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CWI

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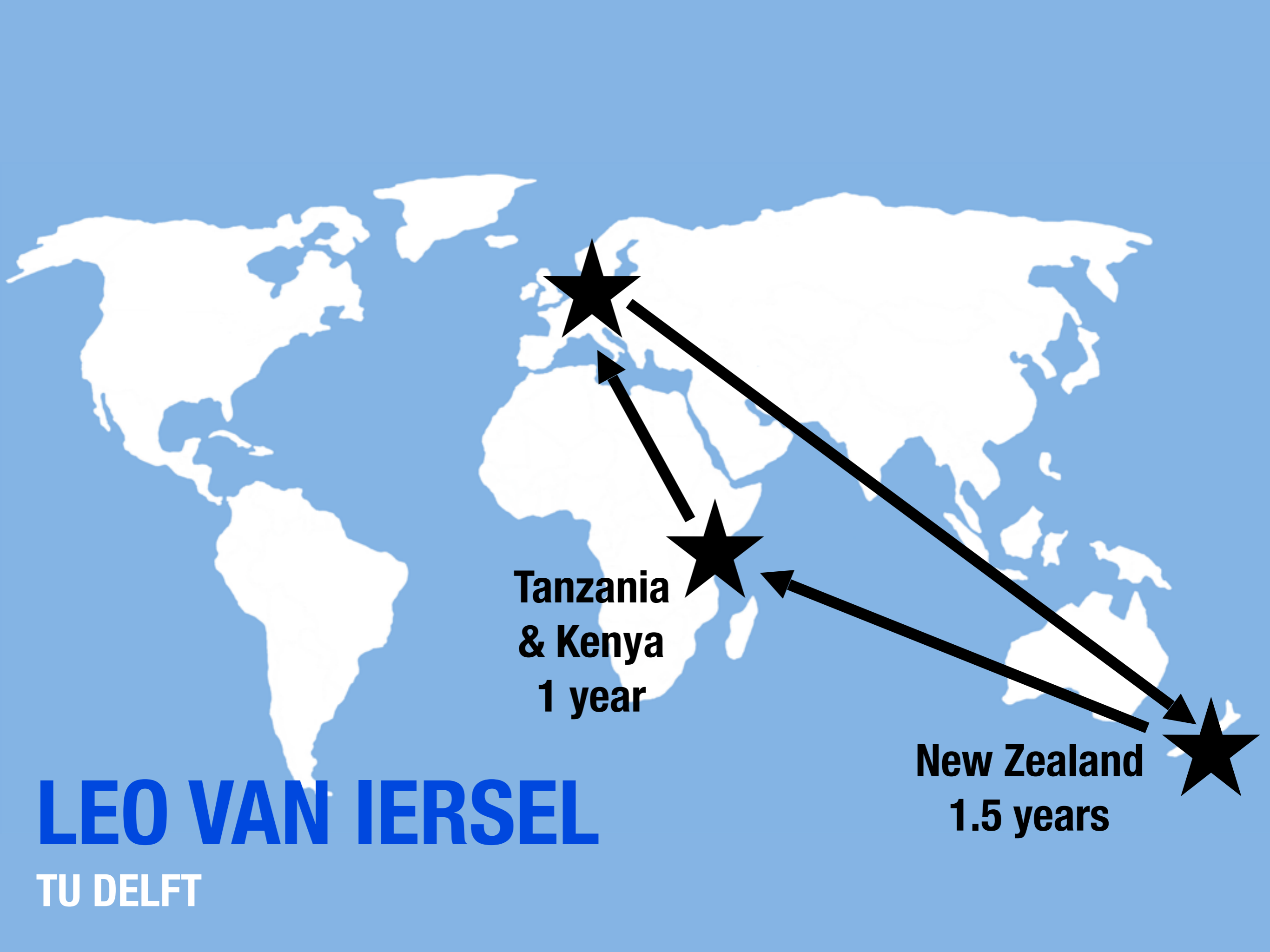


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**Tanzania
& Kenya
1 year**

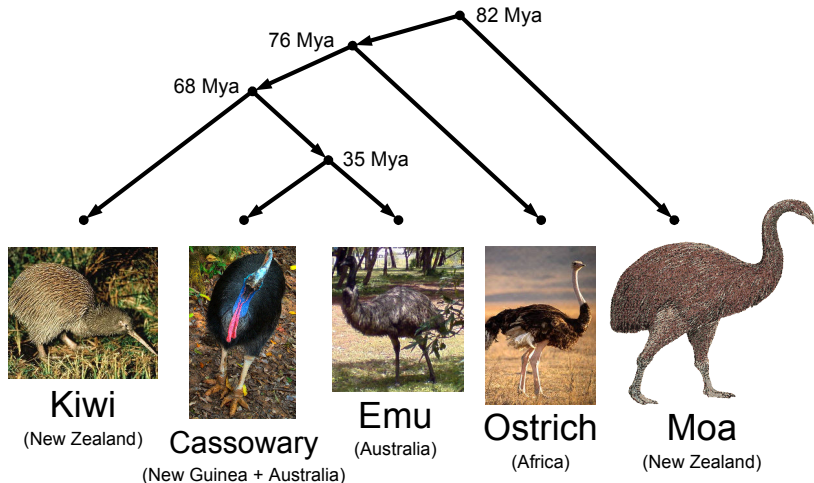
**New Zealand
1.5 years**

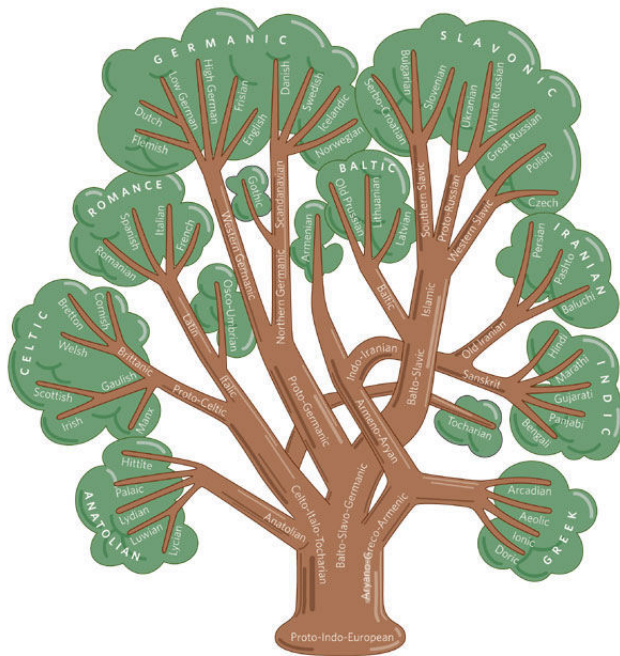
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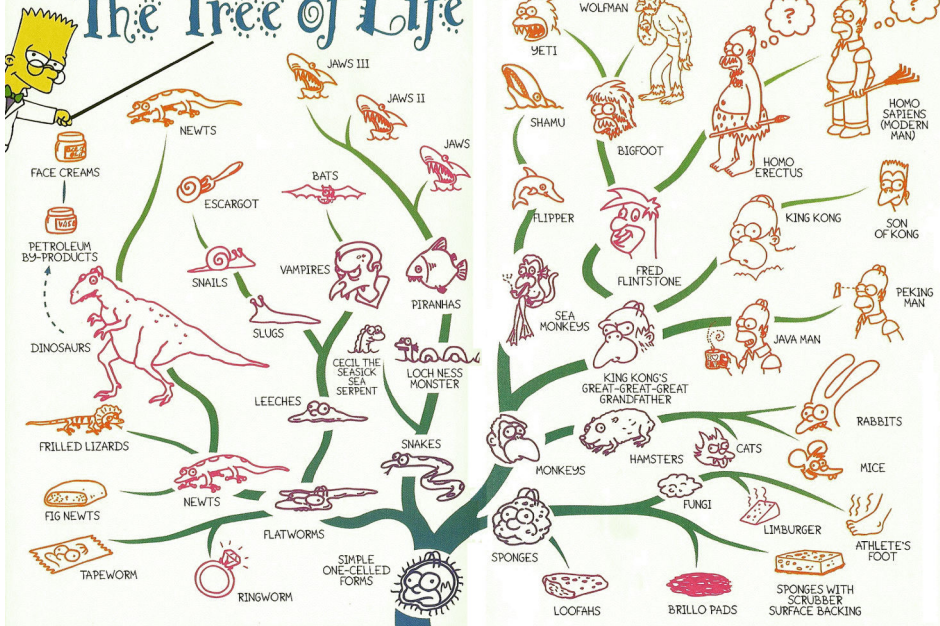
Definition

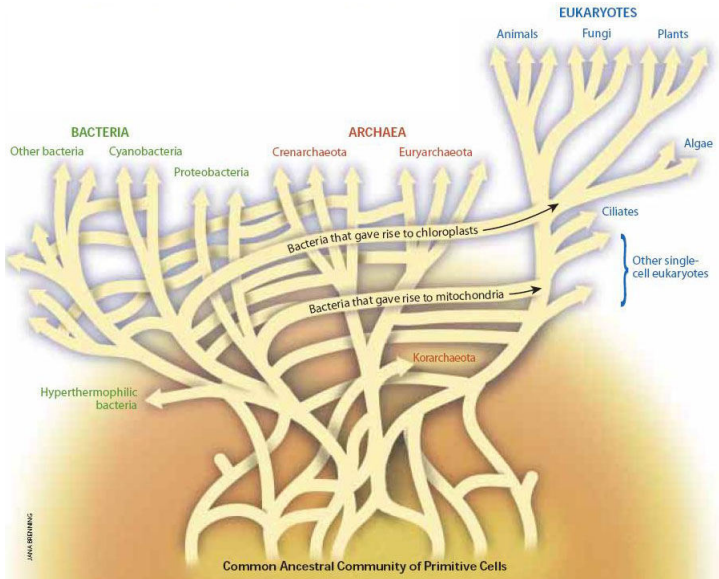
Let X be a finite set. A **(rooted) phylogenetic tree** on X is a rooted tree with no indegree-1 outdegree-1 vertices whose leaves are bijectively labelled by the elements of X .





The Tree of Life

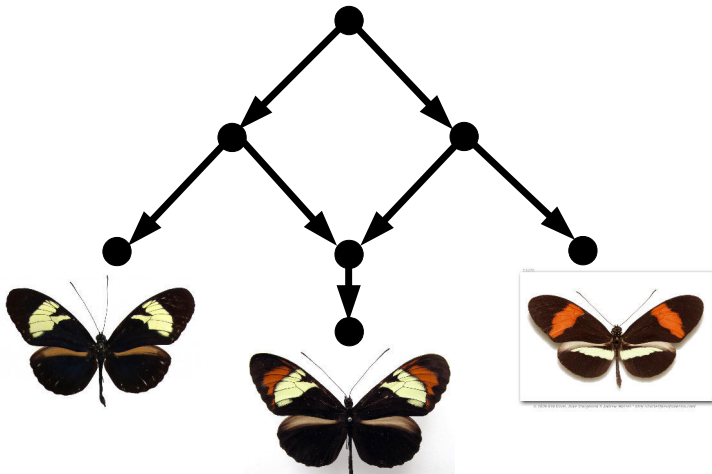




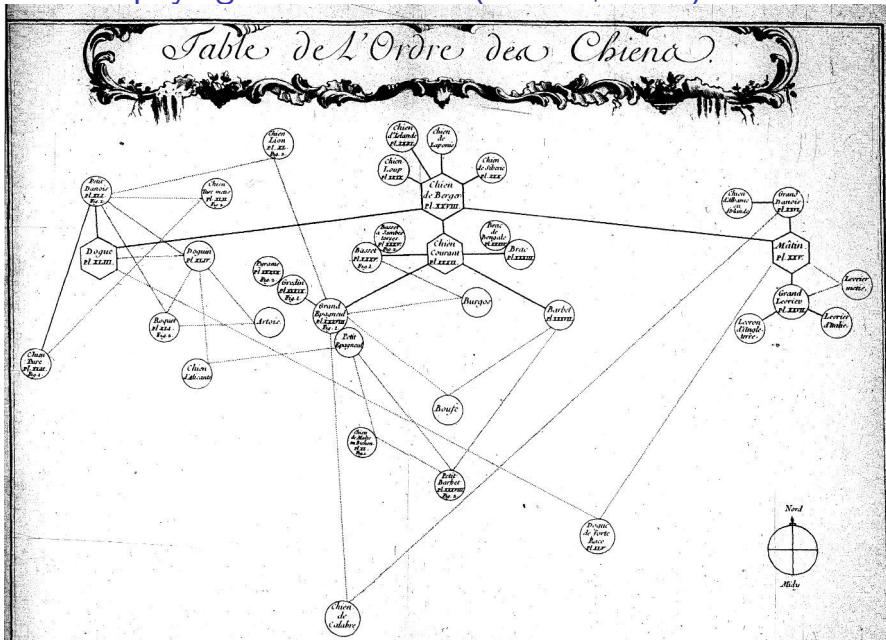
W.F. Doolittle et al. (2000)

