

# Topics of today:

Overview of studied models/problems

NP-hard problems:

1. Decomposing the cropped breakpoint graph of *unsigned* canonical genomes
2. DCJ median problem
3. DCJ double distance
4. DCJ distance of balanced genomes

# Overview of models / computational problems - 1995-2020

— Model —		Canonical distance	Double distance	Halving	Guided Halving	Median	Balanced distance
<b>Break point</b>	Multi mixed/circular	P	P	P	P	P	NP?
	Multi linear	P	P	NP	NP	NP	NP?
	Uni linear/circular	P	(open)	(NP)	(NP)	NP	NP
<b>SCJ</b>	Multi mixed	P	P	P	P	P	?
	Multi linear	P	P	P	P	P	?
	(Multi circular - initial and target)	(P)	(P)	(P)	(P)	(P)	(?)
	(Uni linear/circular - initial and target)	(P)	(open)	(open)	(open)	(open)	(?)
<b>DCJ</b>	Multi mixed/circular	P	NP	P	NP	NP	NP (ILP)
	Restricted multi linear	P	open	open	NP?	NP?	NP?
	Uni linear/circular ( <b>Inversion</b> )	P	open	P	NP?	NP	NP?
	Strict multi linear ( <b>Inv/Trsl/Fus/Fis</b> )	P	open	open	NP?	NP?	NP?

*Edit operations*

— Model —		Singular genomes	Natural genomes	Family-free genomes
<b>DCJ-indel distance</b>	Multi mixed/circular	P	NP (ILP)	NP (ILP)
	Restricted multi linear			
	Uni linear/circular ( <b>Inversion</b> )	P	NP?	NP?

previous lectures  
this and next lectures

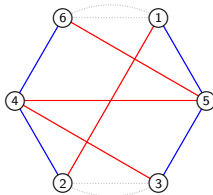
# Cropped breakpoint graph of two unsigned canonical chromosomes

Each vertex of a cropped breakpoint graph has degree 0, 2 or 4:

Unsigned canonical circular chromosomes

$$\hat{\mathbb{A}} = (1\ 5\ 3\ 2\ 4\ 6)$$

$$\mathbb{B} = (1\ 2\ 3\ 4\ 5\ 6)$$

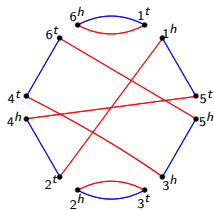


NP-hard problem:

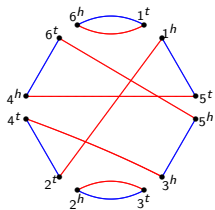
decompose a cropped breakpoint graph into the maximum number of edge-disjoint even cycles alternating colors

⇒ Inversion distance of unsigned chromosomes is NP-hard

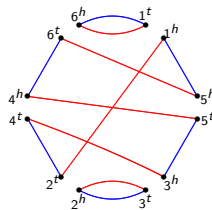
Corresponding breakpoint diagrams of signed canonical chromosomes:



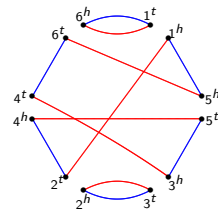
$$\mathbb{A}_1 = (1\ 5\ \bar{3}\ \bar{2}\ \bar{4}\ 6)$$



$$\mathbb{A}_2 = (1\ 5\ \bar{3}\ \bar{2}\ 4\ 6)$$



$$\mathbb{A}_3 = (1\ \bar{5}\ \bar{3}\ \bar{2}\ 4\ 6)$$

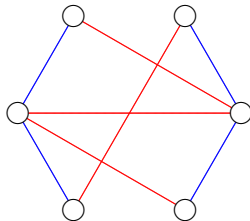


$$\mathbb{A}_4 = (1\ \bar{5}\ \bar{3}\ \bar{2}\ \bar{4}\ 6)$$

# Balanced bicolored graph decomposition (BGDEC)

Each vertex of a balanced bicolored graph has degree 0, 2 or 4

The number of red and of blue edges incident in each vertex is identical



Problem:

Entirely decompose a balanced bicolored graph  
into the maximum number of edge-disjoint  
alternating even cycles



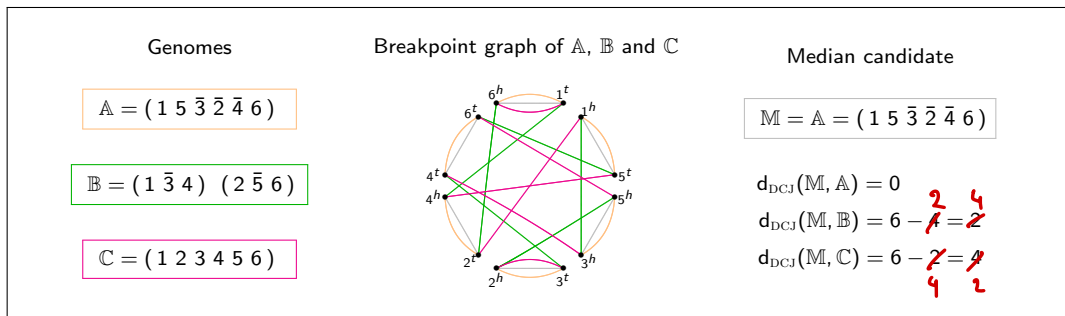
NP-hard

# DCJ median of three canonical genomes

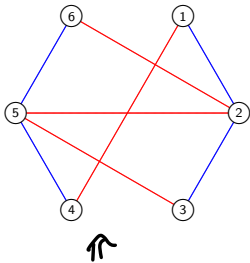
Given three canonical genomes  $A$ ,  $B$ ,  $C$ , find another canonical genome  $M$  that minimizes the sum

$$d_{\text{DCJ}}(M, A) + d_{\text{DCJ}}(M, B) + d_{\text{DCJ}}(M, C)$$

Example:

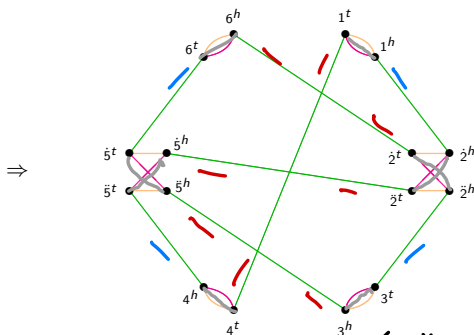


# Reducing BGDEC to the DCJ median of three canonical genomes



$w_2$ : # vertices  
with degree 2

$w_4$ : # vertices  
with degree 4



A, B, C

$$n = w_2 + 2w_4$$

$$d(M, A) = w_2 + 2w_4 - w_2 - k_A$$

$$d(M, B) = w_2 + 2w_4 - w_2 - k_B$$

$$k_A + k_B = 3w_4$$

$$d(M, C) = w_2 + 2w_4 - k_C$$

$$\sum_{G \in \{A, B, C\}} d(M, G) = w_2 + 6w_4 - 3w_4 - k_C = w_2 + 3w_4 - k_C$$

$G \in \{A, B, C\}$

## DCJ double distance

DCJ double distance  $d_{\text{DCJ}}^2(\mathbb{S}, \mathbb{D})$  of sing-dup-canonical genomes  $\mathbb{S}$  and  $\mathbb{D}$ :

$$d_{\text{DCJ}}^2(\mathbb{S}, \mathbb{D}) = d_{\text{DCJ}}(2 \cdot \mathbb{S}, \mathbb{D})$$

Transforming  $2 \cdot \mathbb{S}$  and  $\mathbb{D}$  into **matched** canonical genomes  $\mathbb{C}_1$  and  $\mathbb{C}_2$ :

