#### Topics of today:

| 1. | Breakpoint | graph | of two | genomes |
|----|------------|-------|--------|---------|
|    |            |       |        |         |

2. SCJ circular median

3. Breakpoint median and halving

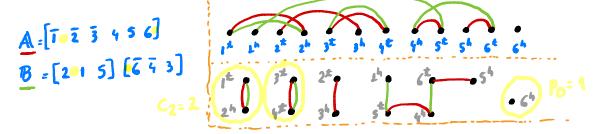
4. NP-hardness of unichromosomal breakpoint median

5. Large-scale rearrangements and the DCJ operation

# Breakpoint graph of canonical genomes

Genomes  $\mathbb{A}^f_{\triangleright}$  and  $\mathbb{B}^f_{\triangleright}$  are canonical, with  $\mathcal{F}_{\star} = \mathcal{G}_{\star} = \{1, 2, ..., n\}$ 

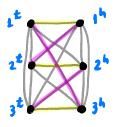
- 1. Set of vertices  $V(G) = \bigcup_{X \in G_+} \{X^h, X^t\} \implies |V(G)| = 2n$
- 2. Set of edges  $E(G) = \Gamma(\mathbb{A}^f_{\triangleright}) \cup \Gamma(\mathbb{B}^f_{\triangleright}) \quad \Rightarrow |E(G)| = |\Gamma(\mathbb{A}^f_{\triangleright})| + |\Gamma(\mathbb{B}^f_{\triangleright})| \le 2n$



Each vertex has degree 1 or 2: collection of 
$$p$$
 paths and  $c$  (even) cycles  $(p = \kappa(\mathbb{A}^f_{\triangleright}) + \kappa(\mathbb{B}^f_{\triangleright}))$  length of a component: number of edges  $(p = \kappa(\mathbb{A}^f_{\triangleright}) + \kappa(\mathbb{B}^f_{\triangleright}))$  (common adjacencies) 
$$\mathsf{d}_{\mathrm{BP}}(\mathbb{A}^f_{\triangleright}, \mathbb{B}^f_{\triangleright}) = n - c_2 - \frac{p_0}{2} \begin{cases} c_2 = \text{number of } 2\text{-cycles in } BG(\mathbb{A}^f_{\triangleright}, \mathbb{B}^f_{\triangleright}) \text{ (common adjacencies)} \\ p_0 = \text{number of } 0\text{-paths in } BG(\mathbb{A}^f_{\triangleright}, \mathbb{B}^f_{\triangleright}) \text{ (common telomeres)} \end{cases}$$

# Complete graph of a set of genes

Complete graph 
$$\mathfrak{G}$$
 of  $\mathcal{A} = \{1, 2, ..., n\}$ :  
Set of vertices  $V(\mathfrak{G}) = \bigcup_{X \in \mathcal{A}} \{X^h, X^t\} \implies |V(\mathfrak{G})| = 2n$ 



A perfect matching M in  $\mathfrak G$  corresponds to |M|=n adjacencies and, consequently, defines a circular singular genome  $\mathbb C$ , with  $\Gamma(\mathbb C)=M$ .

# SCJ median of k canonical genomes

Given k canonical genomes  $\mathbb{C}^f_1$ ,  $\mathbb{C}^f_2$ , ...  $\mathbb{C}^f_k$ , find another canonical genome  $\mathbb{M}^f$  that minimizes the sum:

$$\begin{split} \mathsf{s}_{\text{SCJ}}(\mathbb{M}^f) & = & \mathsf{d}_{\text{SCJ}}(\mathbb{M}^f, \mathbb{C}_1^f) + \mathsf{d}_{\text{SCJ}}(\mathbb{M}^f, \mathbb{C}_2^f) + ... + \mathsf{d}_{\text{SCJ}}(\mathbb{M}^f, \mathbb{C}_k^f) \\ & = & |\Gamma(\mathbb{C}_1^f)| + |\Gamma(\mathbb{C}_2^f)| + ... + |\Gamma(\mathbb{C}_k^f)| + \omega(\mathbb{M}^f) \end{split}$$