Definition

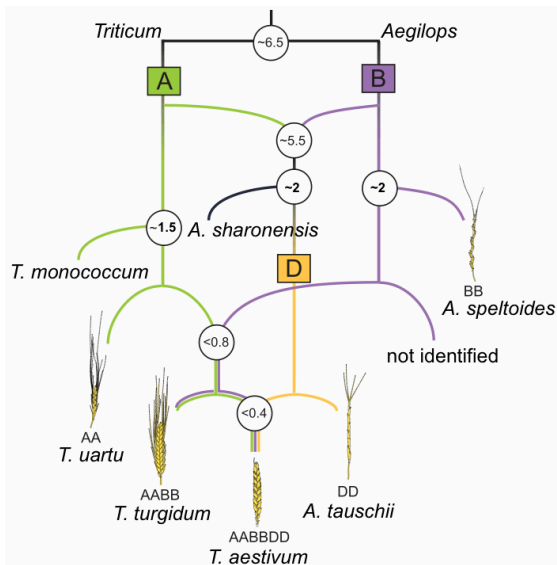
Let X be a finite set. A **(rooted) phylogenetic network** on X is a rooted directed acyclic graph with no indegree-1 outdegree-1 vertices whose leaves are bijectively labelled by the elements of X .



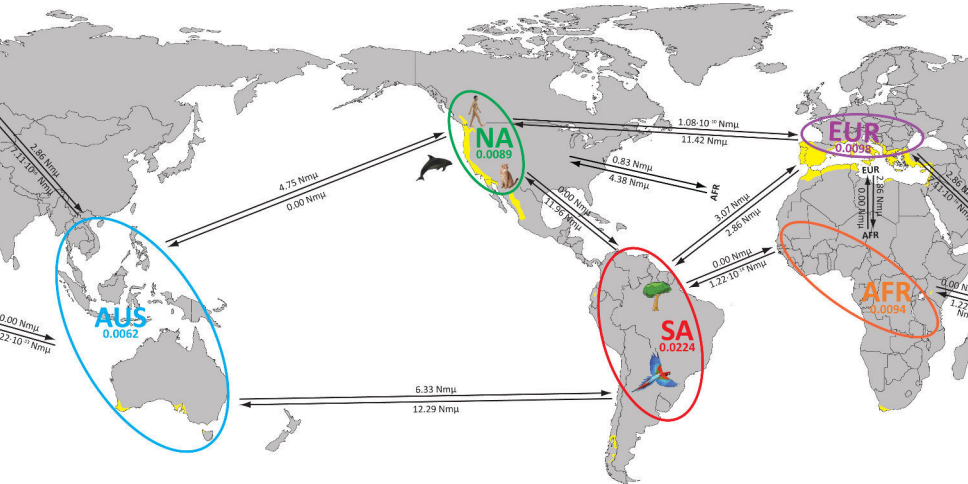
The first phylogenetic network (Buffon, 1755)



Marcussen et al., Ancient hybridizations among the ancestral genomes of bread wheat. Science (2014)



Origin of tropical pathogen *C. gattii* traced to the Amazon

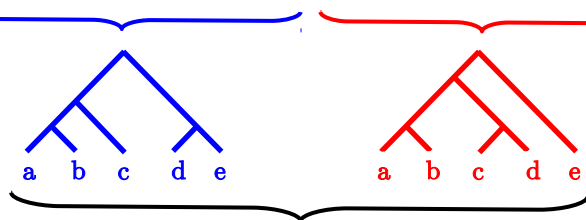


Hagen et al., Ancient dispersal of the human fungal pathogen *Cryptococcus gattii* from the Amazon rainforest. PLoS ONE (2013).

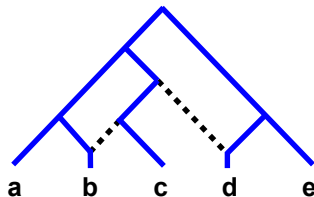
PART 1: NETWORKS FROM TREES

Species a	ACCCTAG--TC-ATC---AGC-GAC-C	TA-GTATCCCTC---TCTATATAT
Species b	ATACTAGTTTT-ATC-AAAGC-GAC-C	TA-GTAC---TCGGATCT--ATAT
Species c	ATATTAG-TC-GATCTACAGCTGAC-C	TAGGTACCCCTCGGATCCATAT-T
Species d	ACCCTAGTTTCGGATCCAAGC-GAC-C	TA-GTATCCCTC---TCTATATCT
Species e	ACC--TG-TCC-ATCTATG-CTGACTC	TA-GTATCCCTCAGA-CTATAT-A

Gene trees



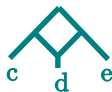
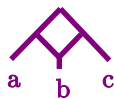
Species network



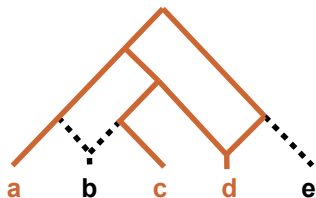
PART 2: NETWORKS FROM SUBNETS

Species a ACCCTAG--TC--ATC---AGC-GAC-CTA-GTACCCTC---TCTATATAT
Species b ATACTAGTTTT--ATC-AAAGC-GAC-CTA-GTA---TCGGATCT--ATAT
Species c ATATTAG--TC-GATCTACAGC-GAC-CTAGGTACCCTCGGATCCATAT-T
Species d ACCCTAGTTTCGGATCCCAAGC-GAC-CTA-GTACCCTC---TCTATATCT
Species e ACC--TG--TCC-ATCT--AGC-GAC-CTA-GTACCCTCAGA-CTATAT-A

Trinets



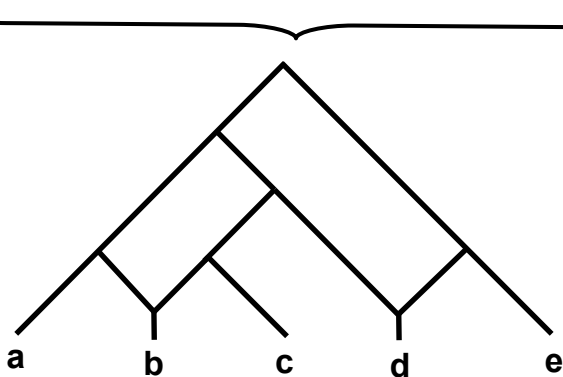
Species network



PART 3: NETWORKS FROM SEQUENCES

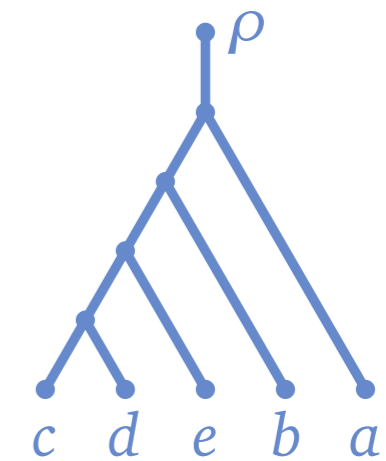
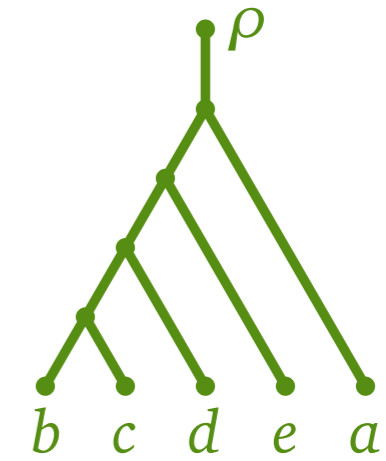
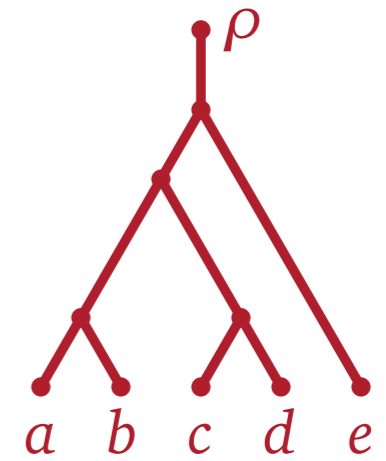
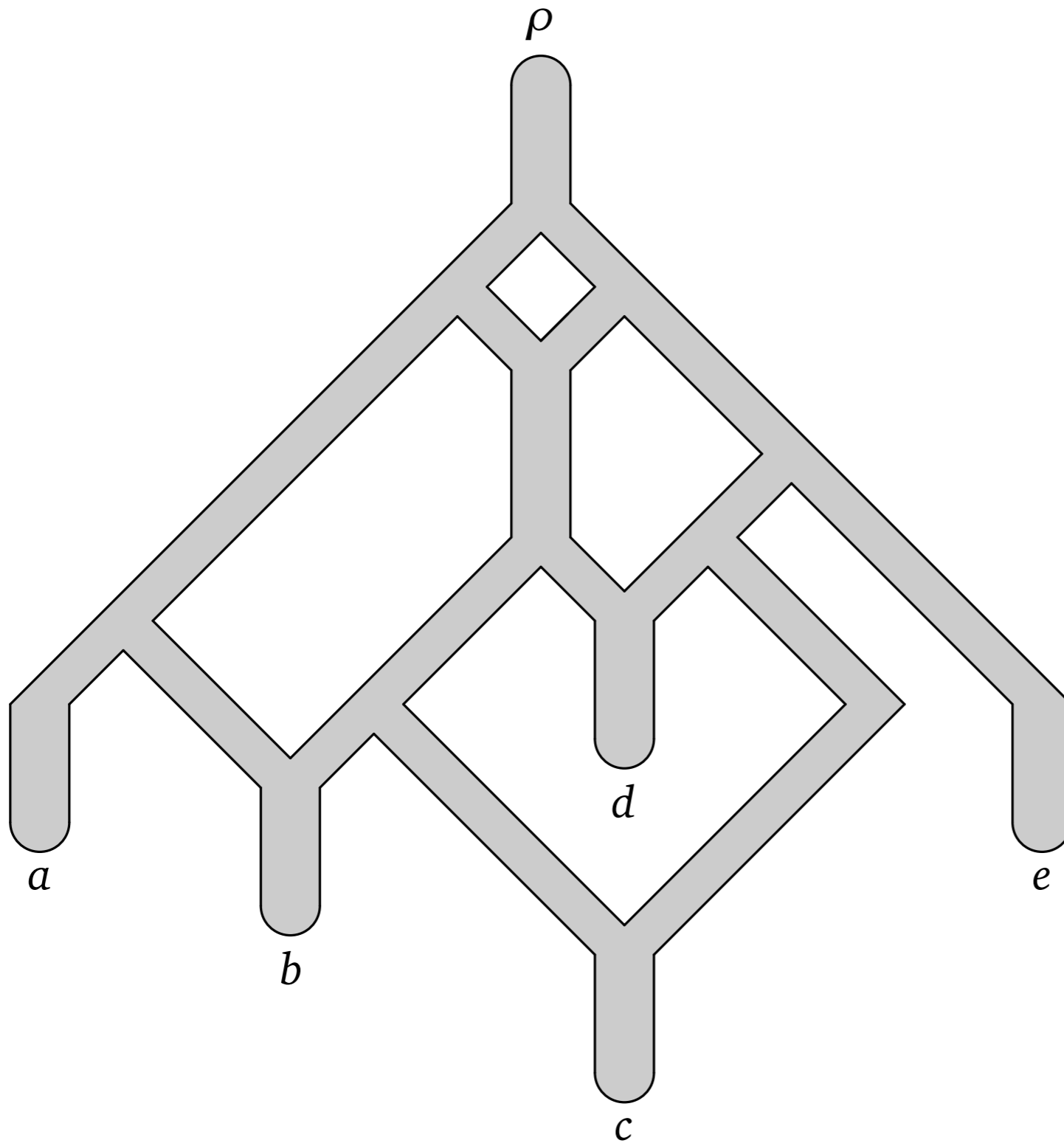
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Species network

