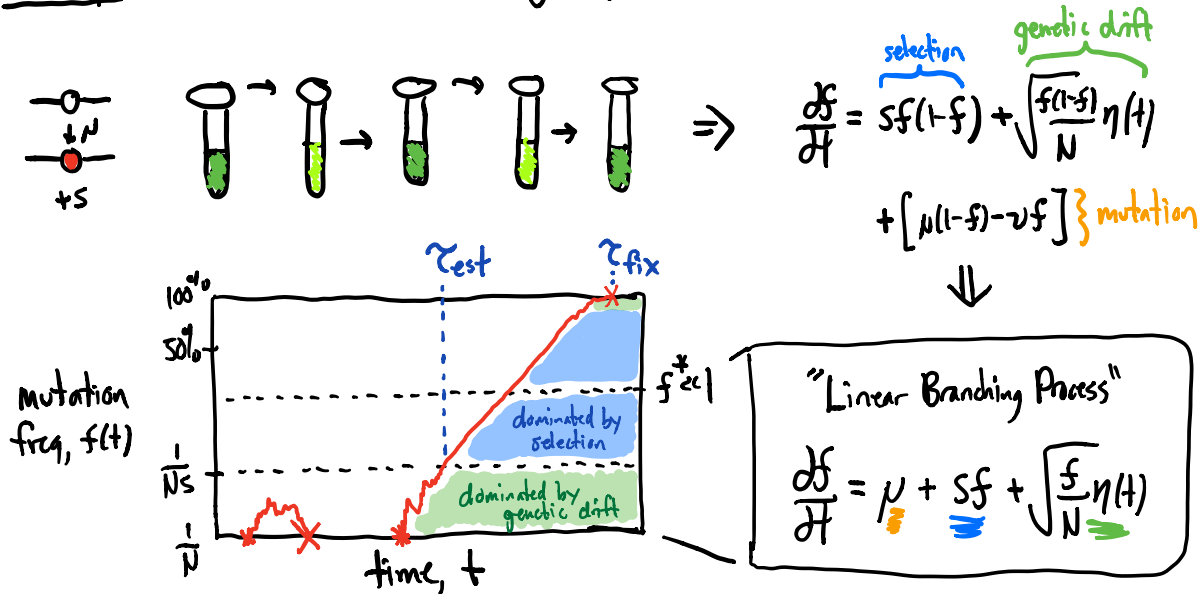
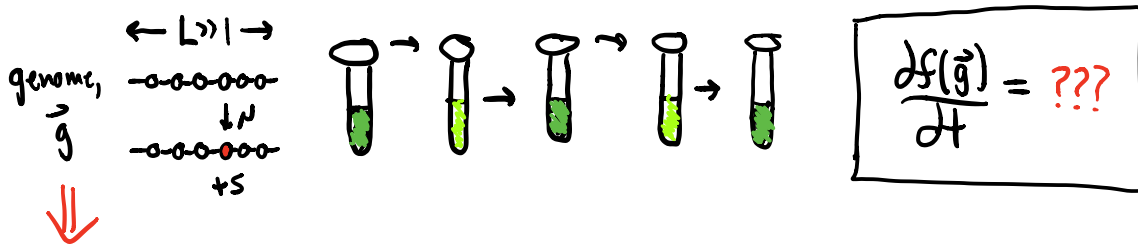


Announcements: Half way done!

Recap: Evolution at a single genetic locus

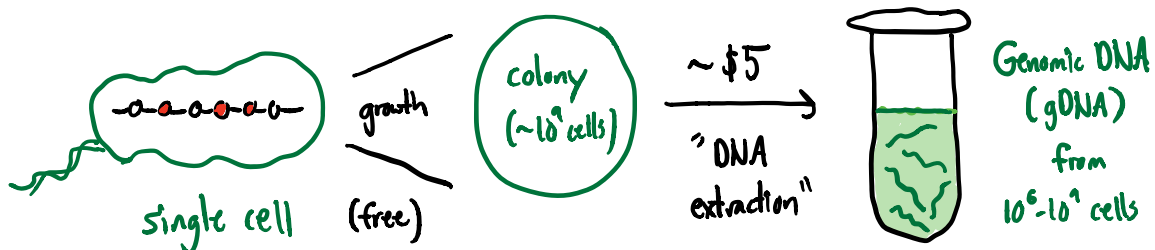


Where we're headed: Evolution of longer genomes!



Last time: How do we measure information in single DNA molecules?

Step 1: Amplification ("get a macroscopic amount of them")



Problem:  $L = 10^6$  sized genomes too difficult to measure directly  
 $\Rightarrow$  most sequencing methods work w/ short sequences ( $\approx 10^3$  bp)



How to get a macroscopic amount of just this region?