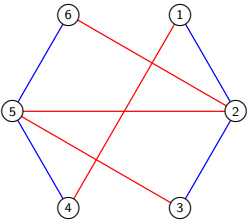
for each family  $f \in \mathcal{F}_*$ , determine which occurrence of  $f$  in  $2 \cdot \mathbb{S}$  matches each occurrence of  $f$  in  $\mathbb{D}$

$\Rightarrow$  Matched occurrences receive the same **index** in  $\mathbb{C}_1$  and in  $\mathbb{C}_2$

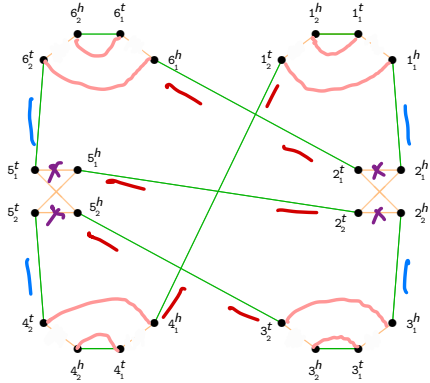
$\mathcal{C}$  : set of all possible pairs of matched canonical genomes obtained from duplicated genomes  $2 \cdot \mathbb{S}$  and  $\mathbb{D}$

$$d_{\text{DCJ}}(2 \cdot \mathbb{S}, \mathbb{D}) = \min_{(\mathbb{C}_1, \mathbb{C}_2) \in \mathcal{C}} \{d_{\text{DCJ}}(\mathbb{C}_1, \mathbb{C}_2)\}$$

# Reducing BGDEC to the DCJ double distance



⇒



GENOMES:  
 2.5  
 D



# Quiz 1

1 Which of the following statements are true?

A The multi mixed/circular DCJ double distance is NP-hard, therefore the multi mixed/circular DCJ halving is also NP-hard.

*Halving is P*

B The multi linear breakpoint double distance is polynomial, therefore the multi linear breakpoint halving is also polynomial.

*Multi linear BP halving is NP*

C The inversion-indel distance can be computed in polynomial time.

2 We prove that DCJ median is NP-hard...

A ... by reducing it to the bicolored graph decomposition.

B ... by reducing the bicolored graph decomposition to it.

## DCJ distance of balanced genomes

$$\text{Balanced genomes } \mathbb{A} \text{ and } \mathbb{B} \quad \left\{ \begin{array}{l} \mathcal{F}_* = \mathcal{F}(\mathbb{A}) = \mathcal{F}(\mathbb{B}) \\ \mathcal{G}_* = \mathcal{G}(\mathbb{A}) = \mathcal{G}(\mathbb{B}) \\ \text{for each family } f \in \mathcal{F}_*, \Phi(f, \mathbb{A}) = \Phi(f, \mathbb{B}) \end{array} \right.$$

Transforming  $\mathbb{A}$  and  $\mathbb{B}$  into **matched** canonical genomes  $\mathbb{A}^\dagger$  and  $\mathbb{B}^\dagger$ :

for each family  $f \in \mathcal{F}_*$ , determine which occurrence of  $f$  in  $\mathbb{A}$  matches each occurrence of  $f$  in  $\mathbb{B}$

$\Rightarrow$  Matched occurrences receive the same **index** in  $\mathbb{A}^\dagger$  and in  $\mathbb{B}^\dagger$

The number of common genes between any pair of matched genomes  $\mathbb{A}^\dagger$  and  $\mathbb{B}^\dagger$  is  $n_* = \underline{\underline{|\mathcal{G}_*|}}$