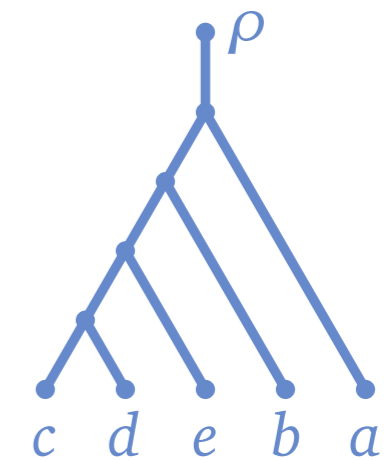
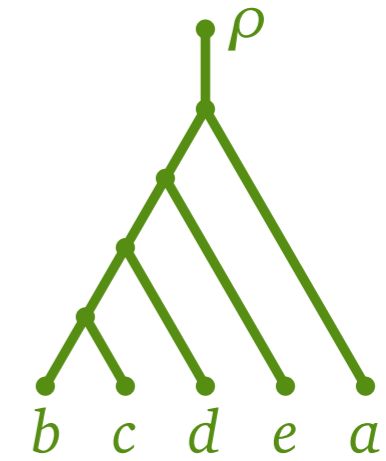
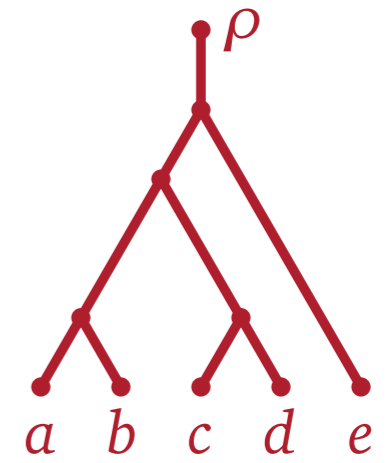
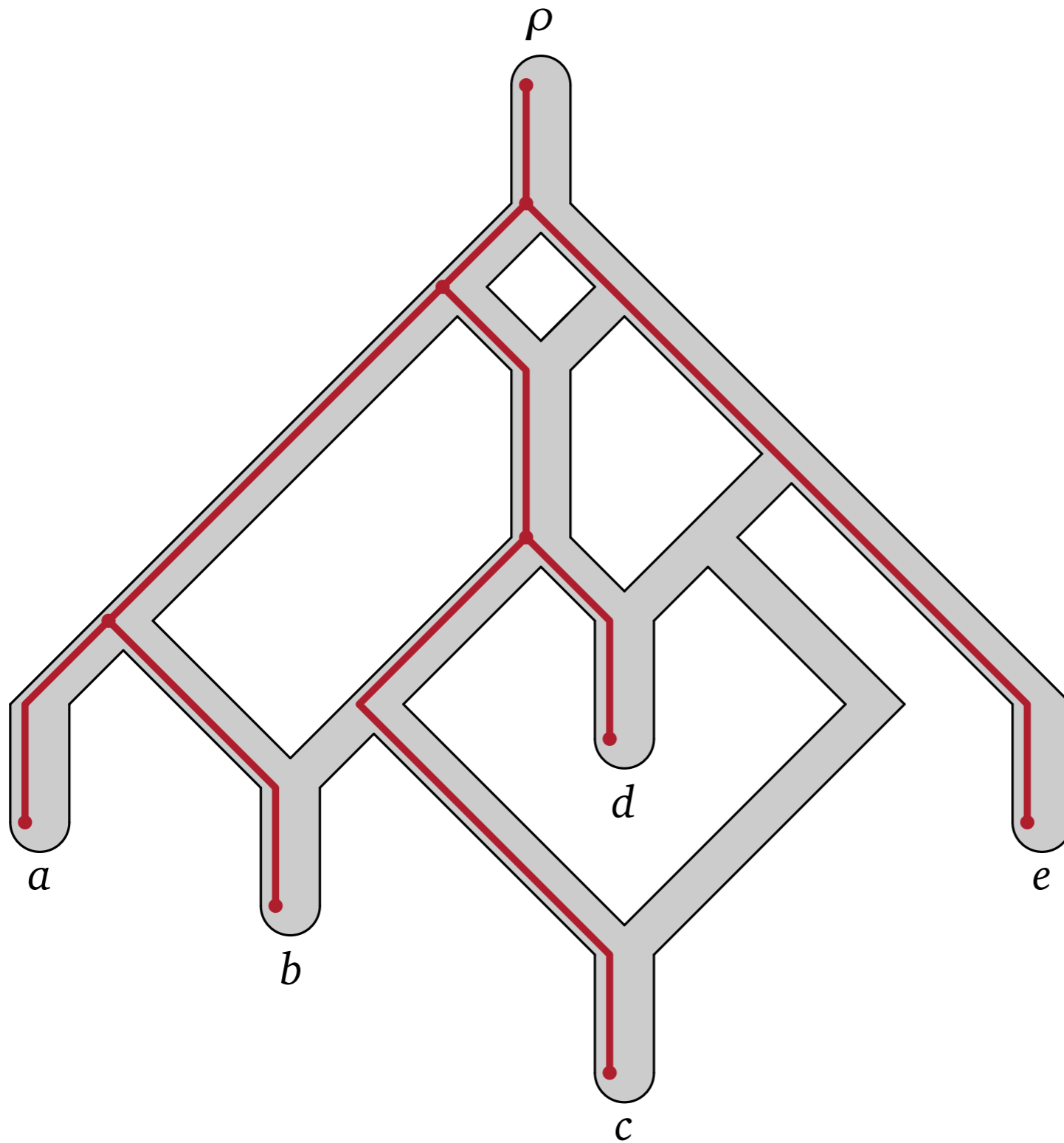


PART 1:
NETWORKS FROM TREES

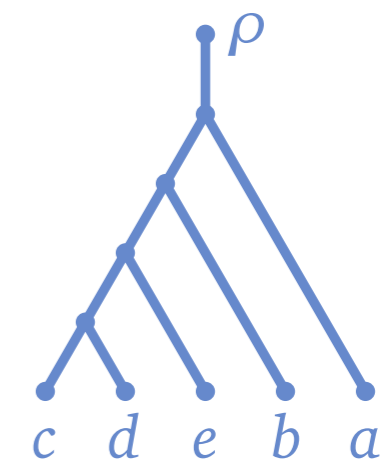
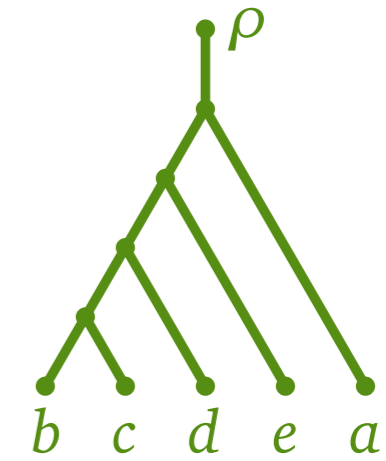
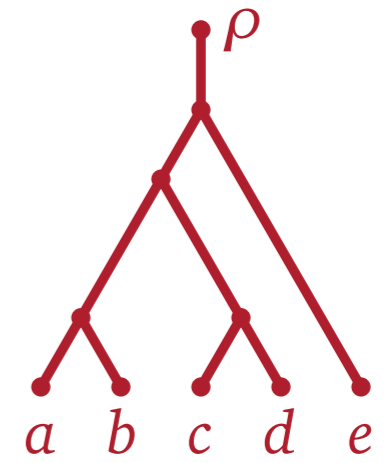
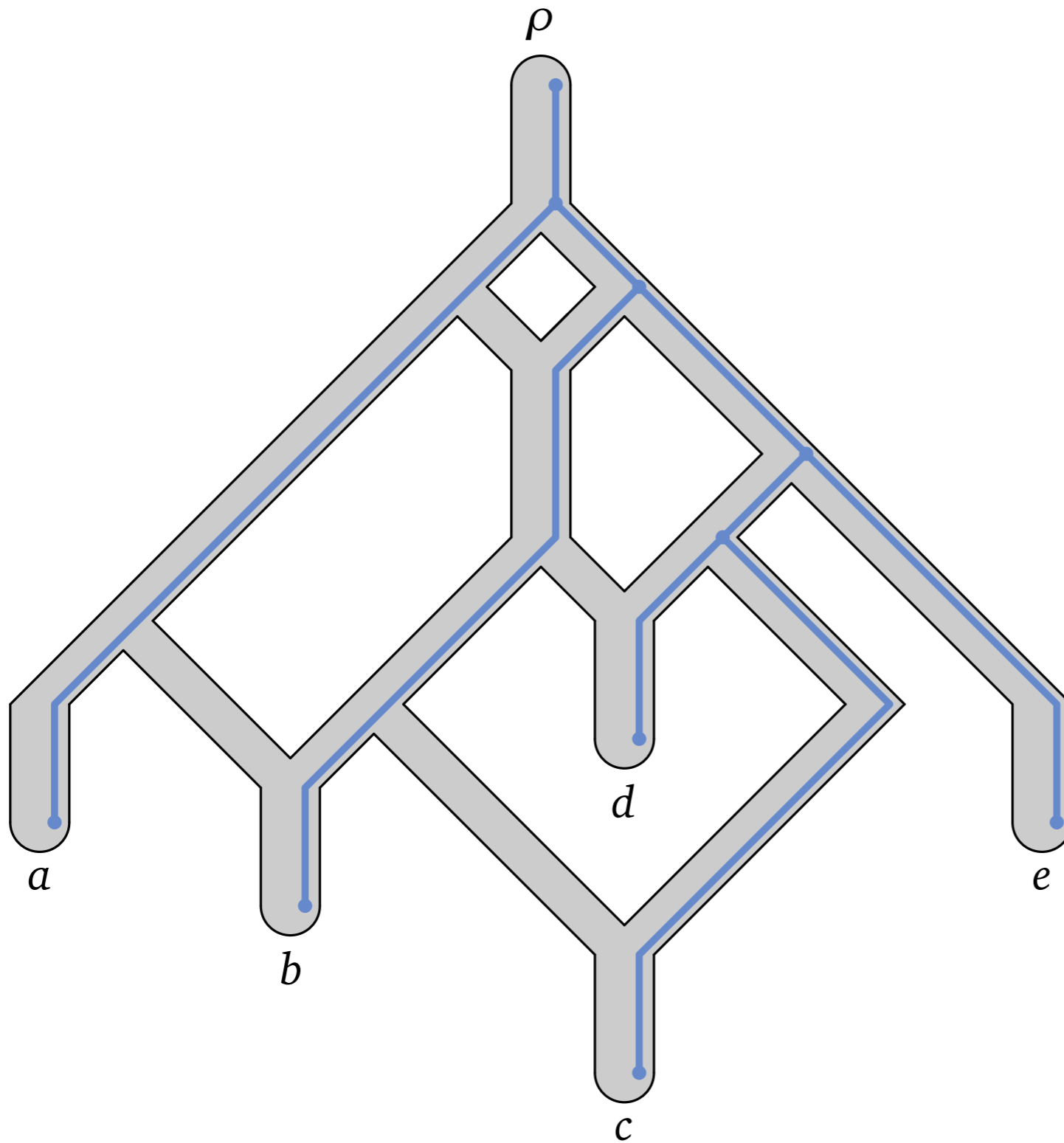
Tree-based Network Reconstruction



