

# Velvet: Algorithms for de novo short read assembly using de Bruijn graphs

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# Problem

- de novo assembly is the problem of figuring out the genome sequence without no prior information
- for example, sequencing a species for the first time
- inputs reads short, can be modelled as randomly broken pieces of the genome
- plus possibly paired end data

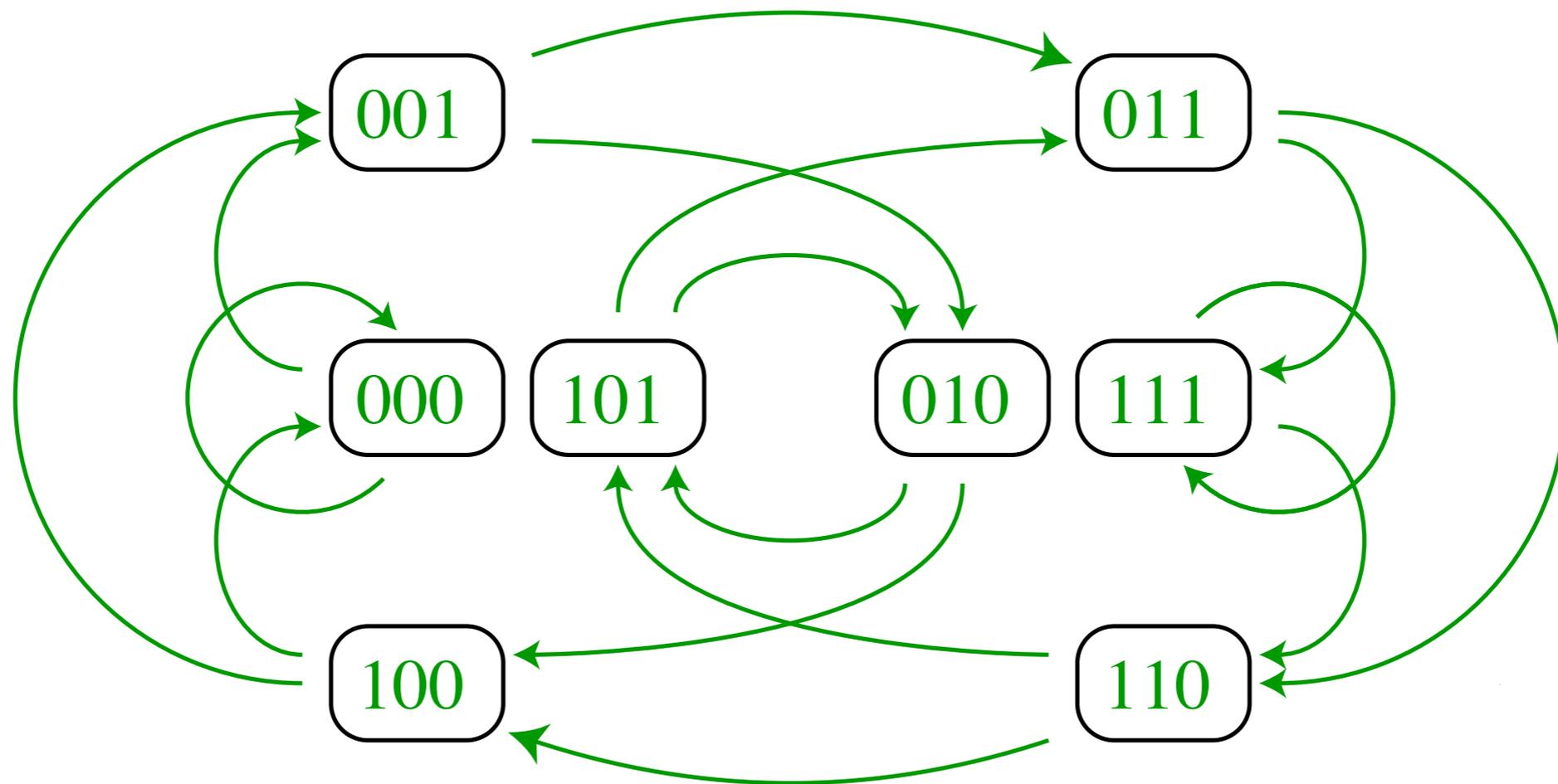
# Illustration

TAGTCGAGGCTTTAGATCCGATGAGGCTTTAGAGACAG  
AGTCGAG CTTTAGA CGATGAG CTTTAGA  
GTCGAGG TTAGATC ATGAGGC GAGACAG  
GAGGCT**C** ATCCGAT AGGCTTT GAGACAG  
AGTCGAG TAGATCC ATGAGGC TAGAGA**A**  
TAGTCGA CTTTAGA CCGATGA TTAGAGA  
CGAGGCT AGATCCG TGAGGCT AGAGACA  
TAGTCGA GCTTTAG TCCGATG GCT**C**TAG  
TCGA**C**GC GATCCGA GAGGCTT AGAGACA  
TAGTCGA TTAGATC GATGAGG TTTAGAG  
GTCGAGG T**C**TAGAT ATGAGGC TAGAGAC  
AGGCTTT ATCCGAT AGGCTTT GAGACAG  
AGTCGAG TTAGAT**T** ATGAGGC AGAGACA  
GGCTTTA TCCGATG TTTAGAG  
CGAGGCT TAGATCC TGAGGCT GAGACAG  
AGTCGAG TTTAGATC ATGAGGC TTAGAGA  
GAGGCTT GATCCGA GAGGCTT GAGACAG

# Challenges

- Is this possible with short short reads?  
 $4^{25} = 10^{15}$   $10^9$  bp in the human genome
- repeats in the genome
- mistakes in the sequencing reads
- mistakes in the sequencing biology/  
chemistry

