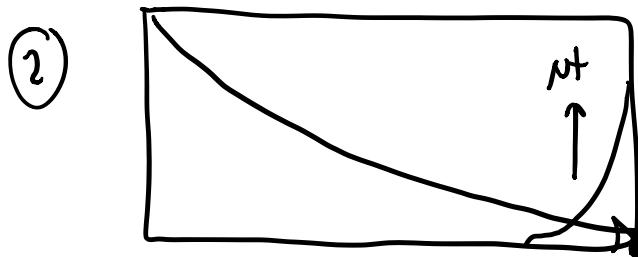
$$\Rightarrow T_{\text{test}} = -\frac{1}{s} \log(N_N) \quad \leftarrow \begin{array}{l} \text{large \& negative} \\ (+\text{deterministic}) \end{array}$$

$$\Rightarrow t_{1/2} \approx \frac{1}{s} \log\left(\frac{s}{N}\right) \quad \leftarrow \begin{array}{l} \text{independent of } N \\ \nwarrow \text{weakly dependent on } N \end{array}$$

How long does it take for  $p(f) \propto f^{2N\mu-1} (1-f)^{2N\mu-1}$   
 to equilibrate.  
 $(s=0)$



\* need  $t \sim N$  for  
 left "L" to form  
 from mutations from  $f=0$



Now chance for right  
 half of u-shape to form  
 from back mutations  
 from  $f=1$  state.

$\Rightarrow$  height of right half is smaller than left half.

$\Rightarrow$  Rate that mutations reach  $f=1$  is

$$NN \times \left(\frac{1}{N}\right) = N$$

$\Rightarrow$  need  $\sim 1/\mu$  generations to reach



$$\Rightarrow t_{eq} \sim \frac{1}{N} \quad \text{e.g. humans} - N \sim 10^{-8}$$

gen ~ 20 yrs

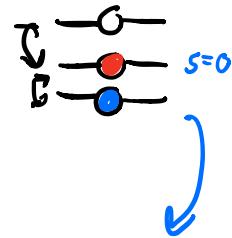
$$\Rightarrow t_{eq} \sim 2 \times 10^9 \text{ years!}$$

$\Rightarrow$  not enough time to equilibrate!

$\Rightarrow$  Instead, more useful is quasi-stationary dist'n

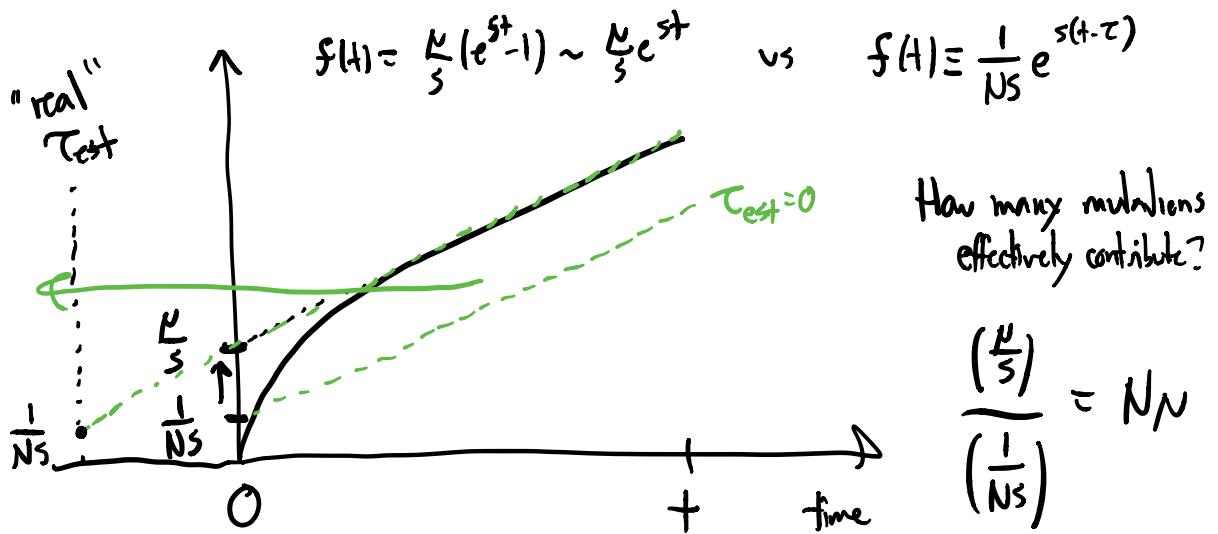
$$p(f) \sim \frac{2NeN}{f} \quad \left( \begin{array}{l} \text{valid for } s=0 \\ \text{+} \gg N, \text{ but } t \ll \frac{1}{N} \end{array} \right)$$

(will see more of this in  
the coming weeks...)