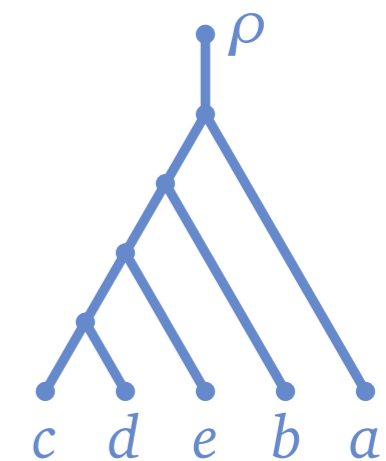
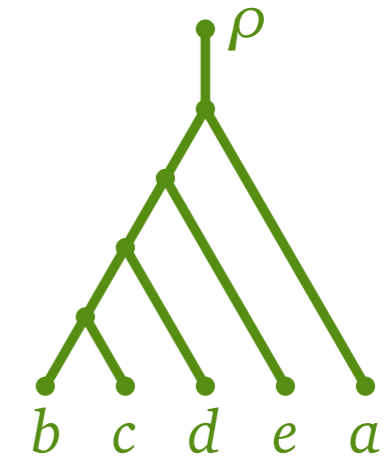
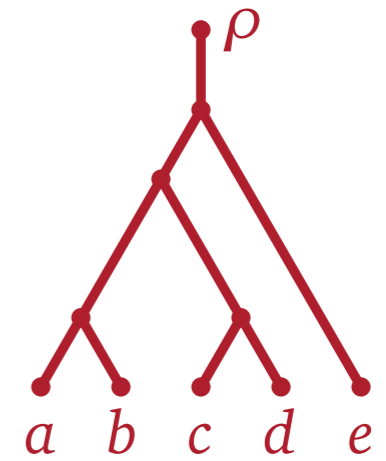
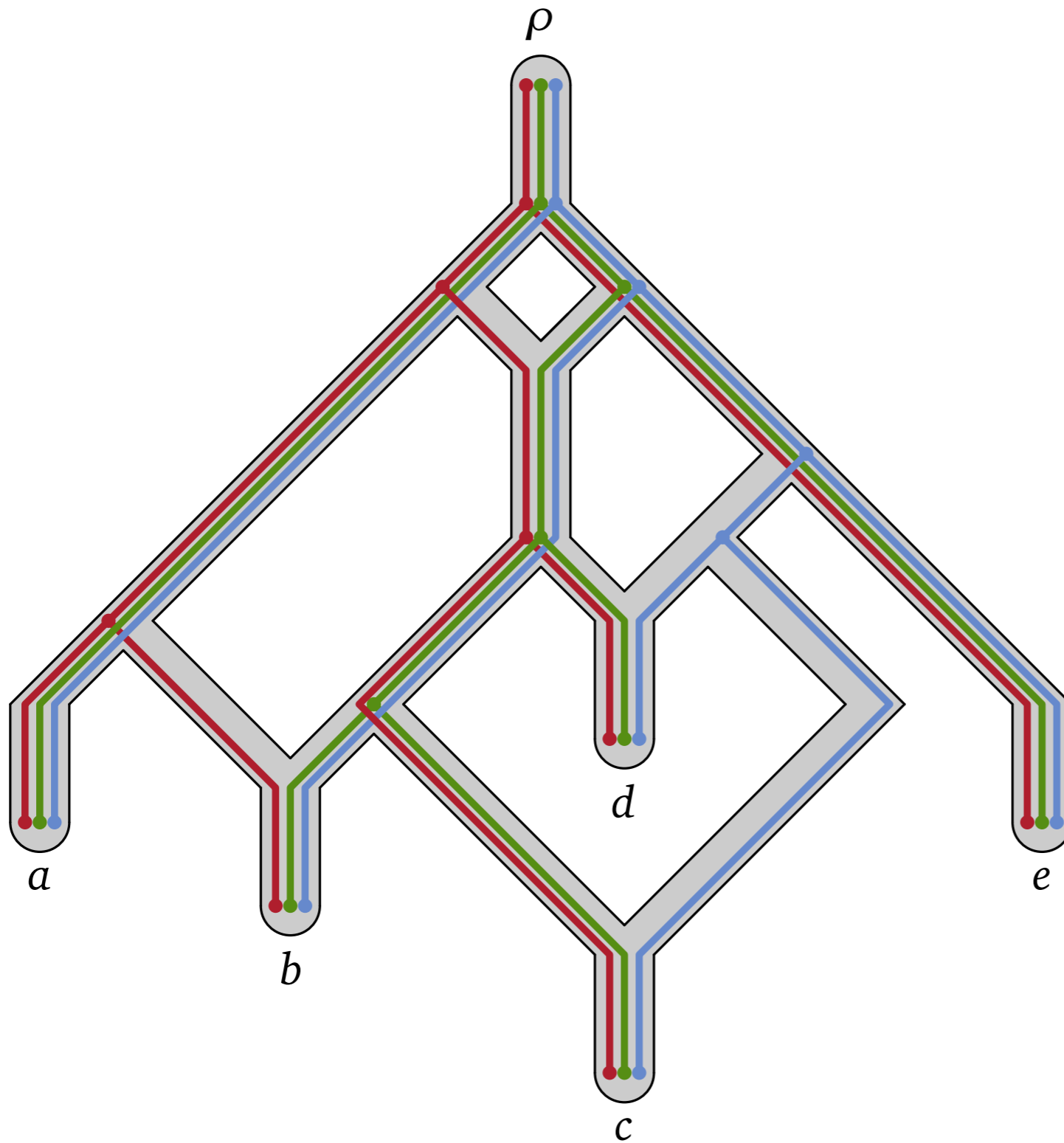
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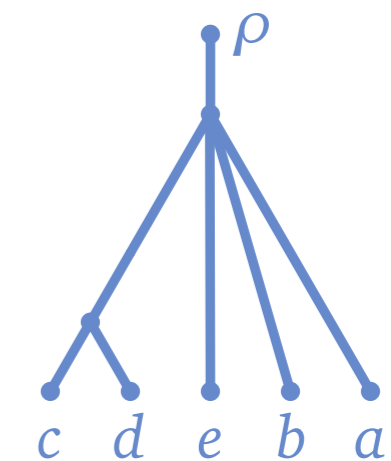
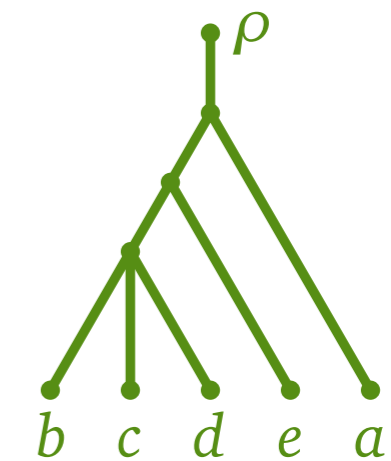
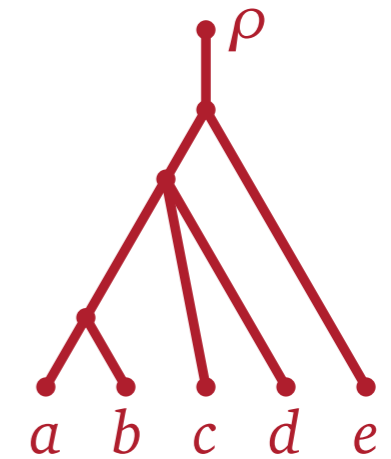
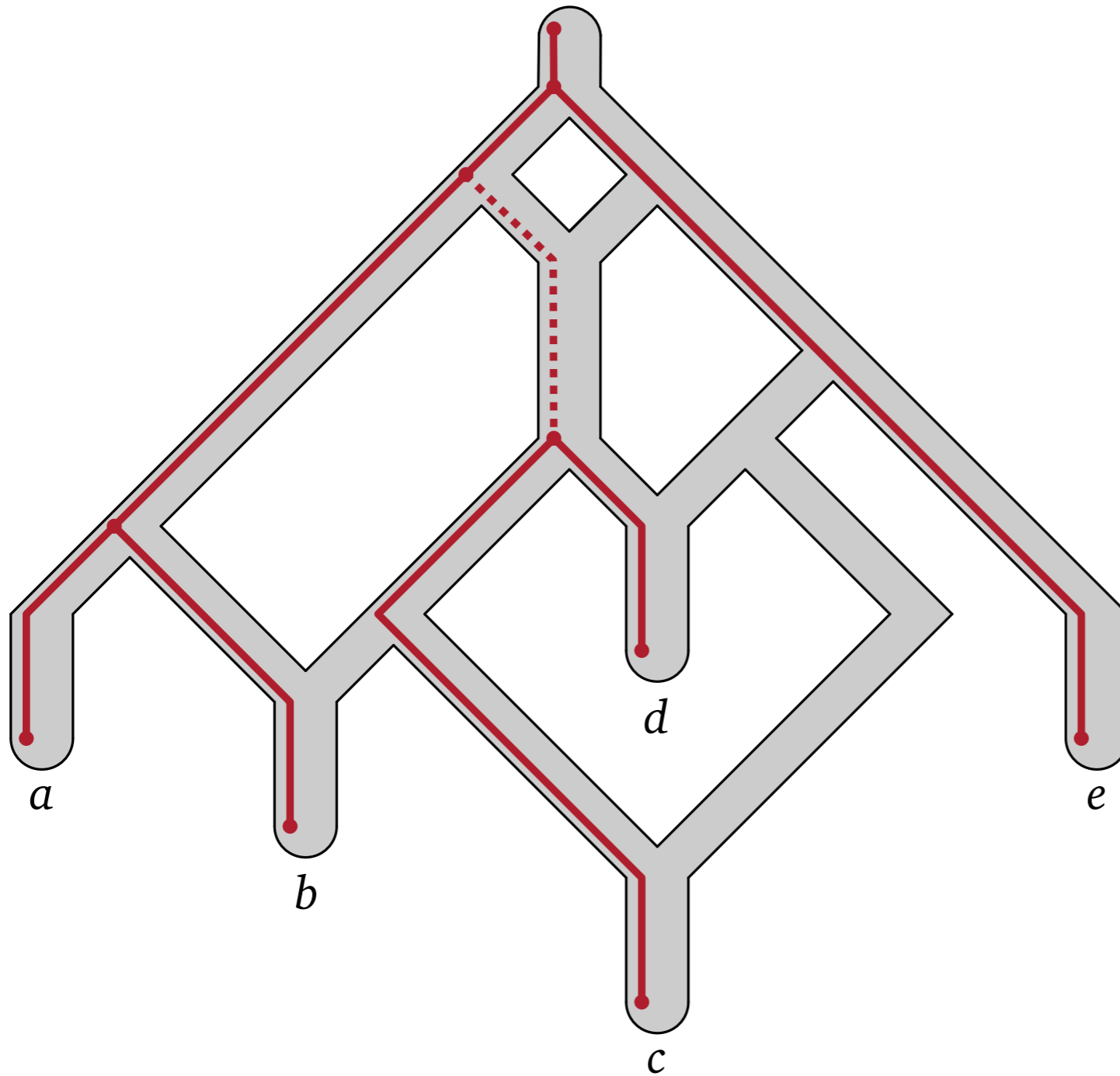