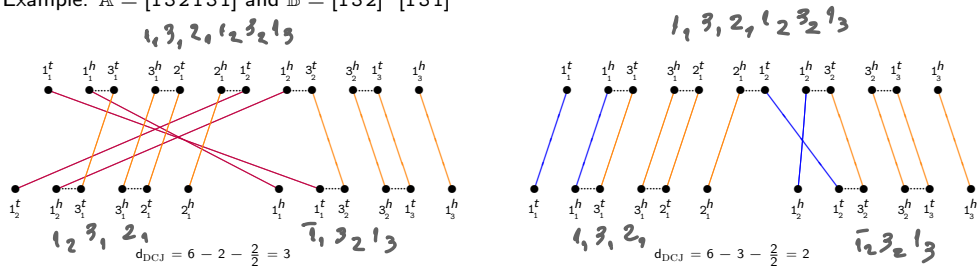
$\mathfrak{M}$  : set of all possible pairs of matched canonical genomes obtained from balanced genomes  $\mathbb{A}$  and  $\mathbb{B}$

DCJ distance of  $\mathbb{A}$  and  $\mathbb{B}$ :

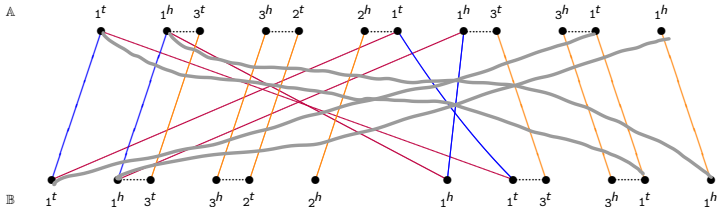
$$d_{\text{DCJ}}(\mathbb{A}, \mathbb{B}) = \min_{(\mathbb{A}^\dagger, \mathbb{B}^\dagger) \in \mathfrak{M}} \{d_{\text{DCJ}}(\mathbb{A}^\dagger, \mathbb{B}^\dagger)\}$$

# Multi-relational graph $MRG(\mathbb{A}, \mathbb{B})$

Example:  $\mathbb{A} = [132131]$  and  $\mathbb{B} = [132] \bar{[131]}$



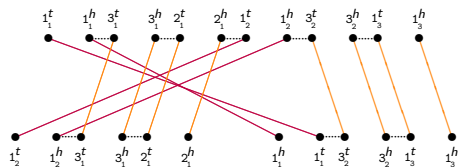
MRG:



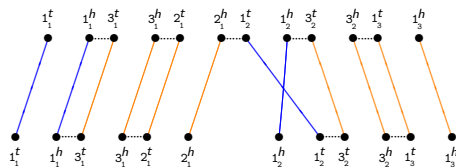
$$\begin{aligned} \phi(1) &= 3 \\ \phi(2) &= 1 \\ \phi(3) &= 2 \end{aligned}$$

# Multi-relational graph $MRG(\mathbb{A}, \mathbb{B})$

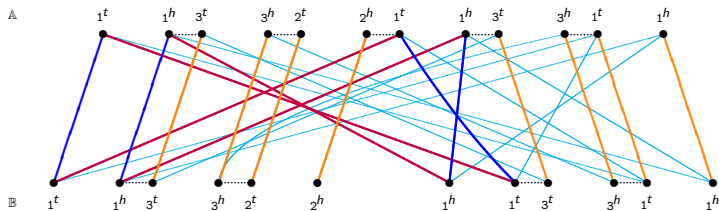
Example:  $\mathbb{A} = [132131]$  and  $\mathbb{B} = [132] \ [131]$



$$d_{DCJ} = 6 - 2 - \frac{2}{2} = 3$$



$$d_{DCJ} = 6 - 3 - \frac{2}{2} = 2$$



## Consistent decompositions of $MRG(\mathbb{A}, \mathbb{B})$

$S$ : Siblings set: matching of extremity edges

$D[S]$ : decomposition induced by a maximal siblings set  $S$   
+ all adjacency edges