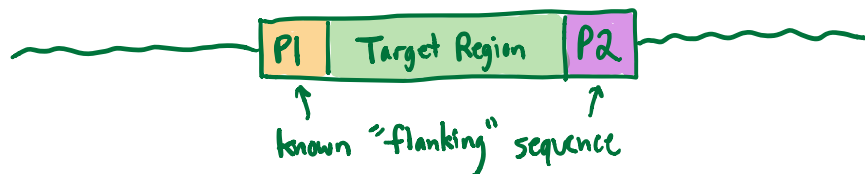
Answer: PCR ("polymerase chain reaction")

$\Rightarrow$  cell-free chemical reaction that's like  
but just for part of genome.



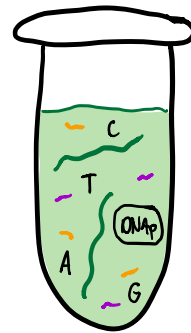
$\Rightarrow$  takes advantage of DNA replication machinery invented by bacteria

\* But requires us to know some of the sequence near target

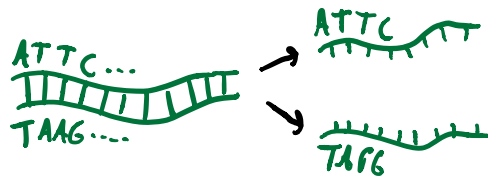


① can have company synthesize "primers" (short sequences of ~20bp) that correspond to P1 + P2. (~\$0.30/bp for ~10<sup>3</sup> reactions)

② mix w/ DNA polymerase,  
dNTP (free A's, C's, T's, G's)  
+ your genomic DNA.



③ Heat sample so that DNA strands "melt" (~90°C)



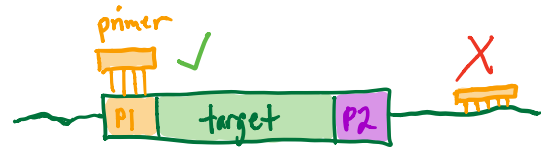
④ Now cool sample so that primers "anneal" to input DNA  
~60°C



⇒ melting + annealing is physics problem:  $\frac{p(\text{bound})}{p(\text{unbound})} \sim e^{-\frac{\Delta E}{kT}}$

w/  $\Delta E \approx \# \text{ matched bp}$   
(very roughly...)

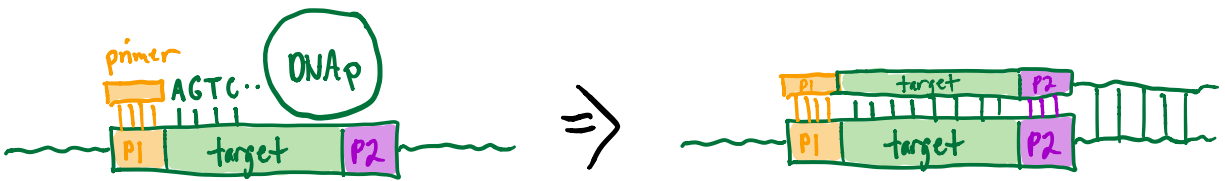
⇒ want primers to bind to known region, but not anywhere else!



\* we saw in PSET 1 that most of E. coli genome is uniquely identifiable w/  $l \approx 20\text{bp}$  sequence ⇒  $\sim 20\text{bp}$  primers sounds ok \*

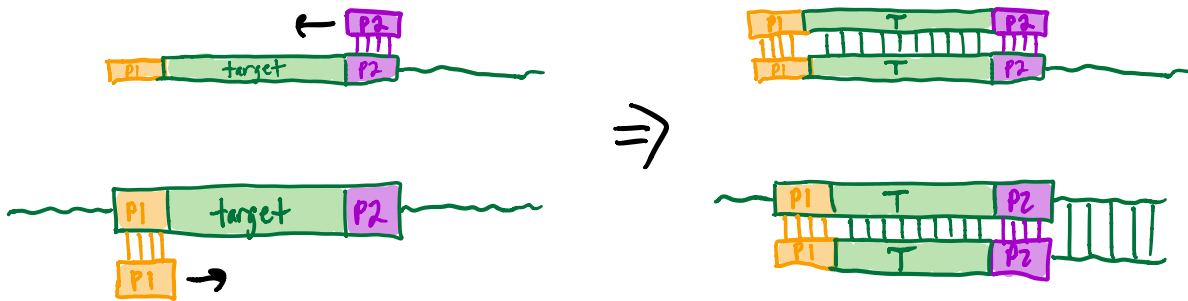
(more generally ⇒ information theory argument, see p.5 of notes...)