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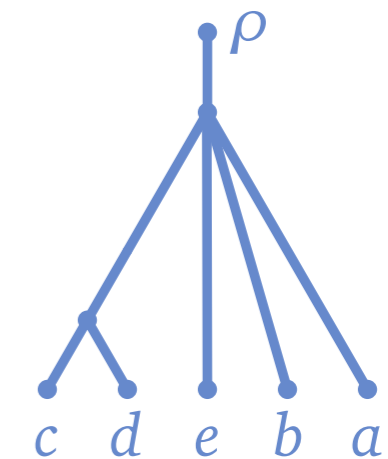
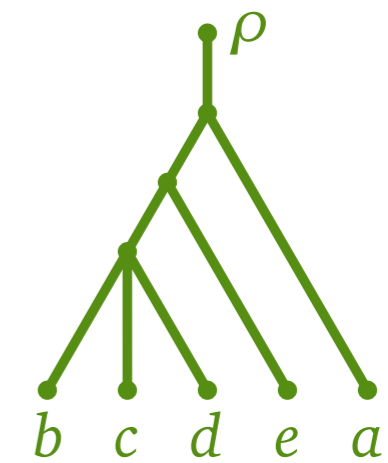
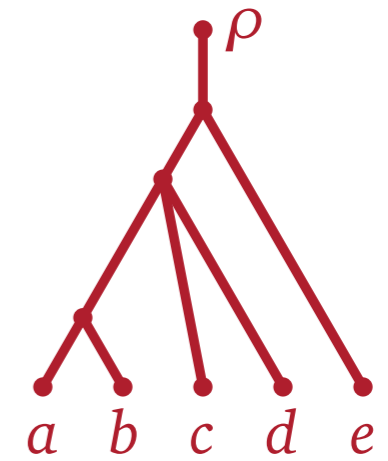
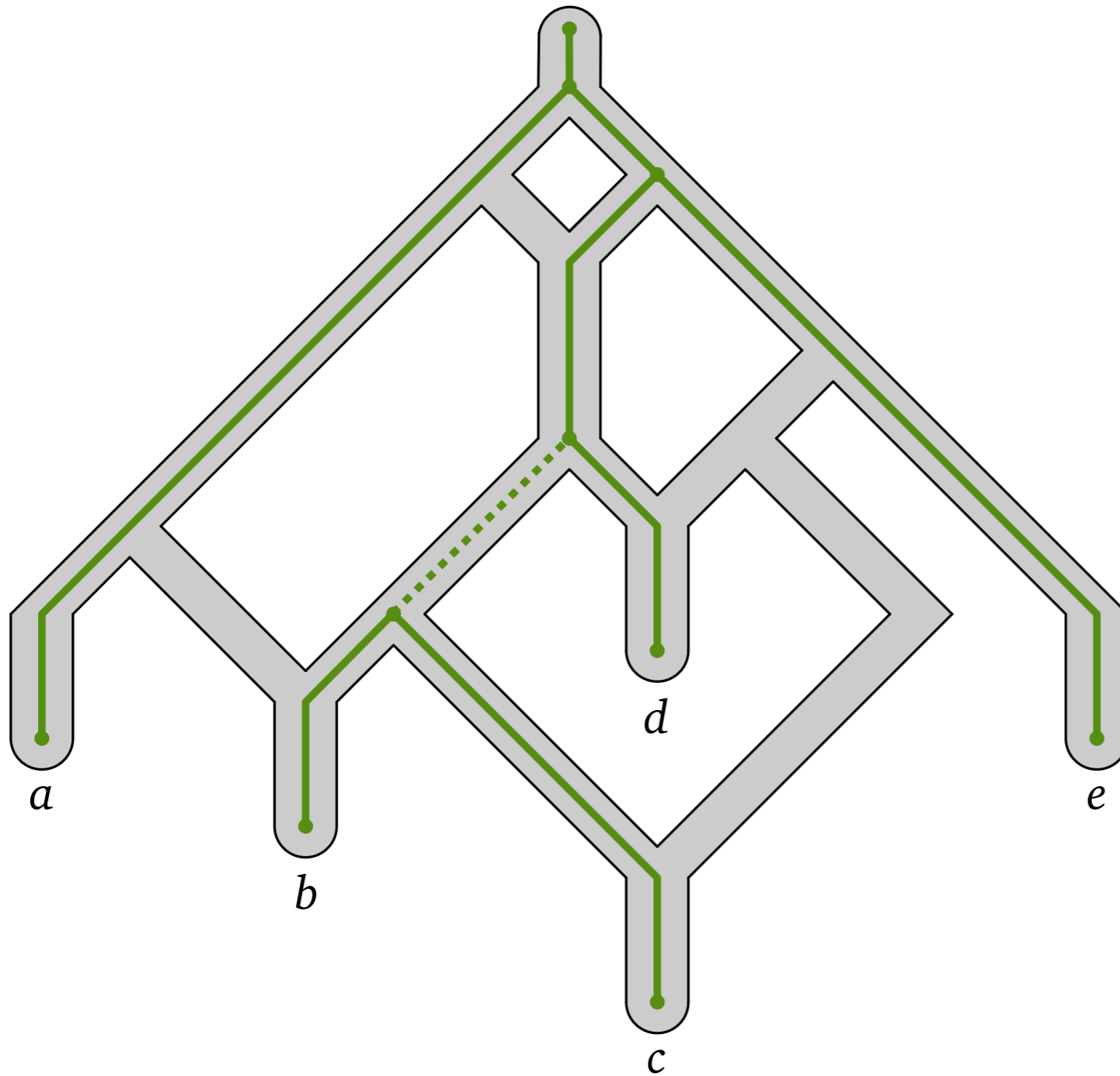
Nonbinary Trees

Definition. A phylogenetic tree T is *displayed* by a phylogenetic network N if T can be obtained from a subgraph of N by contracting edges.