For computing the median, we need to minimize:

$$\omega(\mathbb{M}^f) = \sum_{xy \in \Gamma(\mathbb{M}^f)} \omega(xy)$$

where 
$$\omega(xy)=k-2\cdot\phi(xy,\mathbb{C}^f_{1..k})\in\{-k,-k+2,\dots,+k-2,+k\}.$$

Solution: take only the adjacencies with negative weight

# SCJ median of k canonical circular genomes

Canonical genomes  $\mathbb{C}_1^f$ ,  $\mathbb{C}_2^f$ , ...  $\mathbb{C}_k^f$  are circular:

$$\mathbf{s}_{\mathrm{SCJ}}(\mathbb{M}^f) = |\Gamma(\mathbb{C}_1^f)| + |\Gamma(\mathbb{C}_2^f)| + \dots + |\Gamma(\mathbb{C}_k^f)| + \omega(\mathbb{M}^f)$$
$$= 3n + \omega(\mathbb{M}^f)$$

Again, we need to minimize  $\omega(\mathbb{M}^f) = \sum_{xy \in \Gamma(\mathbb{M}^f_{\triangleright})} \omega(xy)$ , where  $\omega(xy) = k - 2 \cdot \phi(xy, \mathbb{C}^f_{1..k})$ , but since the median is required to be circular, it may not be possible to take only the adjacencies that have a negative weight

#### Solution:

- 1. Build the complete graph  $\mathfrak G$  of  $\mathcal G_\star$
- 2. Assign weights to each edge xy of  $\mathfrak{G}$ :  $\omega(xy) = k 2 \cdot \phi(xy, \mathbb{C}^f_{1..k})$ .

$$\omega(xy) \in \{-3, -1, +1, +3\}$$

$$(3) (4) (1) (0)$$

$$Ex: C_{1} = (1 2 3)$$

$$C_{2} = (3 2, 1)$$

$$C_{3} = (3, 1, 2)$$

2<sup>k</sup>
3<sup>k</sup>
3<sup>k</sup>
3<sup>k</sup>
3<sup>k</sup>
3<sup>k</sup>
3<sup>k</sup>
1 1 2 3)

Perfect matching M in  $\mathfrak{G} \Leftrightarrow \text{Circular genome } \mathbb{M}^f$ ; with  $\omega(M) = \omega(\mathbb{M}^f)$ 

A perfect matching  $M_{\min}$  with **minimum weight** gives a circular SCJ median  $\mathbb{M}^f_{\min}$  with **minimum weight** 

# Breakpoint median of three canonical circular genomes

Given canonical circular genomes  $\mathbb{C}^f_1$ ,  $\mathbb{C}^f_2$  and  $\mathbb{C}^f_3$ , find a canonical circular genome  $\mathbb{M}^f_{\triangleright}$  that minimizes the sum:

$$\begin{split} \mathbf{s}_{\mathrm{BP}}(\mathbb{M}_{\triangleright}^{f}) &= & \mathbf{d}_{\mathrm{BP}}(\mathbb{M}_{\triangleright}^{f}, \mathbb{C}_{1}^{f}) \ + \ \mathbf{d}_{\mathrm{BP}}(\mathbb{M}_{\triangleright}^{f}, \mathbb{C}_{2}^{f}) \ + \ \mathbf{d}_{\mathrm{BP}}(\mathbb{M}_{\triangleright}^{f}, \mathbb{C}_{k}^{f}) \\ &= & n - \sum_{xy \in \Gamma(\mathbb{M}_{\triangleright}^{f})} \phi(xy, \mathbb{C}_{1}^{f}) \ + \ n - \sum_{xy \in \Gamma(\mathbb{M}_{\triangleright}^{f})} \phi(xy, \mathbb{C}_{2}^{f}) \ + \ n - \sum_{xy \in \Gamma(\mathbb{M}_{\triangleright}^{f})} \phi(xy, \mathbb{C}_{3}^{f}) \\ &= & 3n \ - \sum_{xy \in \Gamma(\mathbb{M}_{\triangleright}^{f})} \phi(xy, \mathbb{C}_{1..3}^{f}) \\ &= & 3n \ - \ \omega'(\mathbb{M}_{\triangleright}^{f}) \end{split}$$