④ After primers are bound, DNA polymerase will start incorporating dNTPs onto primer to create complementary strand...




("extension phase")

⑤ Melt, anneal, + extend again:



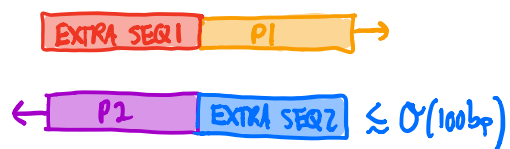
⑥ Repeat for  $K \sim 20-30$  cycles...

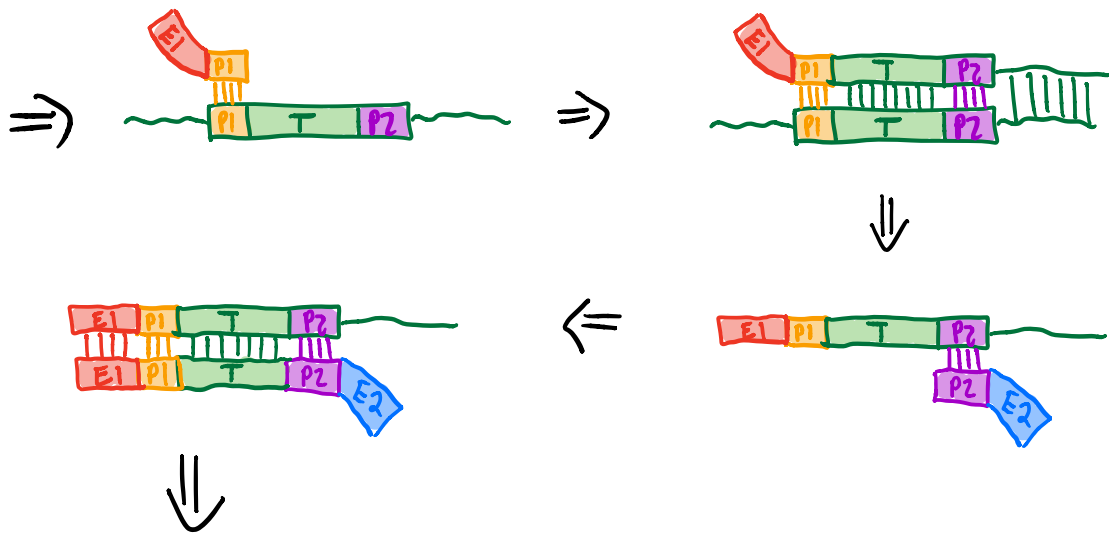
$\Rightarrow$  exponential amplification of  sequence!  
("amplicon")

⑦ "clean up" to remove leftover primers, etc.  $\Rightarrow$   macroscopic # of amplicons!

$\Rightarrow$  Note: can also use PCR to add extra bit of DNA sequence to your target region...

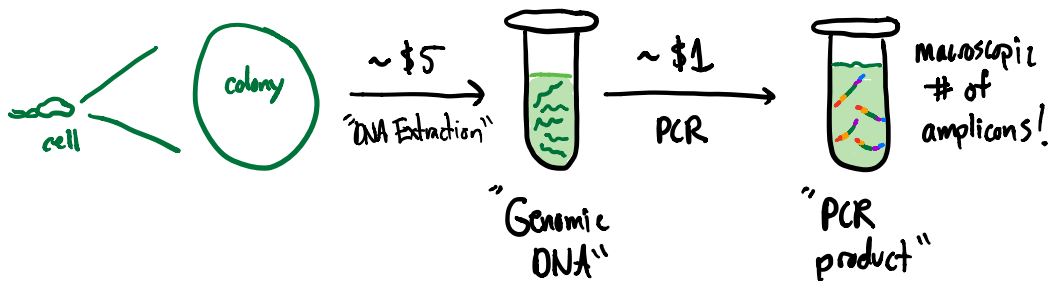
$\Rightarrow$  order modified primers:





Amplified sequence:

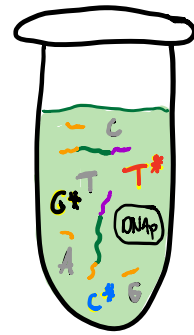
Recap:



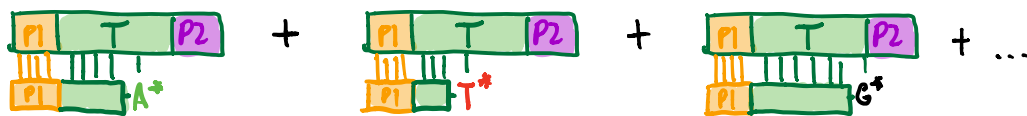
⇒ How do we read out information from PCR products?