# de Bruijn graphs

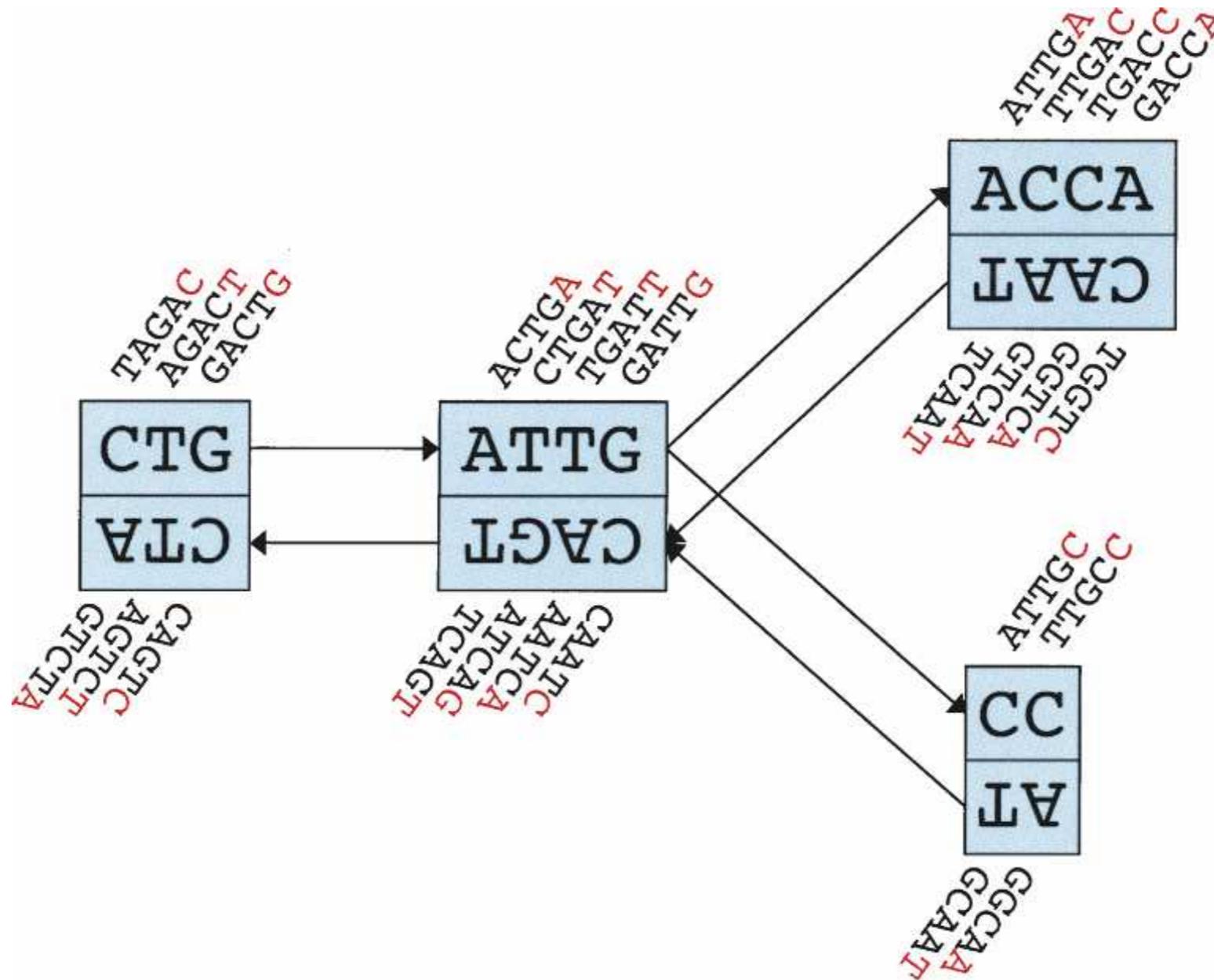


- each sequence is a path through the graph
- the outer path: 1001100

# construction

- sequence of each read is parsed into k-mers
- typical  $k=21$  for read length of 25
- series of matches ( $k-1$  long) are aligned together called a block
- the information of each block is the last bp of each k-mer in of the block