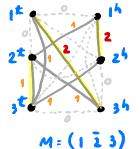
Here we need to maximize  $\omega'(\mathbb{M}^f_{\triangleright}) = \sum_{xy \in \Gamma(\mathbb{M}^f_{\triangleright})} \omega'(xy)$ , where  $\omega'(xy) = \phi(xy, \mathbb{C}^f_{1..3})$ .

- 1. Build the complete graph  $\mathfrak G$  of  $\mathcal G_\star$
- 2. Assign weights to each edge xy of  $\mathfrak{G}$ :  $\omega'(xy) = \phi(xy, \mathbb{C}_1^f)$

$$\omega(xy) \in \{0, 1, 2, 3\}$$
  $Ex: C_{1} = (123)$ 

$$C_{2} = (32, \overline{1})$$

$$C_{3} = (3.1, \overline{2})$$



Perfect matching M in  $\mathfrak{G}\Leftrightarrow \mathsf{Circular}$  genome  $\mathbb{M}^f$  ; with  $\omega'(M)=\omega'(\mathbb{M}^f)$ 

A perfect matching  $M_{\min}$  with maximum weight gives a circular BP median  $\mathbb{M}^f_{\min}$  with maximum weight

# Breakpoint median of three canonical genomes

Given canonical genomes  $\mathbb{C}_1^f$ ,  $\mathbb{C}_2^f$  and  $\mathbb{C}_3^f$ , find a canonical genome  $\mathbb{M}_{\triangleright}^f$  that minimizes the sum:

$$\begin{split} \mathbf{s}_{\mathrm{BP}}(\mathbb{M}_{\triangleright}^f) &=& \mathbf{d}_{\mathrm{BP}}(\mathbb{M}_{\triangleright}^f, \mathbb{C}_1^f) \; + \; \mathbf{d}_{\mathrm{BP}}(\mathbb{M}_{\triangleright}^f, \mathbb{C}_2^f) \; + \; \mathbf{d}_{\mathrm{BP}}(\mathbb{M}_{\triangleright}^f, \mathbb{C}_k^f) \\ &=& n - \sum_{xy \in \Gamma(\mathbb{M}_{\triangleright}^f)} \phi(xy, \mathbb{C}_1^f) - \sum_{x \in \Theta(\mathbb{M}_{\triangleright}^f)} \frac{\phi(x, \mathbb{C}_1^f)}{2} \; + \; n - \sum_{xy \in \Gamma(\mathbb{M}_{\triangleright}^f)} \phi(xy, \mathbb{C}_2^f) \\ &- \sum_{x \in \Theta(\mathbb{M}_{\triangleright}^f)} \frac{\phi(x, \mathbb{C}_2^f)}{2} \; + \; n - \sum_{xy \in \Gamma(\mathbb{M}_{\triangleright}^f)} \phi(xy, \mathbb{C}_3^f) - \sum_{x \in \Theta(\mathbb{M}_{\triangleright}^f)} \frac{\phi(x, \mathbb{C}_3^f)}{2} \end{split}$$

$$&= 3n \; - \; \sum_{xy \in \Gamma(\mathbb{M}_{\triangleright}^f)} \phi(xy, \mathbb{C}_{1..3}^f) \; - \; \sum_{x \in \Theta(\mathbb{M}_{\triangleright}^f)} \frac{\phi(x, \mathbb{C}_{1..3}^f)}{2} \end{split}$$

Here 
$$\omega'(\mathbb{M}^f_{\triangleright}) = \sum_{xy \in \Gamma(\mathbb{M}^f_{\uparrow})} \omega'(xy) + \sum_{x \in \Theta(\mathbb{M}^f_{\uparrow})} \omega'(x)$$
, where  $\omega'(xy) = \phi(xy, \mathbb{C}^f_{1..3})$  and  $\omega'(x) = \frac{\phi(x, \mathbb{C}^f_{1..3})}{2}$ .