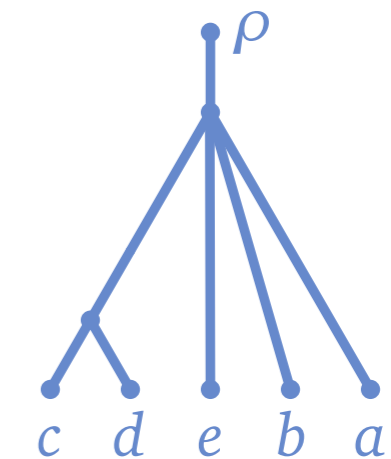
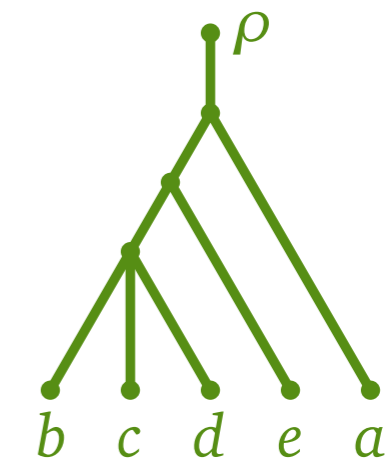
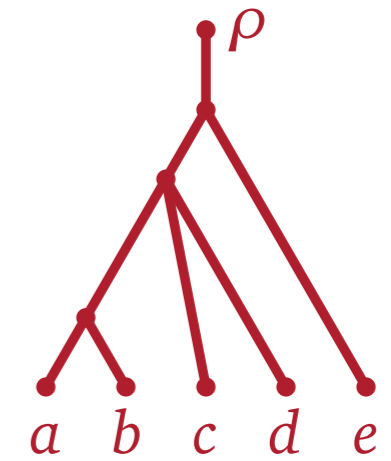
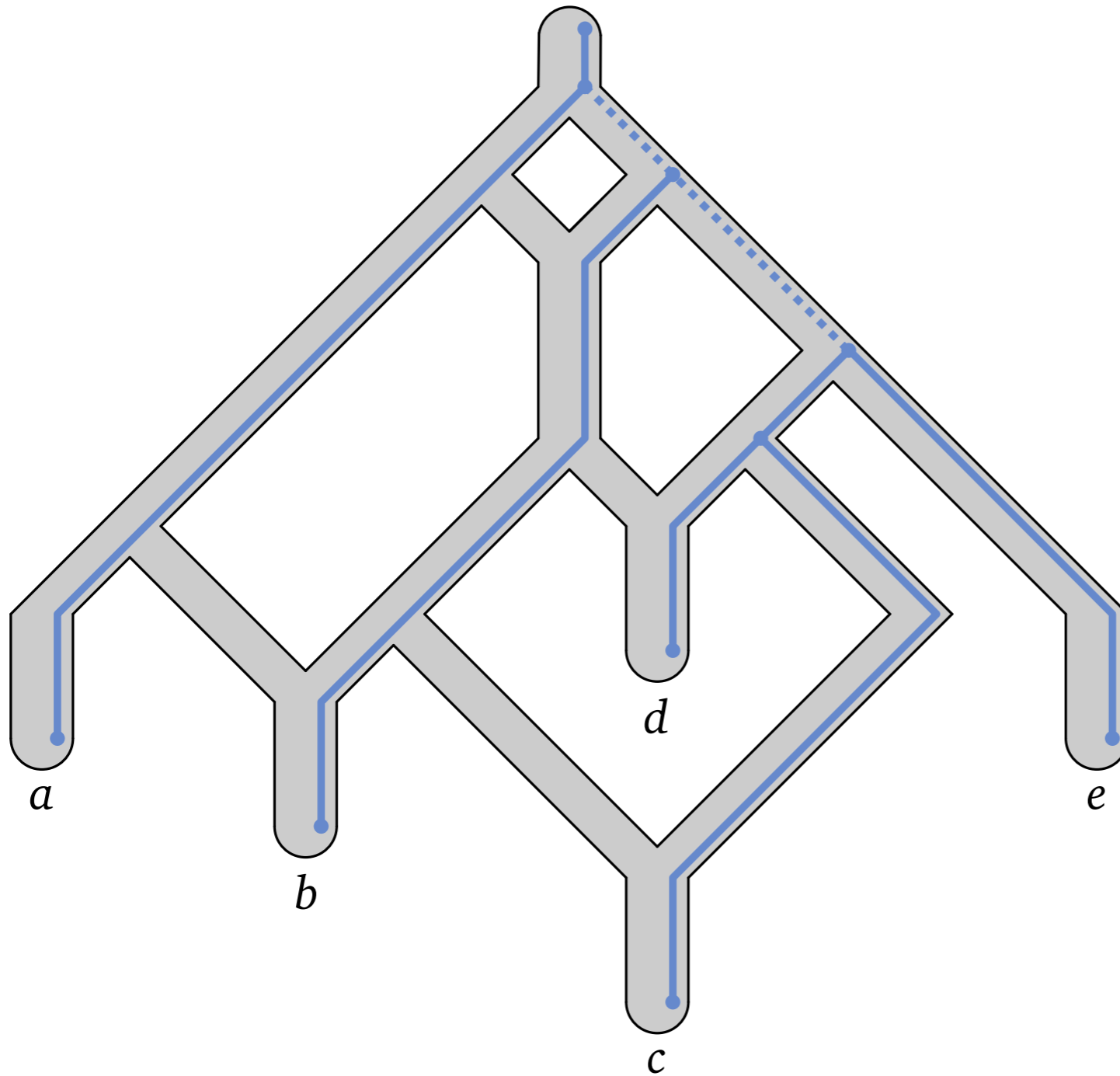
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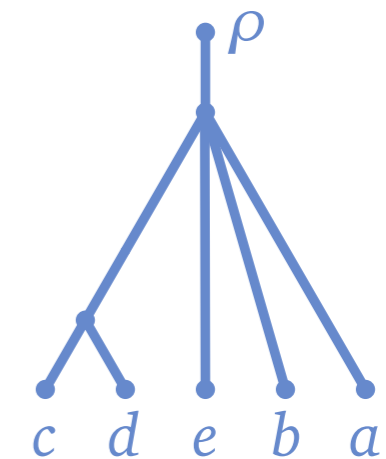
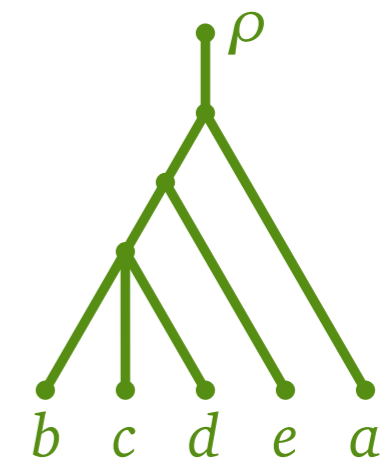
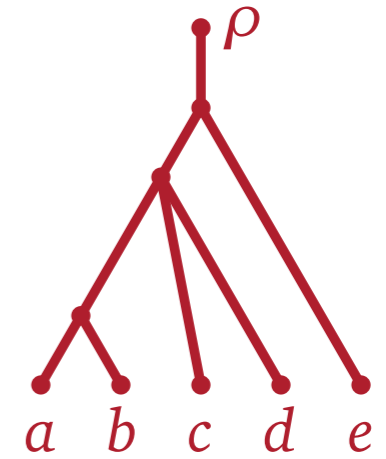
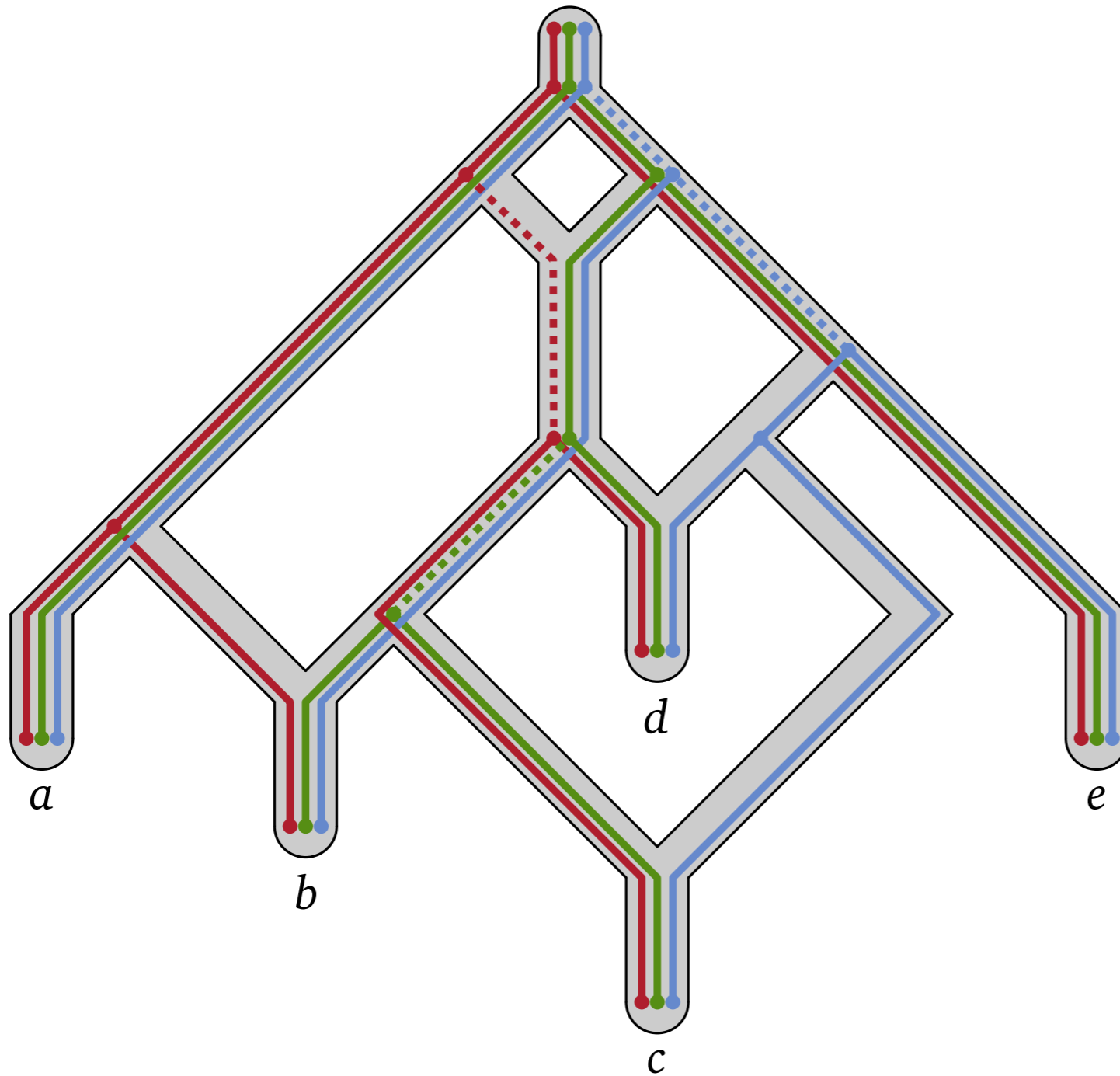
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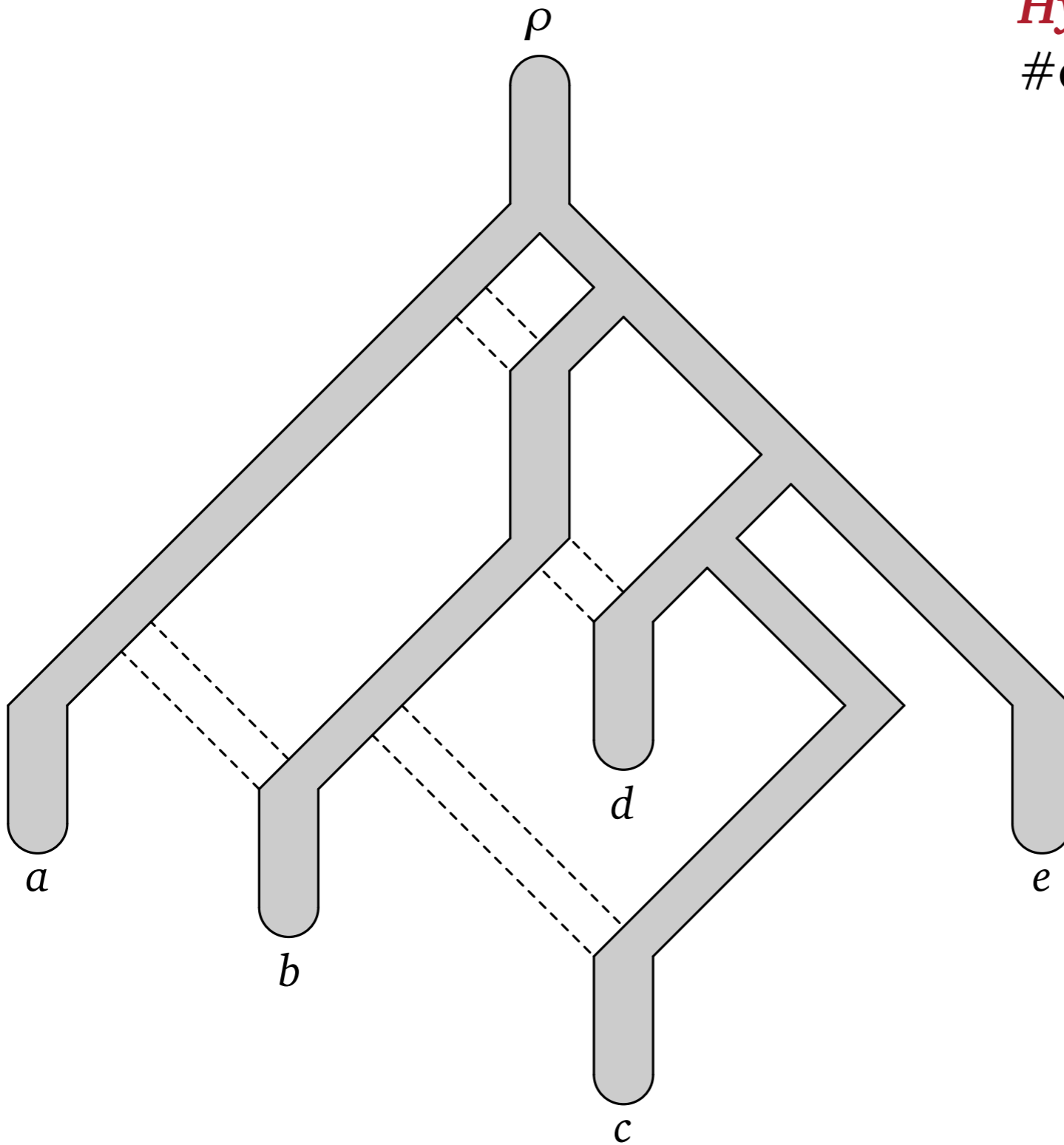
Nonbinary Trees

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Tree-based Network Reconstruction

Hybridization number:
#edges to cut to obtain a tree



Results

Problem: HYBRIDIZATION NUMBER

Given: Collection of phylogenetic trees \mathcal{T} , each on the same n leaves, $k \in \mathbb{N}$

Question: Does there exist a phylogenetic network that displays each tree in \mathcal{T} and has hybridization number at most k ?

Two binary trees:

- Direct relationship to *maximum acyclic agreement forest* (MAAF)
- $O((28k)^k + n^3)$ -time algorithm (Bordewich & Semple 2007)
- $O(3.18^k n)$ -time algorithm (Whidden, Beiko & Zeh, 2013)
- Same approximability as *directed feedback vertex set* (Kelk, vI, Lekic, Linz, Scornavacca, Stougie, 2012)

Any number of nonbinary trees: (vI, Kelk & Scornavacca, 2014)

- Kernel with $4k(5k)^t$ leaves, with t the number of trees
- Kernel with $20k^2(\Delta^+ - 1)$ leaves, with Δ^+ the maximum outdegree
- $n^{f(k)} t$ -time bounded-search algorithm, with f astronomical

Three binary trees:

- $c^k \text{poly}(n)$ time algorithm (vI, Lekic, Kelk, Whidden & Zeh, 2014)
-

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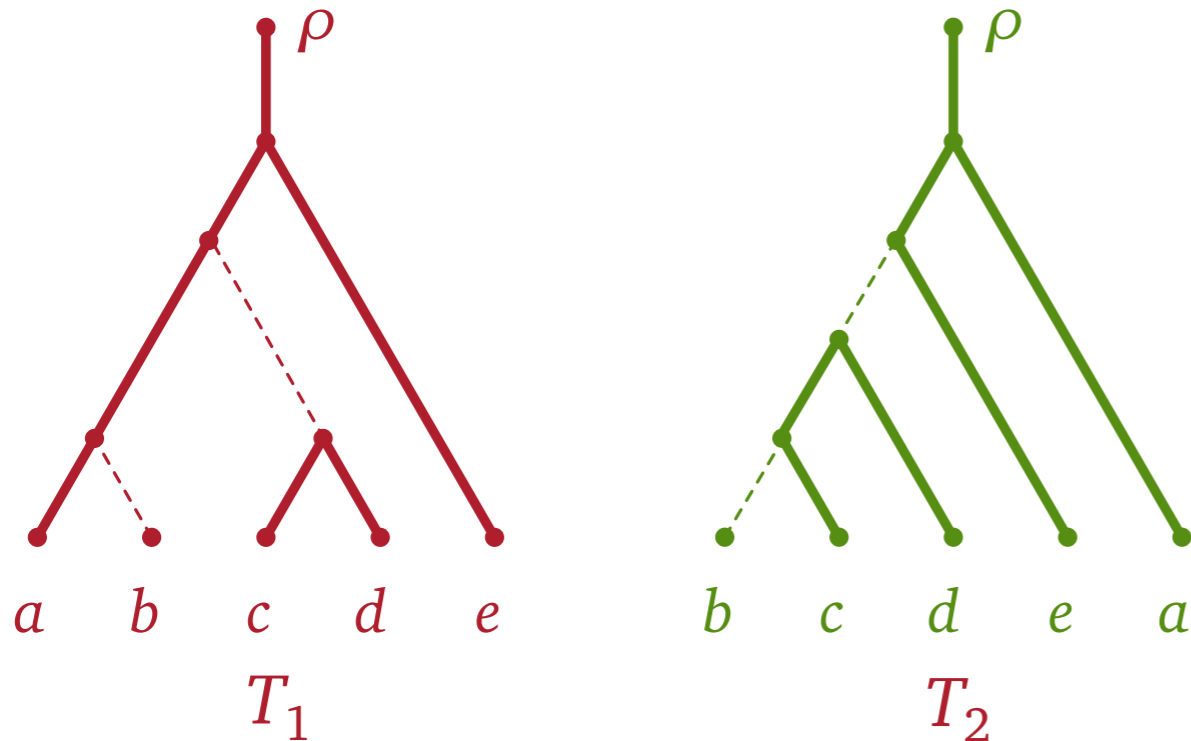
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($c = 1609891840$)
-