Traditional approach: Sanger sequencing  
(like 1 extra round of PCR...)

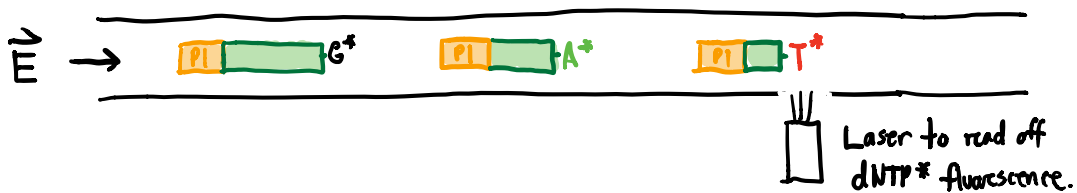
Idea: mix PCR product w/ **PI**, DNAP, dNTPs,  
 + special fluorescent dNTPs that block DNAP  
 ( $A^*$ ,  $G^*$ ,  $C^*$ ,  $T^*$ )



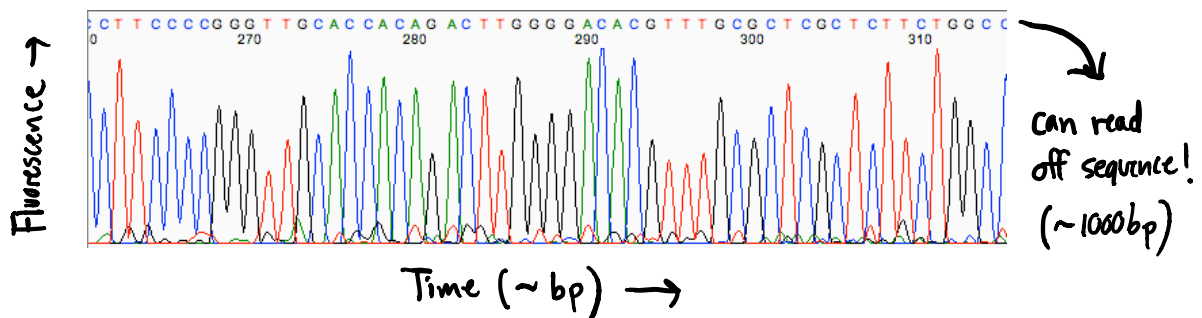
⇒ After 1 round of extension, random mixture of



⇒ Flow in electric field (shorter fragments move faster)



⇓ "chromato-gram"

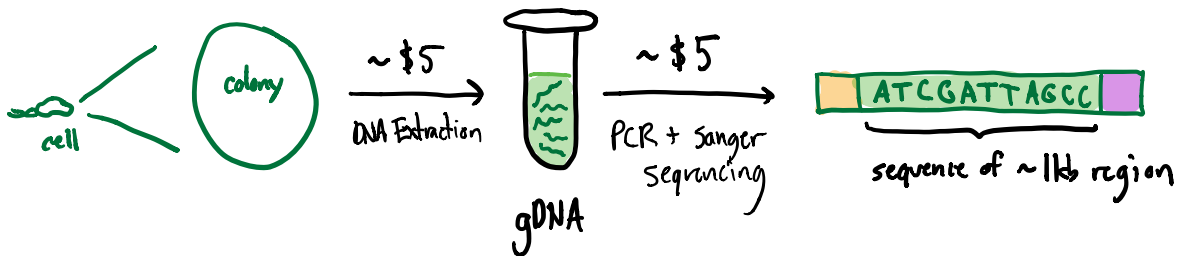


⇒ costs ~\$5 (send away overnight:



)

⇒ so have seen how to go from:



⇒ in Problem 1 of PSET 2, Lay & Murray used sanger seq  
to sequence URA3 genes in ~300 yeast colonies

⇒ \$1500 total

⇒ But expensive to sequence whole genomes!