- 1. Build the complete graph &
- 2. Assign weights to each edge xy of  $\mathfrak{G}$ :  $\omega'(xy) = \phi(xy, \mathbb{C}^f_{1...k})$ .
- 3. Build the complete graph  $\mathfrak{G}_t$  with vertices  $V(\mathfrak{G}_t) = \bigcup_{\chi \in G} \{t_{\chi h}, t_{\chi t}\}$
- 4. Assign weight 0 to each edge of  $\mathfrak{G}_t$
- 5. Add one edge connecting each vertex x in  $\mathfrak{G}$  to the corresponding vertex  $t_x$  in  $\mathfrak{G}_t$ , with weight  $\omega'(xt_x) = \frac{\phi(x,\mathbb{C}^f_{1..k})}{2}$

Perfect matching 
$$M$$
 in  $\mathfrak{G}+\mathfrak{G}_t\Leftrightarrow \mathsf{Genome}\ \mathbb{M}^f$  ; with  $\omega'(M)=\omega'(\mathbb{M}^f)$ 

A matching  $M_{\scriptscriptstyle ext{MIN}}$  with maximum weight gives a BP median  $\mathbb{M}^f_{min}$  with maximum weight

$$L_{1} = \begin{bmatrix} 1 & 2 & 3 & 4 \end{bmatrix}$$

$$L_{2} = \begin{bmatrix} 3 & 2 & 1 \end{bmatrix} \begin{bmatrix} 4 \end{bmatrix}$$

$$L_{3} = \begin{bmatrix} \bar{1} & 2 & \bar{3} & \bar{3} \end{bmatrix}$$

$$L_{3} = \begin{bmatrix} \bar{1} & 2 & 3 & 4 \end{bmatrix}$$

$$W(M) = 6$$

$$L_{1} = \begin{bmatrix} 1 & 2 & 3 & 4 \end{bmatrix}$$

$$L_{2} = \begin{bmatrix} 3 & 2 & 1 \end{bmatrix} \begin{bmatrix} 4 \end{bmatrix}$$

$$L_{3} = \begin{bmatrix} \bar{1} & 2 & \bar{4} & \bar{5} \end{bmatrix}$$

$$M_{2} = \begin{bmatrix} 3 & 4 & \bar{2} & 1 \end{bmatrix}$$

$$\omega(M_{2}) = 6$$

The breakpoint helving can

be computed in a similar way

#### Quiz 1

- 1 Which of the following statements are true?
  - A The breakpoint median can only be computed for circular genomes.
  - B The circular SCJ median is equivalent to the circular breakpoint median of three canonical circular genomes.
  - C The problem of computing a circular breakpoint halving of a circular duplicated genome is polynomial.

### NP-hardness of unichromosomal breakpoint median

A unichromosomal circular genome  ${\mathbb C}$  can be represented as a simple directed cycle graph:

Ex:  $\mathbb{C} = (1\bar{2}3)$ 

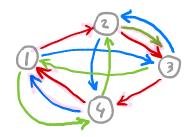


OR



Assume that the genes in three canonical circular genomes  $\mathbb{C}_1^f$ ,  $\mathbb{C}_2^f$  and  $\mathbb{C}_3^f$  have the same relative orientation and represent these three genomes in the same directed cycle graph:

Ex: 
$$\mathbb{C}_1^f = (1234)$$
,  $\mathbb{C}_2^f = (2413)$ ,  $\mathbb{C}_3^f = (2314)$ 



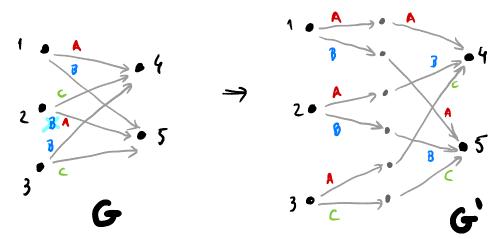
Every vertex has indegree = 3

#### NP-hardness of unichromosomal breakpoint median

The Problem of determining whether a directed graph G has a hamiltonian cycle is NP-complete, even if G has maximum indegree and maximum outdegree equal to 3.