# alignment



# links

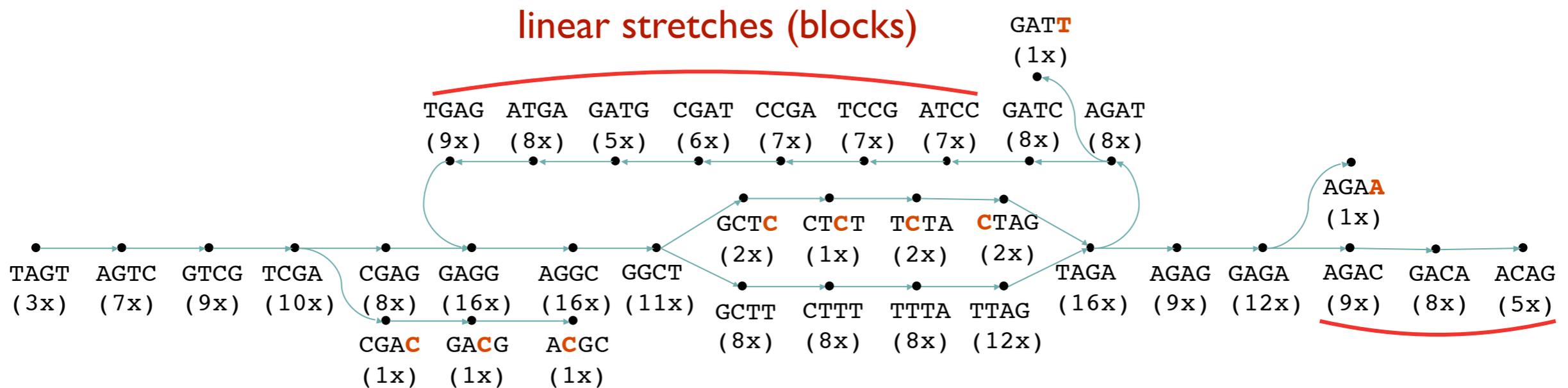
- a directed link is drawn if there exists a  $(k-1)$  long match between two blocks
- if everything is perfect, an underlying sequence follows all links in the de Bruijn graph while tracing through every block
- however, due to the noisy measurement and sequence repeats, many more steps are required