e.g. E. coli: 1 clone =  $10^6 \sim 10^3$  sanger seq runs → \$5k

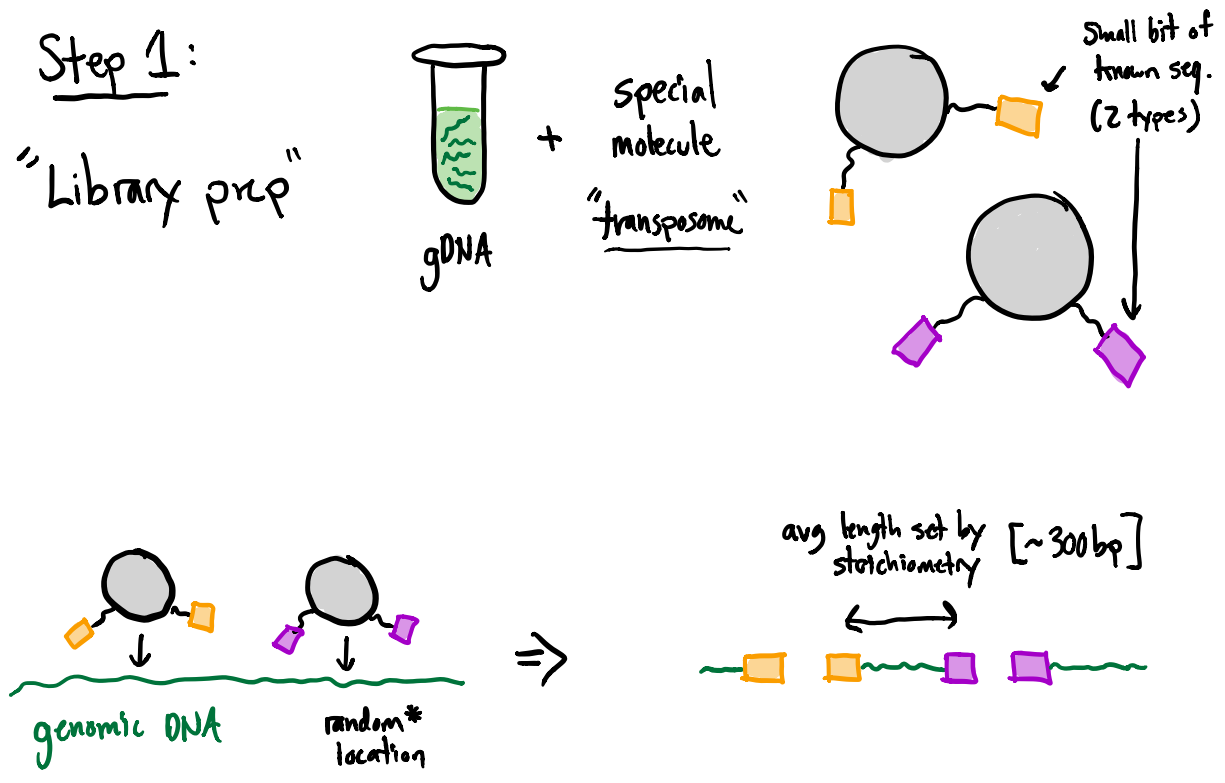
e.g. Humans: 1 person =  $10^9$  bp ⇒  $10^6$  sanger seq runs ~ \$5M



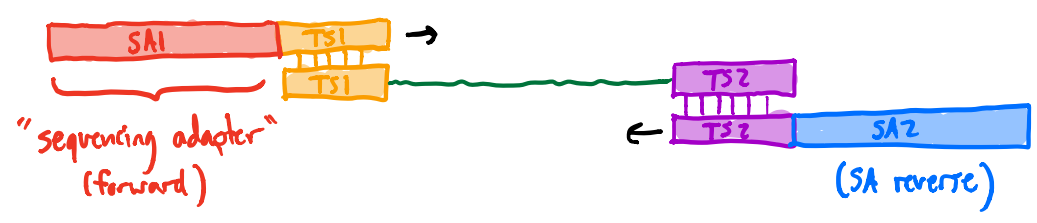
⇒ Now things are much cheaper w/ Next-gen sequencing  
("Illumina sequencing")

⇒ same idea, but higher throughput!

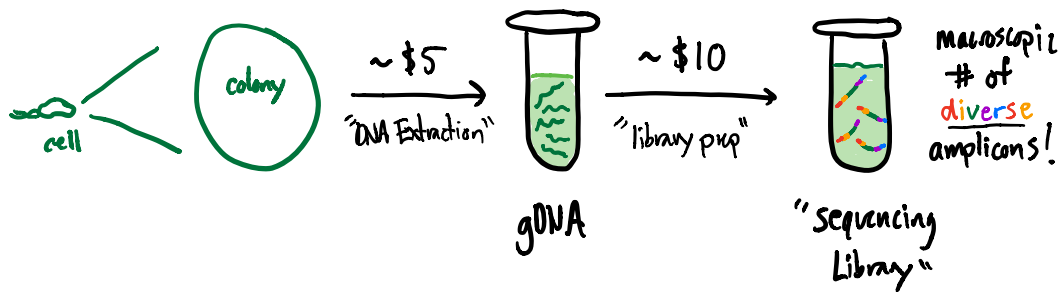
Step 1:  
"Library prep"



Step 2: Now in position to do PCR + add extra known sequence:

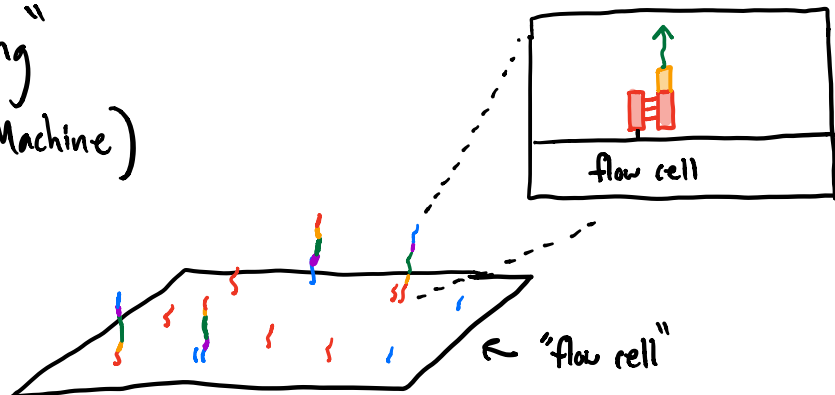


⇒ This gives us:



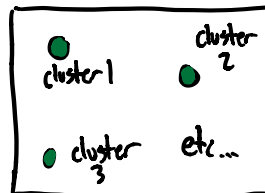
Step 3: "Sequencing"  
(Illumina Machine)

Flow library onto chip  
w/ probes that  
bind sequencing adapter



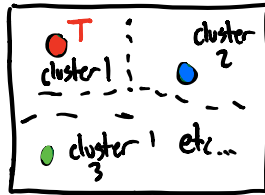
Step 4: do more PCR on bound fragments to turn each molecule into macroscopic cluster of identical\* molecules

top down  
view:



Step 5: flow primer + fluorescent dNTPs that incorporate once (then stop)  
(SA1)

⇒ if take picture of flow cell:



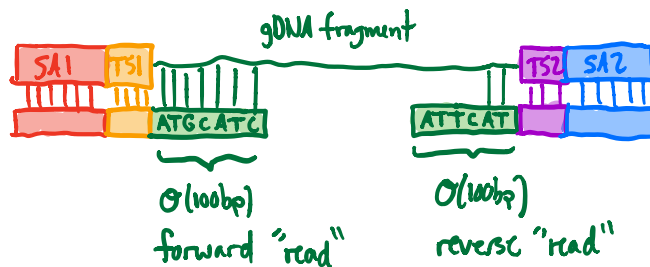
⇒ different colors = nucleic acid @ first position

Step 6: remove fluorescent part (+ block), ⇒ 2nd position.  
+ repeat w/ new round of dNTPs

Step 7: can repeat for  $\mathcal{O}(100)$  cycles [until pictures  $\approx$  desynchronized]

Step 8: can also repeat for reverse direction (SA2)

Net result:



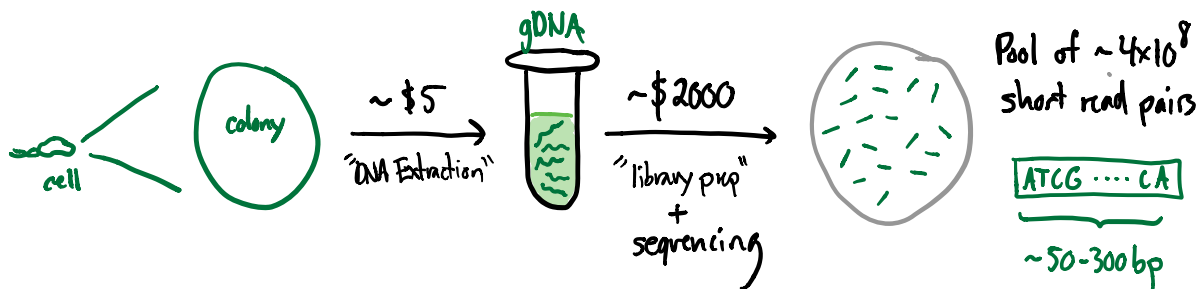
⇒ get  $\mathcal{O}(100 \text{ bp})$  read out from each end of single DNA fragment

⇒ w/ modern Illumina machines, process is very high throughput!

