## Genome Assembly

## by Ahmet Sacan



## Genome Assembly

- Given Reads:
- AAA, AAB, ABB, BBA, BBB
-What is the genome sequence?
- One solution:
- AAAAABABBBBABBB


## Two classes of methods

Overlap graph


Overlap-Layout-Consensus (OLC) assembly

De Bruijn graph


De Bruijn Graph based
(DBG) assembly

One edge for each read

## Overlap graph

- Reads: CGTACG, TACGTA, GTACGT, ACGTAC, GTACGA, TACGAT



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## Reconstruction of Genome from Overlap Graph

- Find a walk that visits every node once. (Hamiltonian Path)

GTACGT


## Reconstruction of Genome from Overlap Graph

- Find a walk that visits every node once. (Hamiltonian Path)

ACGTAC


## Shortest Common Superstring

- SCS: Given a set of substrings, find the shortest superstring that contains these substrings
- e.g., given reads:
- $A A A, A A B, A B B, B B A, B B B$
- What is the shortest genome sequence?


## Greedy Solution to SCS

Greedy shortest common superstring


AAA AAB ABB BBA BBB

## Greedy Solution to SCS

Greedy shortest common superstring

AAA AAB ABB BBA BBB
$\stackrel{\downarrow}{\mathrm{AAAB}}{ }^{\swarrow} \mathrm{ABB}$ BBA BBB


## Greedy Solution to SCS

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Greedy shortest common superstring

$$
\text { AAABBABBB } \longleftarrow \text { superstring, length=9 }
$$



Shorter Superstring: $\quad$ AAABBBA $\longleftarrow$ superstring, length=7

## Problems with Overlap Graph

- No known efficient solution to SCS or Hamiltonian Path
- Heuristic approaches do not guarantee best solution
- It over-collapses the repeats in the genome, resulting in fewer copies than present in the genome.


## De Bruijn Graph

| WILL | ILLY | LLYN | LYNI | YNIL |
| :--- | :--- | :--- | :--- | :--- |

WILL
ILLY
LLYN
LYNI
YNIL
NILL
ILLY
WILLYNILLY

## De Bruijn Graph



W
ILLY
N
ILLY
WILLYNILLY

## De Bruijn Graph

| WILL | ILLY | LLYN | LYNI | YNIL |
| :--- | :--- | :--- | :--- | :--- |

WILL
ILLY
LLYN
LYNI
YNIL
NILL
ILLY
WILLYNILLY

## De Bruijn Graph

genome: AAABBBBA
k=3: k-mers: $A A A, A A B, A B B, B B B, B B B, B B A$
k-1-mers: $\quad A A, A A \quad A A, A B \quad A B, B B \quad B B, B B \quad B B, B B \quad B B, B A$


One node per distinct k-1-mer

## De Bruijn Graph

genome: AAABBBBA


One node per distinct k -1-mer One edge per k-mer

## Genome Reconstruction from De Brujin Graph



## AAABBBBA

Walk crossing each edge exactly once (Eulerian Path)
gives a reconstruction of the genome.

## Seven Bridges of Königsberg

- Find a walk that crosses each bridge exactly once.



## Euler Path/Cycle

- Is there an Euler Path/Cycle?



## Euler Path/Cycle

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## Euler Path/Cycle

- Find a Euler Path in the following graph



## Fleury's Algorithm

- Refuse if graph doesn't have 0 or 2 odd nodes.
- Start:
- If 2 odd nodes: start from one of the odd nodes.
- If no odd node: start from any node
- Keep walking.
- If you have a choice between a "bridge" and a "nonbridge" edge, always choose the non-bridge edge.
- A "bridge" edge is one whose removal would disconnect the remaining graph


## Fleury's Algorithm

- Find a Euler Path in the following graph



## Genome Reconstruction from De Brujin Graph



## AAABBBBA

Walk crossing each edge exactly once (Eulerian Path)
gives a reconstruction of the genome.

# DeBruijn + Euler Path Genome Reconstruction Example ( $k=5$ ) 

$$
\begin{aligned}
& \text { a_long_long_long_time } \\
& \text { a_lon ng_lo } \\
& \text { _long g_lon } \\
& \text { long_ _long } \\
& \text { ong_l long_ } \\
& \text { ng_lo ong_t } \\
& \text { g_lon ng_ti } \\
& \text { _long g_tim } \\
& \text { long_ _time } \\
& \text { ong_1 }
\end{aligned}
$$

## DeBruijn + Euler Path Genome Reconstruction Example ( $k=5$ )

a_lon ng_lo<br>_long g_lon<br>long_ _long<br>ong_l long_<br>ng_lo ong_t g_lon ng_ti<br>_long g_tim<br>long_ _time<br>ong_l


a_long_long_long_time

## Problem: Reads are not perfect

- Reads are:
- longer than $k$
- non-uniform
- incomplete

Genome: a_long_long_long_time
Reads: a_long_long_long, ng_long_l, g_long_time


## Biggest Problem: Repeats

Right: graph for ZABCDABEFABY, $k=3$

$$
\begin{aligned}
& \mathrm{ZA} \rightarrow \mathrm{AB} \rightarrow \mathrm{BE} \rightarrow \mathrm{EF} \rightarrow \mathrm{FA} \rightarrow \mathrm{AB} \rightarrow \mathrm{BC} \rightarrow \mathrm{CD} \rightarrow \mathrm{DA} \rightarrow \mathrm{AB} \rightarrow \mathrm{BY} \\
& \mathrm{ZA} \rightarrow \mathrm{AB} \rightarrow \mathrm{BC} \rightarrow \mathrm{CD} \rightarrow \mathrm{DA} \rightarrow \mathrm{AB} \rightarrow \mathrm{BE} \rightarrow \mathrm{EF} \rightarrow \mathrm{FA} \rightarrow \mathrm{AB} \rightarrow \mathrm{BY}
\end{aligned}
$$



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\end{aligned}
$$



## More repeats



## More Problems: Polyploidy



## More Problems: Sequencing Errors



## More Problems: Sequencing Errors



## Reference Genomes are incomplete



Chaisson MJ, et al. Resolving the complexity of the human genome using single-molecule sequencing. Nature. 2015 Jan 29;517(7536):608-11.