# Example

TAGTCGAGGCTTTAGATCCGATGAGGCTTTAGAGACAG  
AGTCGAG CTTTAGA CGATGAG CTTTAGA  
GTCGAGG TTAGATC ATGAGGC GAGACAG  
GAGGCT**C** ATCCGAT AGGCTTT GAGACAG  
AGTCGAG TAGATCC ATGAGGC TAGAGA**A**  
TAGTCGA CTTTAGA CCGATGA TTAGAGA  
CGAGGCT AGATCCG TGAGGCT AGAGACA  
TAGTCGA GCTTTAG TCCGATG GCT**C**TAG  
TCGA**C**GC GATCCGA GAGGCTT AGAGACA  
TAGTCGA TTAGATC GATGAGG TTTAGAG  
GTCGAGG T**C**TAGAT ATGAGGC TAGAGAC  
AGGCTTT ATCCGAT AGGCTTT GAGACAG  
AGTCGAG TTAGAT**T** ATGAGGC AGAGACA  
GGCTTTA TCCGATG TTTAGAG  
CGAGGCT TAGATCC TGAGGCT GAGACAG  
AGTCGAG TTTAGATC ATGAGGC TTAGAGA  
GAGGCTT GATCCGA GAGGCTT GAGACAG

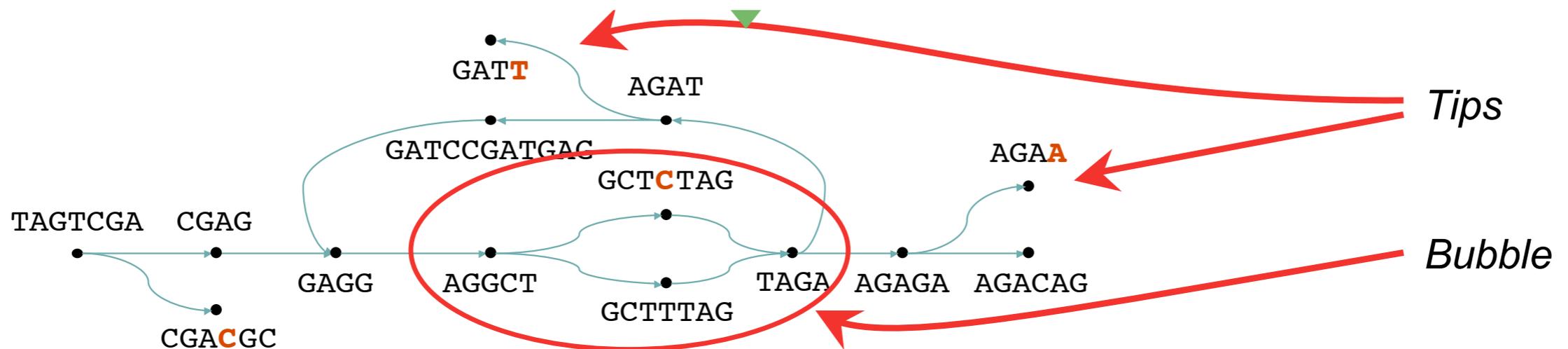
**red** = sequencing mistakes

# Example



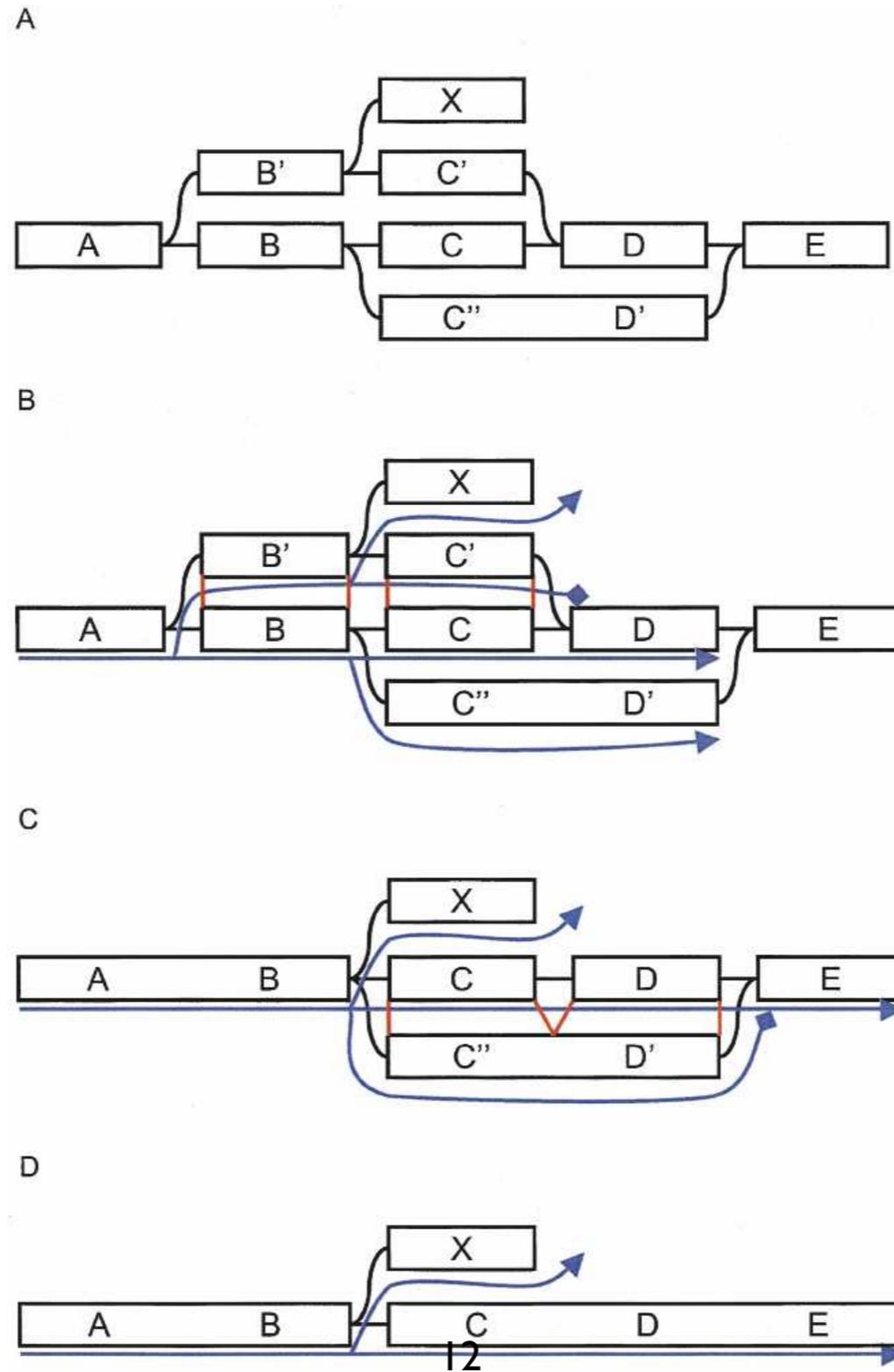
- read data from example is parsed into 4-mers
- matches are found and the de Bruijn graph is constructed
- problems ?