⇒  $\sim 4 \times 10^8$  read pairs in  $\sim$  few days for  $\sim$  \$2000

(catch: can't do smaller batches)

Recap: Now have method for going from:

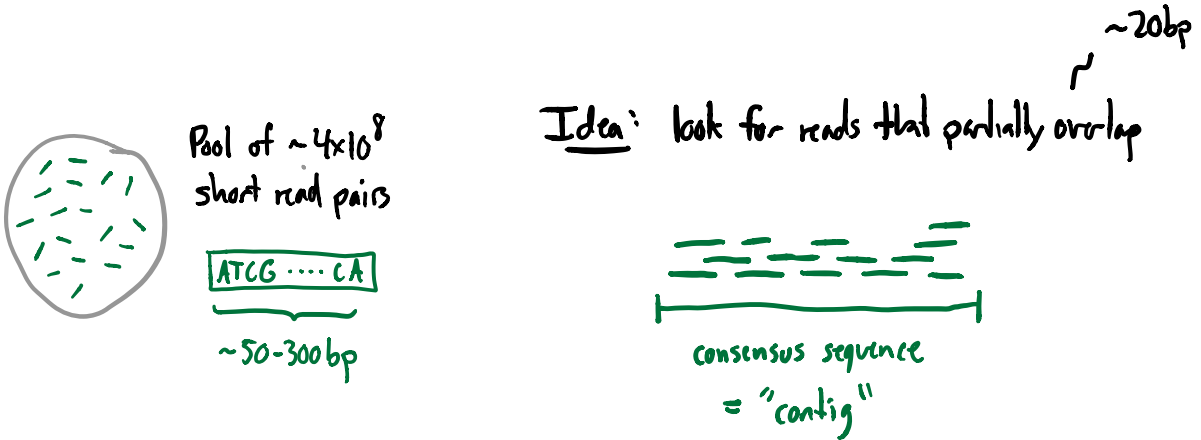


Next: what can we do with this kind of data?

⇒ need to put puzzle back together... 2 main methods

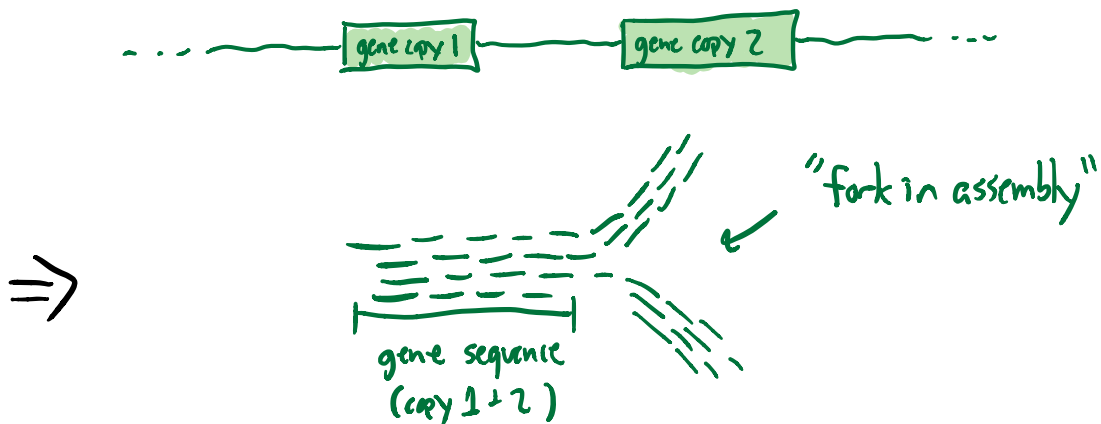
# ① "De novo Genome Assembly"

(common programs: spades, Velvet, ...)



⇒ simple in principle, but lots of corner cases ...

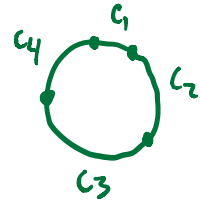
⇒ e.g. what if 2 regions of genome are identical for  $\geq 100$ bp (or length of read?)



⇒ for these & other reasons, assembly typically yields collection of discrete contigs,

each  $\sim 10^3 - 10^5$  bp long: 

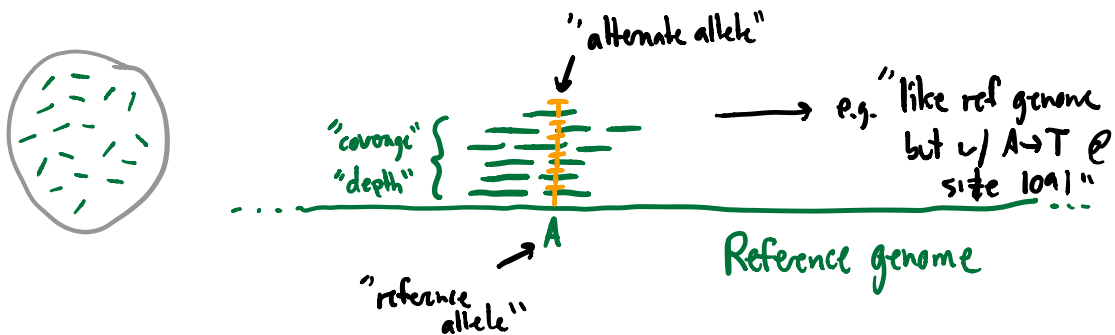
⇒ much harder (+ manual effort)  
to "finish" into complete genome



+ HUGE memory requirements ( $\sim 32\text{Gb} - 1\text{Tb}$  depending on  $L$ )  
(since need to compare all\* pairs of reads to each other...)