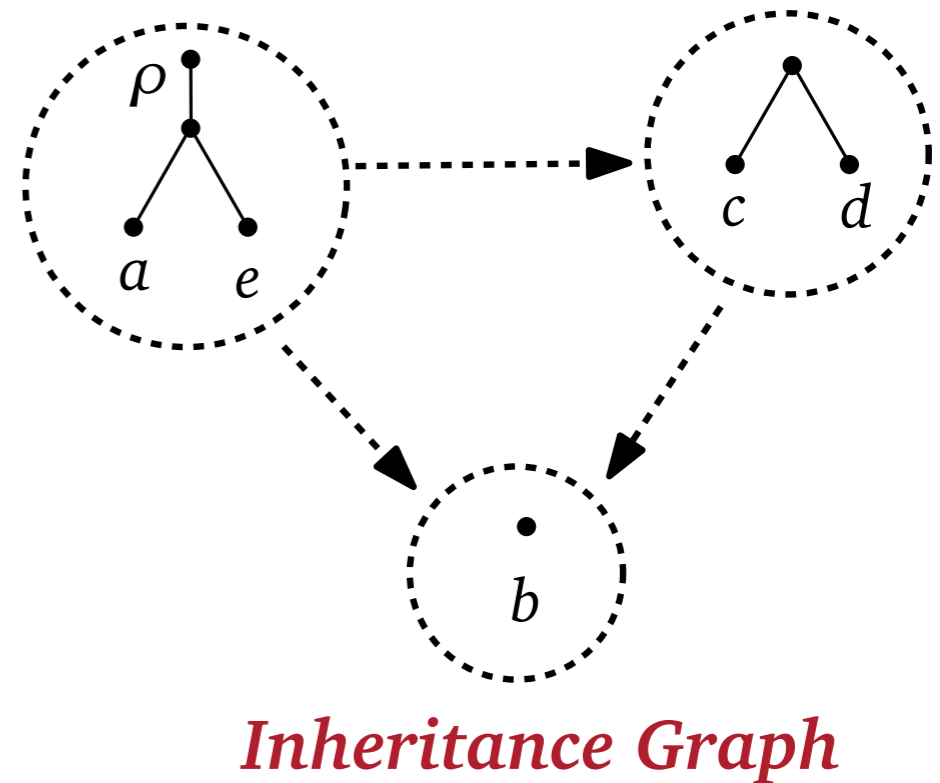
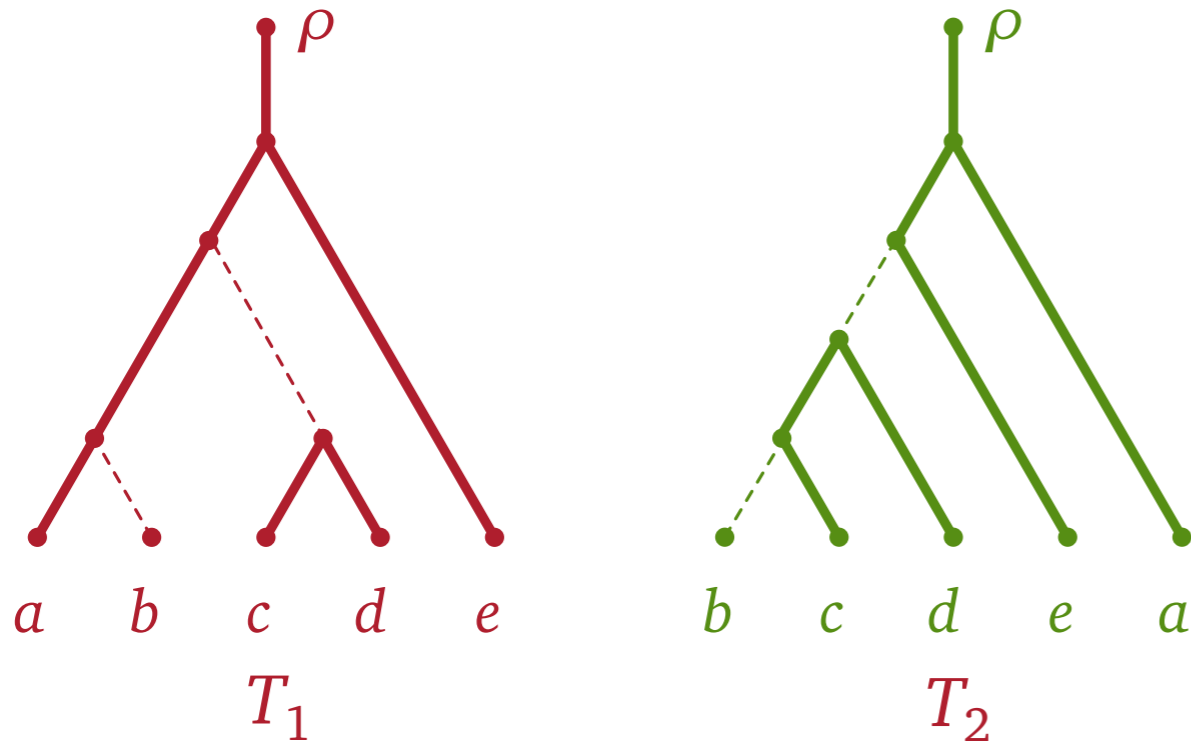
Agreement Forests

An *agreement forest* of two binary trees is a forest that can be obtained from either tree by deleting edges and unlabelled vertices and suppressing indegree-1 outdegree-1 vertices



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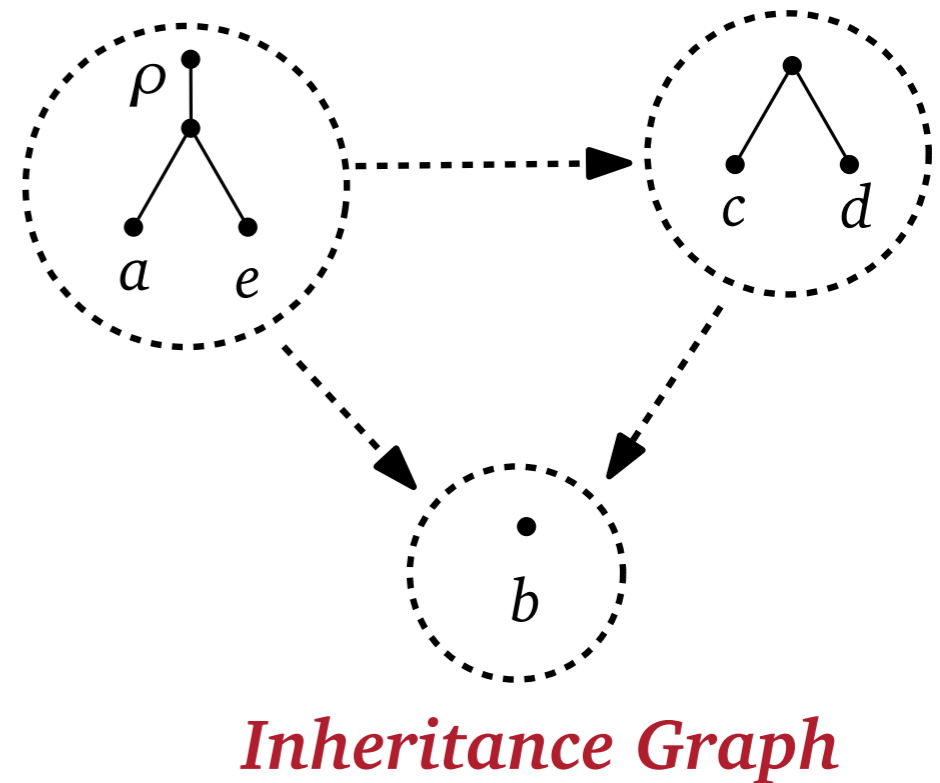
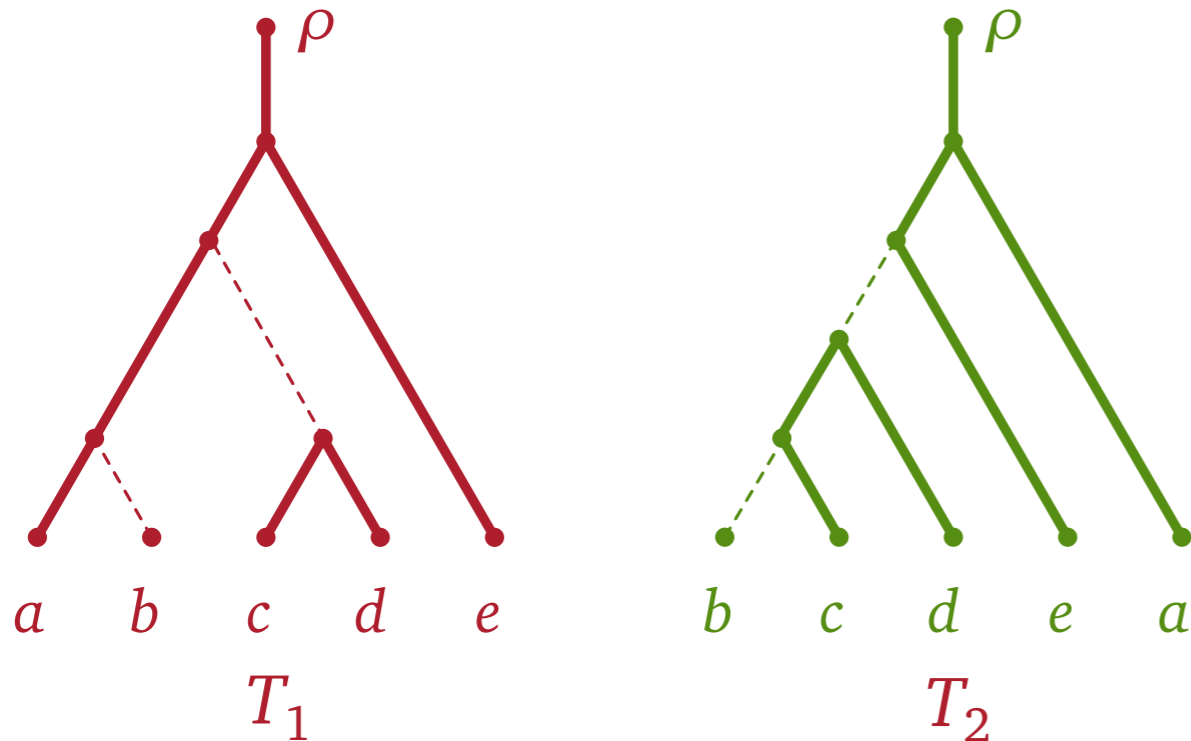


An agreement forest is *acyclic* if its inheritance graph is acyclic

An acyclic agreement forest with a minimum number of components is called a *Maximum Acyclic Agreement Forest (MAAF)*