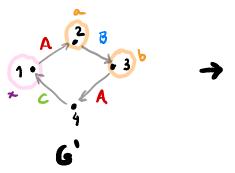
Reduction of this problem to the problem of computing a breakpoint median of three canonical circular genomes A, B and C that have the same relative orientation:

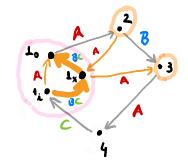
We need to transform G into another directed graph G'', such that G'' is the union of three hamiltonian cycles (each one representing one input genome of the median problem)



### NP-hardness of unichromosomal breakpoint median

Build a modified directed graph G'', such that G'' is the union of three hamiltonian cycles (each one representing one genome among A, B and C)



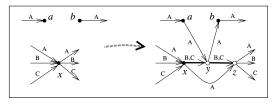


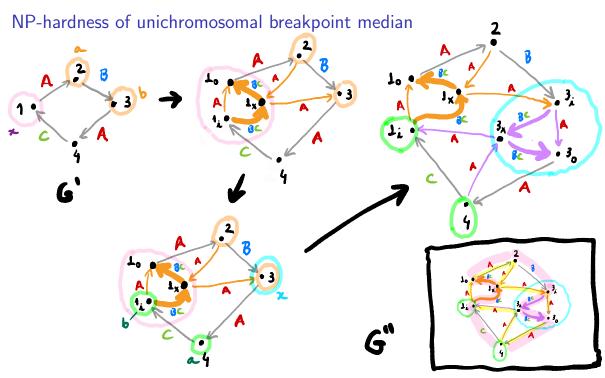
G'' has only adjacencies that occur in one or in two genomes

Let  $\mathbb M$  be a solution to the circular breakpoint median of  $\mathbf A,\, \mathbf B$  and  $\mathbf C$ :

 $\ensuremath{\mathbb{M}}$  contains all adjacencies common to two input genomes and no "new" adjacency

Initial graph G has an hamiltonian cycle





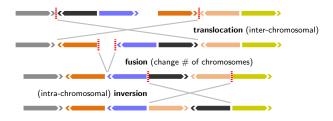
#### Quiz 2

- 1 Which of the following statements are true?
  - A There is a polynomial time algorithm for solving the unichromosomal breakpoint median.
  - B There cannot be a polynomial time algorithm for solving the unichromosomal breakpoint median.
  - C The unichromosomal breakpoint median is NP-hard because it can be reduced to the hamiltonian cycle problem.
  - D The unichromosomal breakpoint median is NP-hard because the hamiltonian cycle problem can be reduced to it.

# Double-cut-and-join (DCJ) model

**Double-cut-and-join (DCJ) operation:** two cuts + two joins

- Cuts the genome twice and rejoins loose ends in a different way.
- Represents most large-scale genome rearrangements (inversions, translocations, fusions, fissions...)



## The double-cut-and-join (DCJ) operation

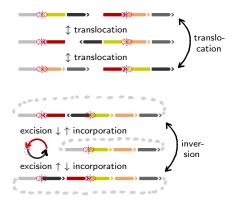
Cuts the genome in (at most) 2 positions and rejoins the open ends in a distinct way