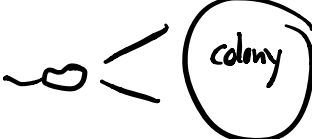
## ② Alignment of reads to Reference Genome

⇒ if already have assembled genome from related strain...  
can align reads to best matching place & look for changes  
(common programs: Bowtie2, BWA-MEM, + mpileup)

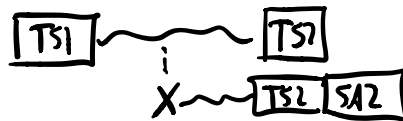


Major wrinkle: sequencing errors (A→T by chance, "shot noise")

where could these errors come from?

① initial grow up:  ⇒ but happen w/ low rate  
( $\mu = 10^{-10}$  / bp/gen)

② library prep & PCR



⇒ higher rates  $\sim 10^{-6}$  / bp / round  $\rightarrow 10^{-4}$  / bp total.

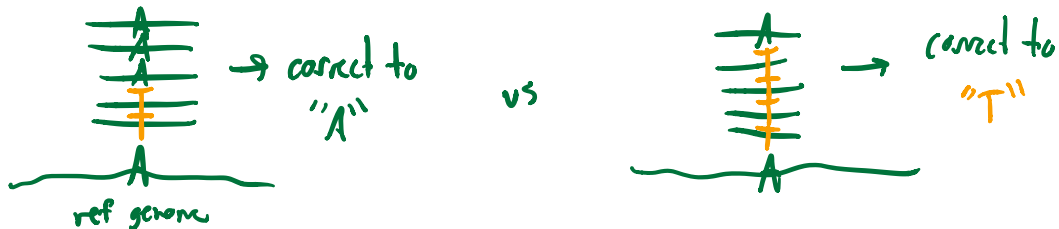
③ Errors on sequencing machine  $\Rightarrow$  estimated  $\sim 10^{-3}$  / bp <sup>larger</sup>  
(cluster-generation PCR errors) \* but can vary from site to site  
wrong fluorescent base... (up to  $10^{-2}$  sometimes)

⇒ dominant source of noise:  $P_{err} \sim 10^{-3}$  (up to  $\sim 10^{-2}$ )  
in special cases.

⇒ low rate, but  $L \gg 1$ !

⇒ # errors per genome =  $L \times P_{err} \sim 10^6$  errors for Human  
 $10^3$  errors per E. coli

⇒ fortunately, can correct errors w/ consensus sequences!



⇒ higher coverage is helpful... how much?



$$Pr(\text{consensus error}) = \sum_{A=\bar{D}/2}^{\infty} \frac{(\rho_{\text{err}} \bar{D})^A}{A!} e^{-\rho_{\text{err}} \bar{D}} \approx \frac{(\rho_{\text{err}} \bar{D})^{\bar{D}/2} e^{-\rho_{\text{err}} \bar{D}}}{(\bar{D}/2)!}$$

$$\# \text{ errors in genome} = L \times Pr(\text{consensus error})$$

$$\approx \exp\left[\log L - \frac{\bar{D}}{2} \left[\log\left(\frac{1}{2\rho_{\text{err}}}\right) - 1\right]\right] \approx \mathcal{O}(1)$$

$$\Rightarrow \text{solve for } \bar{D} \Rightarrow \bar{D} \approx \frac{2 \log L}{\log\left(\frac{1}{2\rho_{\text{err}}}\right) - 1} \approx \begin{cases} 5 & \text{if } L \sim 10^6, \rho_{\text{err}} \sim 10^{-3} \\ 8 & \text{if } L \sim 10^9 \end{cases}$$

$\Rightarrow$  so need coverage of  $\geq 10\times$  coverage to detect single muts.

$\Rightarrow$  How many reads is this?

$$\text{E. coli: } 10 \times 10^6 \text{ bp} \Rightarrow 10^7 \text{ bp} \Rightarrow 10^5 \text{ reads}$$

$\Rightarrow$  but a single run of Illumina seq produces  $4 \times 10^8$  reads

$\Rightarrow$  overkill! (wastes money)