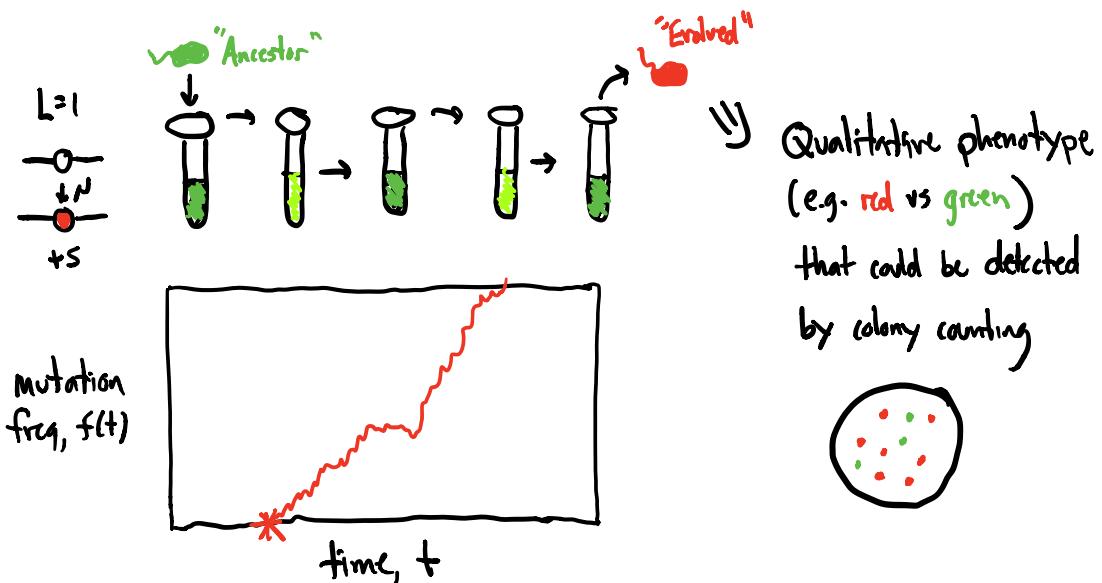
compare to strong selection:  $p(f) = \frac{2NeN}{f} e^{-2Ns/f}$

Question: why is  $\tau_{\text{est}}$  negative when  $N\mu \gg 1$ ?



# DNA Sequencing + Genomics

So far....

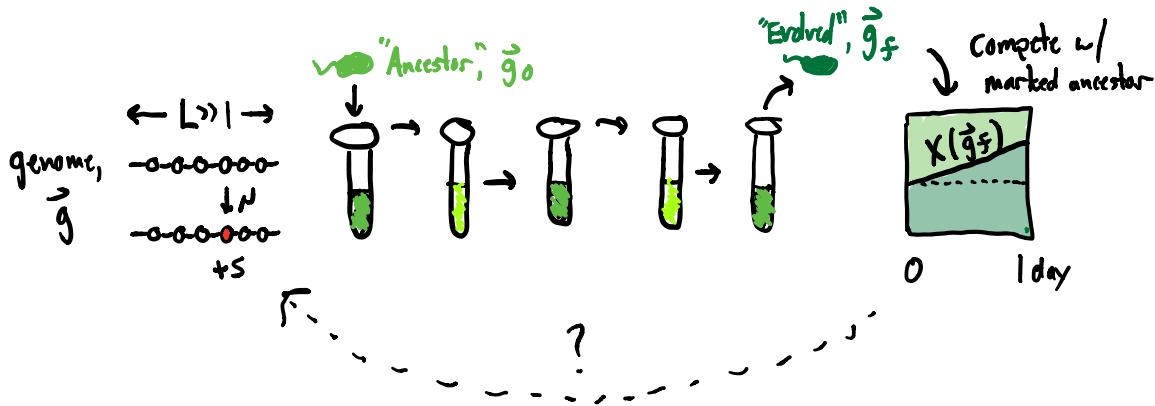


⇒ In practice, genomes contain many sites

⇒ don't know what phenotypes mutations  
@ these sites produce or how to  
measure them w/ colony counting assay...