# merging blocks

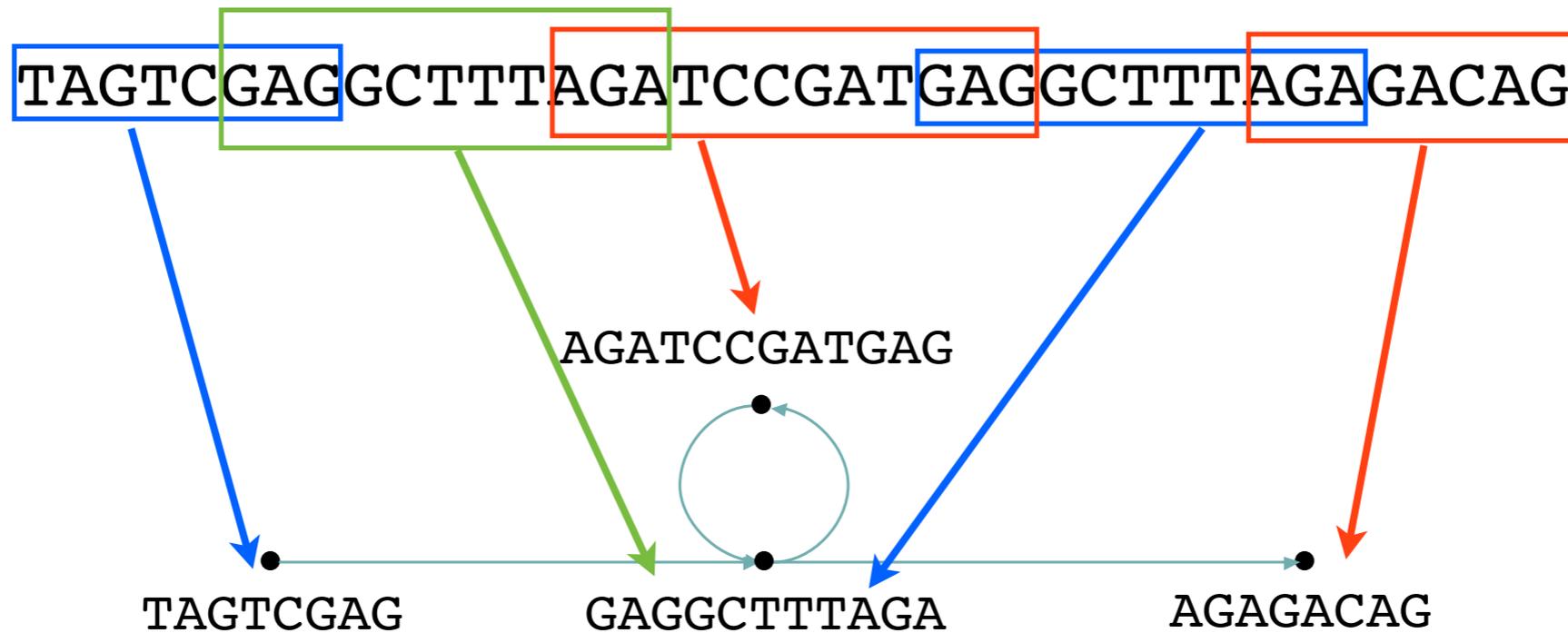


- hanging tips(blocks that do not connect to anything) are likely due to mistakes, especially low-coverage ones
- bubbles(cycles of the in the graph) is likely due to errors