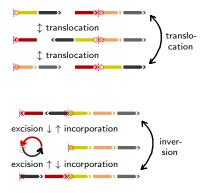




## The double-cut-and-join (DCJ) operation

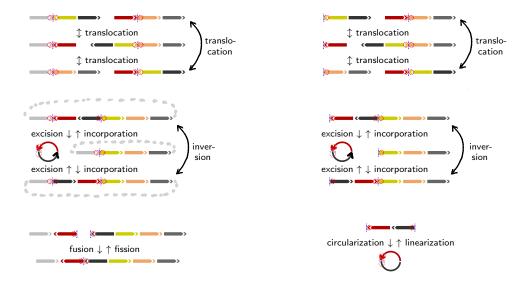
Cuts the genome in (at most) 2 positions and rejoins the open ends in a distinct way





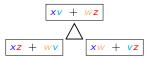
## The double-cut-and-join (DCJ) operation

Cuts the genome in (at most) 2 positions and rejoins the open ends in a distinct way



#### DCJ model

# DCJ operation involving two adjacencies



two possibilities of rejoining in a different way

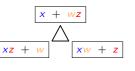
#### Cases:

A. Each adjacency is in a distinct linear chromosome:

**B.** Both adjacencies are in the same chromosome, or one is in a circular chromosome:

#### DCJ model

#### DCJ operation involving one adjacency and one telomere



two possibilities of rejoining in a different way

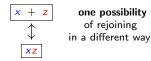
#### Cases:

A. The adjacency and the telomere are in distinct linear chromosomes:

B. The adjacency is in the same linear chromosome, or in a circular chromosome:

#### DCJ model

# DCJ operation involving one adjacency or two telomeres



#### Cases:

A. The adjacency is in a linear chromosome / the telomeres are in two distinct chromosomes:

$$\begin{bmatrix} 1 & 2 & 3 \overset{\checkmark}{\checkmark} & 1 \end{bmatrix} \begin{bmatrix} 1 & 2 & 3 \overset{\checkmark}{\checkmark} & 4 & 5 \end{bmatrix}$$
fusion  $\downarrow \uparrow$  fission
$$\begin{bmatrix} 1 & 2 & 3 \overset{\checkmark}{\checkmark} & 4 & 5 \end{bmatrix} \begin{bmatrix} 1 & 2 & 3 & 3 & 3 \end{bmatrix}$$

B. The adjacency is in a circular chromosome / the telomeres are in the same chromosome:

$$\begin{bmatrix} \begin{bmatrix} \checkmark & 1 & 2 & 3 & 4 & 5 & \\ & \checkmark & \end{bmatrix} & \text{Circularization} \\ & & & & & & & \\ & & & & & \\ & & & & & & \\ & & & & & & \\ & & & & & & \\ & & & & & \\ & & & & & & \\ & & & & & \\ & & & & & \\ & & & & & \\ & & & & & \\ & & & & & \\ & & & & & \\ & & & & & \\ & & & & & \\ & & & & & \\ & & & & & \\ & & & & & \\ & & & & & \\ & & & & \\ & & & & \\ & & & & \\ & & & & \\ & & & & \\ & & & & \\ & & & & \\ & & & & \\ & & & & \\ & & & & \\ & & & & \\ & & & & \\ & & & & \\ & & & \\ & & & & \\ & & & \\ & & & & \\ & & & & \\ & & & & \\ & & & \\ & & & & \\ & & & \\ & & & \\ & & & & \\ & &$$

#### Quiz 3

1 Which transformations can be done with a single DCJ operation?

- A [123] [45]  $\leftrightarrow$  [12453]
- B [123] [45]  $\leftrightarrow$  [123 $\bar{5}\bar{4}$ ]
- $C [123] [45] \leftrightarrow [125] [43]$
- D  $[12345] \leftrightarrow [1\bar{4}3\bar{2}5]$
- $E [12345] \leftrightarrow [12\bar{5}\bar{4}\bar{3}]$
- $F [123] (45) \leftrightarrow [12453]$
- $G [123] (45) \leftrightarrow [12543]$
- $H (12345) \leftrightarrow [34512]$

#### References

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BMC Bioinformatics volume 10, Article number: 120 (2009)

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The complexity of the breakpoint median problem

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