$$\begin{cases} L \sim 10^4 - 10^5 \text{ for viruses} \\ L \sim 10^6 - 10^7 \text{ for bacteria} \\ L \sim 10^9 \text{ for humans} \end{cases}$$

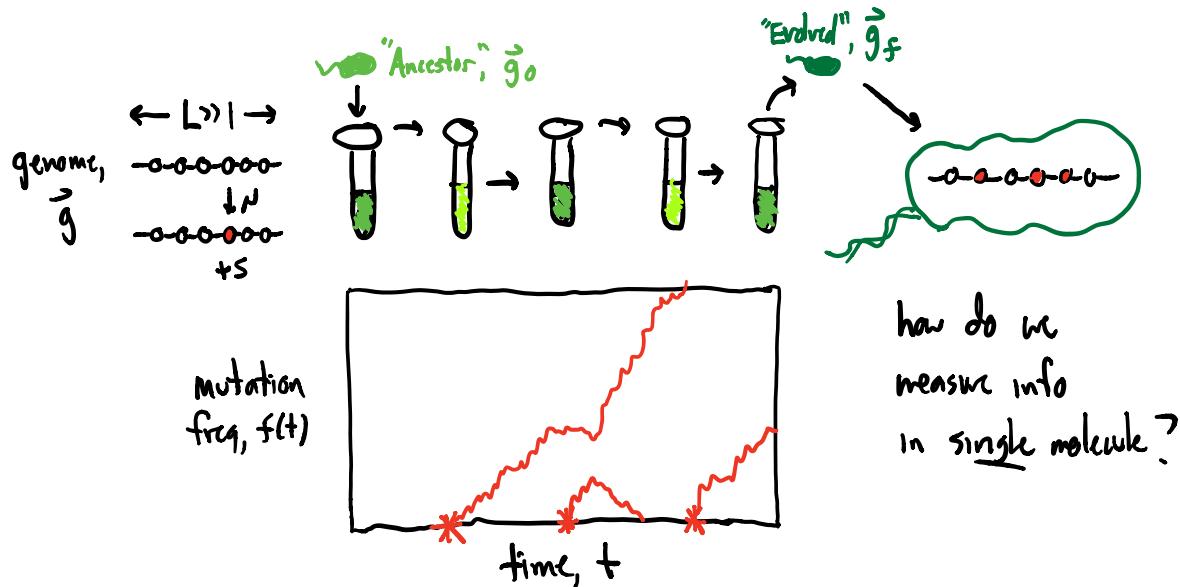
Historically, experimental evolution relied on competitive fitness



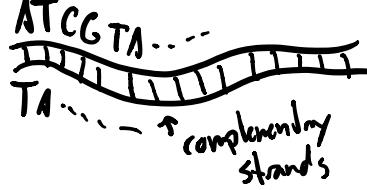
$\Rightarrow$  statistics of  $X(\vec{g}_f)$  w/in + between populations  
tell us something about evolutionary dynamics of  $\vec{g}$

$\Rightarrow$  downside: indirect! many diff dynamics of  $\vec{g}$   
consistent w/ same dynamics of  $X(\vec{g})$ ...  
+  $\vec{g} \rightarrow X(\vec{g})$  poorly understood...

Now: DNA sequencing allows us to measure genomes directly\*

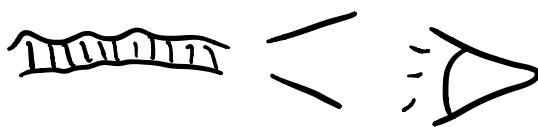


how do we  
measure info  
in single molecule?