# Tour Bus algorithm for bubble removal



# result of example

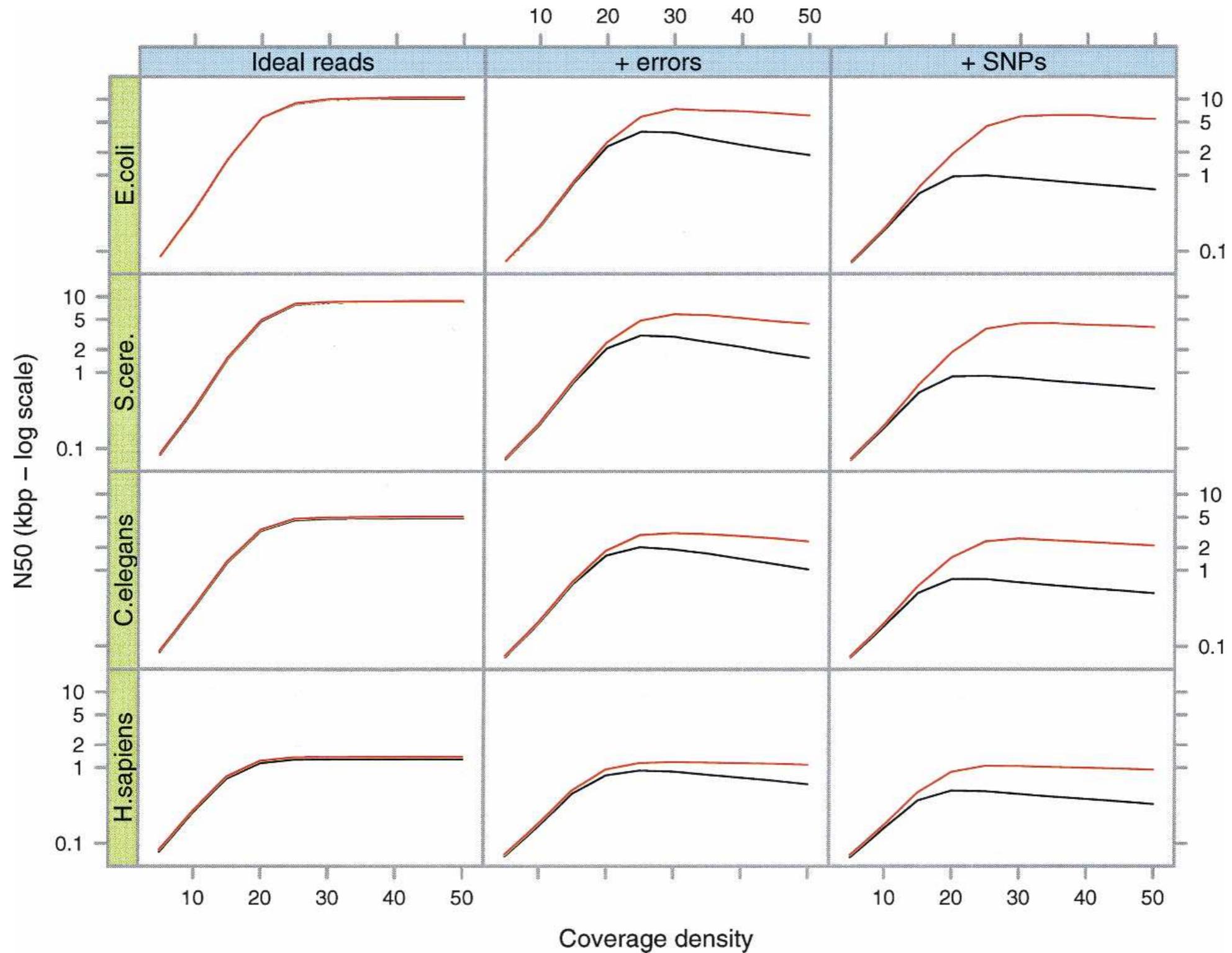


- in this example, sequence length=38 bp, read length=7bp , coverage~10X, error rate~ 3%, with one major repeat = 11bp
- k is chosen to be 5 bp
- Velvet is able to resolve this toy example!

# N50

- in problems of practical size, it is unlikely that any large genome can possibly be assembled through read data alone (more experiment needed)
- it is harder for to measure performance
- one measure of how well an assembler performs is the N50 (median length weighted contig length)

# simulated results



# real reads

- a 173 kbp human BAC was sequenced by Solexa with a coverage of 970X
- read length are 35 bp
- k set to 31
- an virtual ideal sequencer(error free, gap free) that looks at the reference sequence is compared with Velvet

# experimental reads

**Table 1.** Efficiency of the Velvet error-correction pipeline on the BAC data set

Step	No. of nodes	N50 (bp)	Maximum length (bp)	Coverage (percent >50 bp)	Coverage (percent >100 bp)
Initial	1,353,791	5	7	0	0
Simplified	945,377	5	80	4.3	0.2
Tips clipped	4898	714	5037	93.5	78.7
Tour Bus	1147	1784	7038	93.4	90.1
Coverage cutoff	685	1958	7038	92.0	90.0
Ideal	620	2130	9045	93.7	91.9

# conclusion

- Velvet is able to do a reasonably well job of error removal efficiently with short reads
- complex genome assembly is difficult due to repeats
- de novo genome assembly is not a solved problem

# pair end results