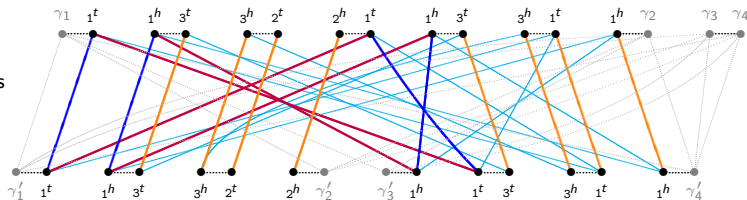
$$D[S]: C_D + P_D \Rightarrow d_{DCJ}(D[S]): n - C_D - \frac{P_D}{2}$$

$$d_{DCJ}(A, B) = \min_{S \in S_{\max}} \{ d_{DCJ}(D[S]) \}$$

# Capped multi-relational graph $CMRG(\mathbb{A}, \mathbb{B})$

Example:  $\mathbb{A} = [132131]$  and  $\mathbb{B} = [132] \ [131]$ ,  $p_* = \max\{\kappa(\mathbb{A}), \kappa(\mathbb{B})\} = 2$

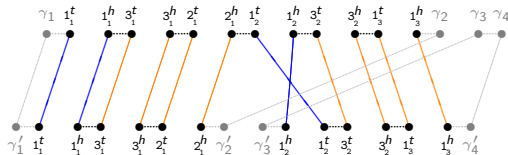
Add  $2p_*$  cap extremities to each genome



$CMRG(\mathbb{A}, \mathbb{B})$  includes all possible cappings of each maximal sibling-set

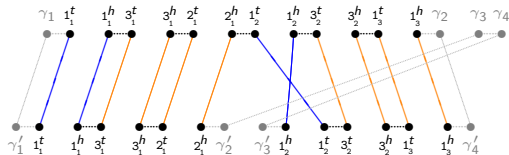
Two distinct cappings of the maximal sibling-set composed of blue + orange edges:

Non-optimal capping



$$d_{DCJ} = n + p_* - c = 6 + 2 - 5 = 3$$

Optimal capping



$$d_{DCJ} = n + p_* - c = 6 + 2 - 6 = 2$$

## Consistent decompositions of $CMRG(A, B)$

$E_0$  = set of cap extremity edges

$P$ : capping set : matchings of edges in  $E_0$

$D[S, P]$ : decomposition induced by a maximal sibling set  
and a maximal capping set  
+ all adjacency edges

$$d_{DCT}(A, B) = \min_{\substack{s \in S_{\max} \\ P \in P_{\max}}} \{ d_{DCT}(D[S, P]) \}$$

## Quiz 2

1 Which of the following statements are true?

A The multi-relational graph is a collection of paths and cycles.

B A consistent decomposition of the multi-relational graph is a collection of paths and cycles.

C There is a bijection between consistent decompositions of  $MRG(\mathbb{A}, \mathbb{B})$  and pairs of matched canonical genomes.

2 Given that  $\Phi(f, \mathbb{A}, \mathbb{B})$  is the number of occurrences of family  $f$  in  $\mathbb{A}$  and in  $\mathbb{B}$ , the number of pairs of matched canonical genomes derived from balanced genomes  $\mathbb{A}$  and  $\mathbb{B}$  is...

A  $\prod_{f \in \mathcal{F}_*} \Phi(f, \mathbb{A}, \mathbb{B})!$

B  $2 \sum_{f \in \mathcal{F}_*} \Phi(f, \mathbb{A}, \mathbb{B})!$

3 The number of distinct capping sets is

A  $2p_*$

B  $(2p_*)!$

C  $(2p_*)^2$



# References

Multichromosomal median and halving problems under different genomic distances

(Eric Tannier, Chunfang Zheng and David Sankoff)

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

An Exact Algorithm to Compute the Double-Cut- and-Join Distance for Genomes with Duplicate Genes

(Mingfu Shao, Yu Lin, and Bernard M. E. Moret)

JCB, vol. 22, no. 5, pp 425–435 (2015)