Recall: genome =   $\text{ATCGTA...}$   
                           $\text{TA...} \rightarrow$  complementary strands

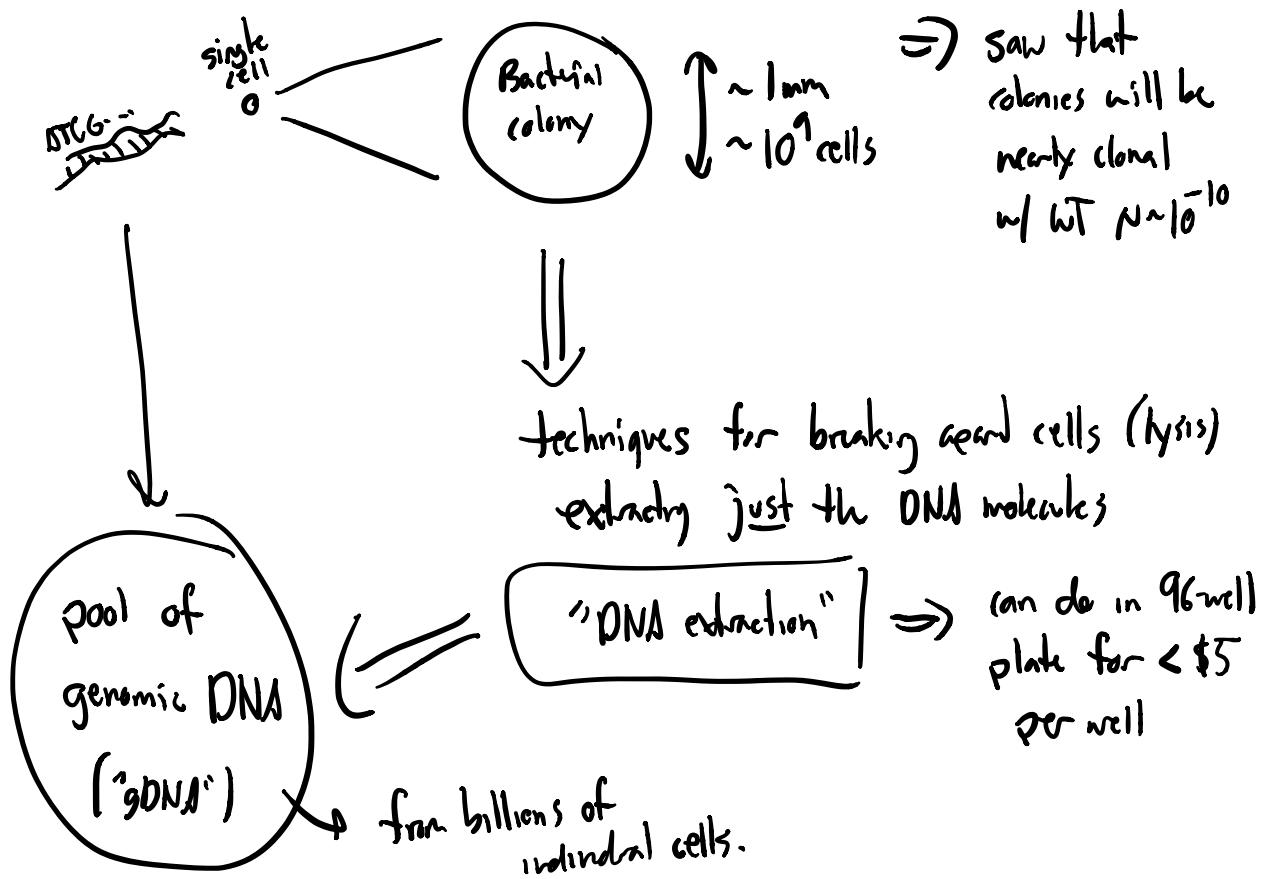
$L \sim 10^{4-5}$  virus  
 $L \sim 10^6$  bacteria  
 $L \sim 10^9$  humans.

Step 1 for reading genomes: amplification!



need macroscopic quantities  
of our DNA molecule  
to work with.

For bacteria: easy! use built in ability to grow exp.



$\Rightarrow$  Next time: how do we read these out?