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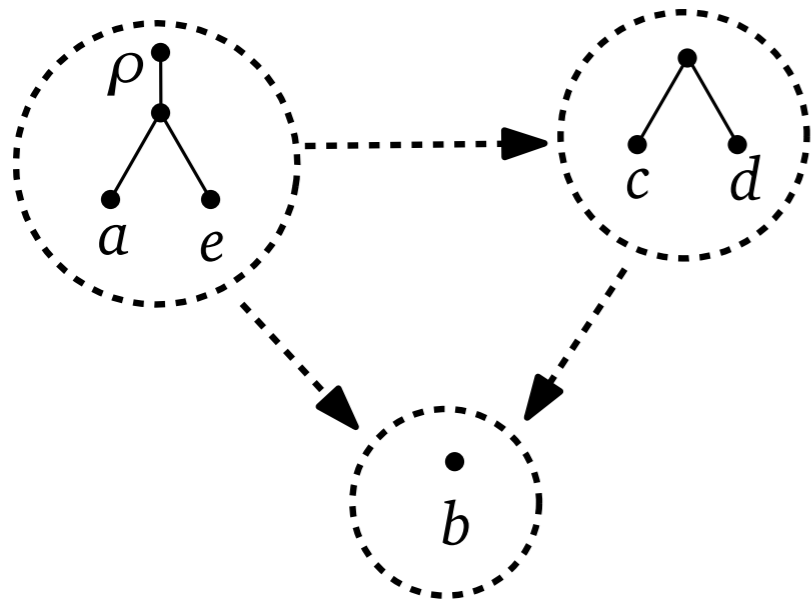
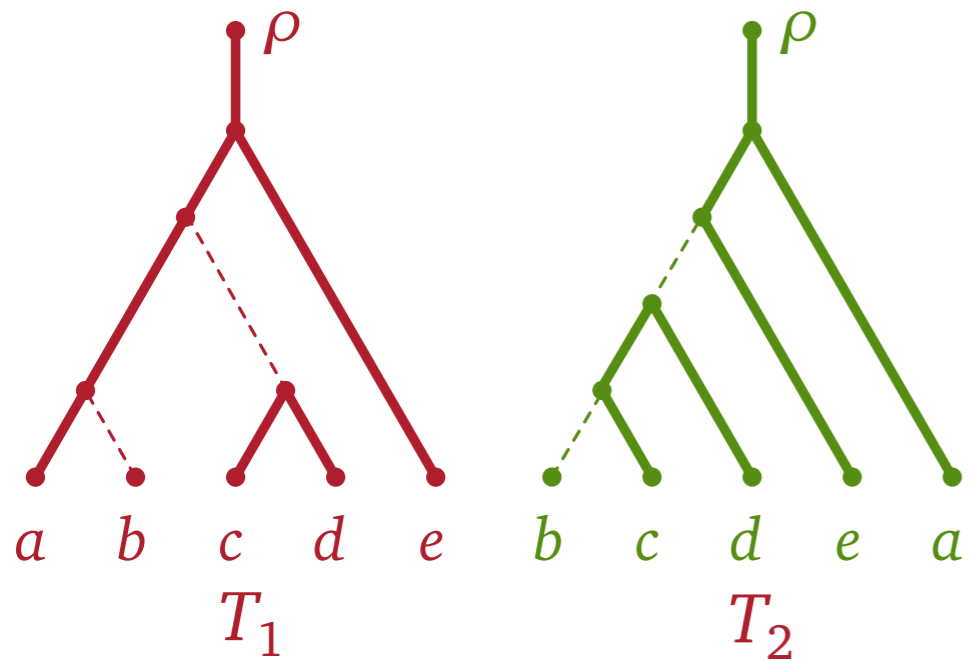
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For **two binary trees**: HYBRIDIZATION NUMBER = $|MAAF| - 1$

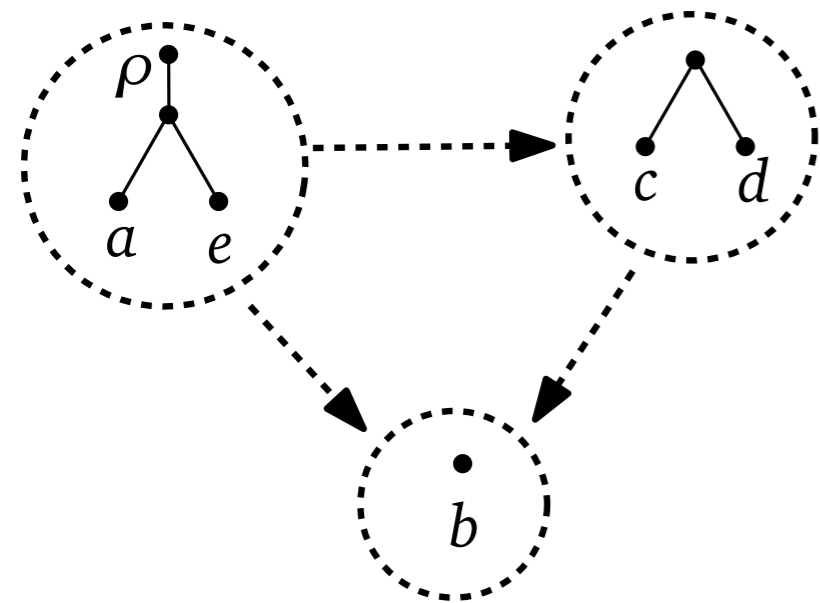
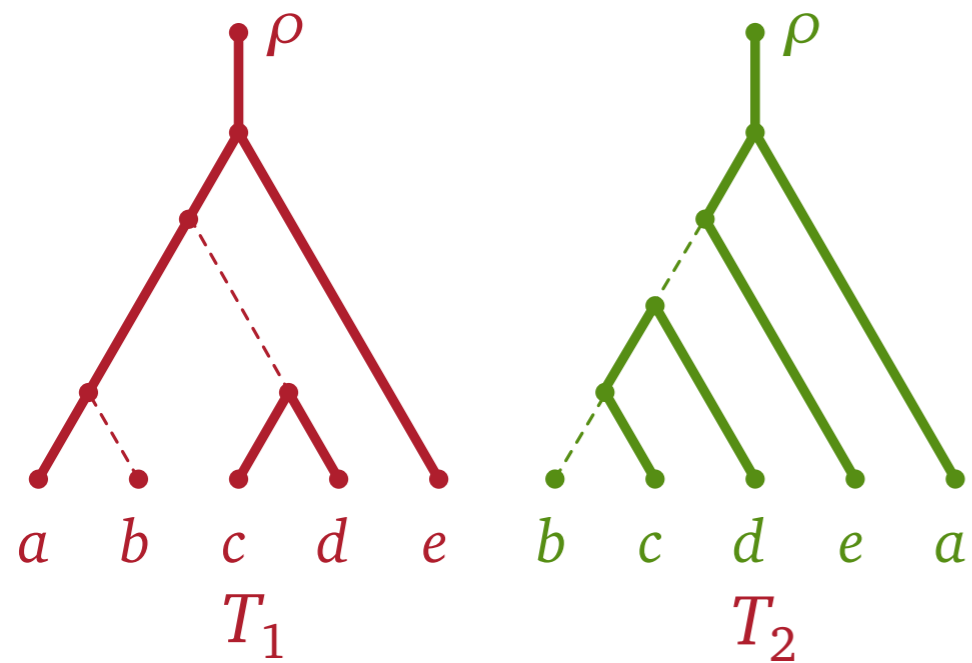
(Bordewich & Semple 2007)

Agreement Forests vs Hybridization Networks

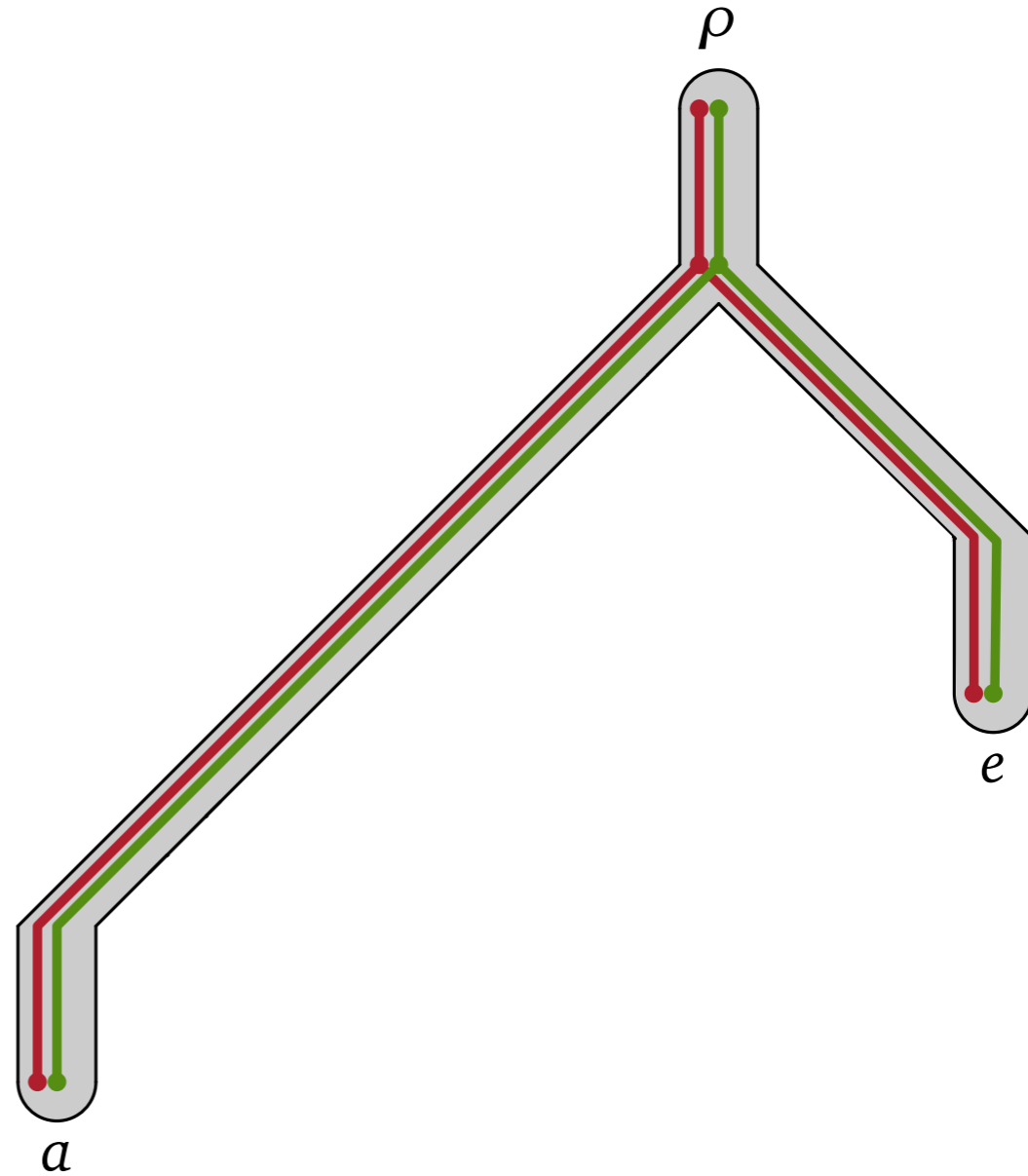


Inheritance Graph

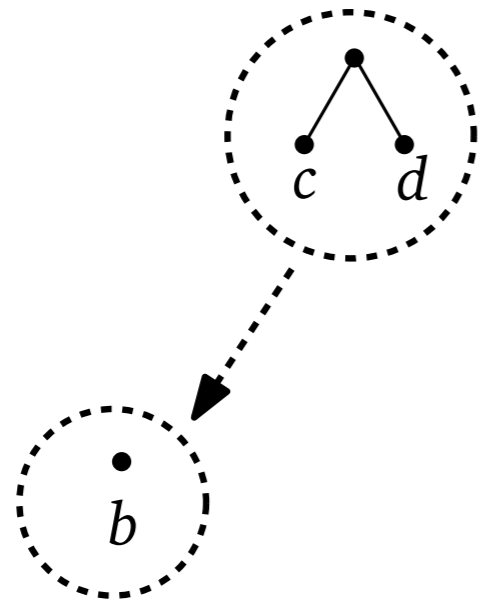
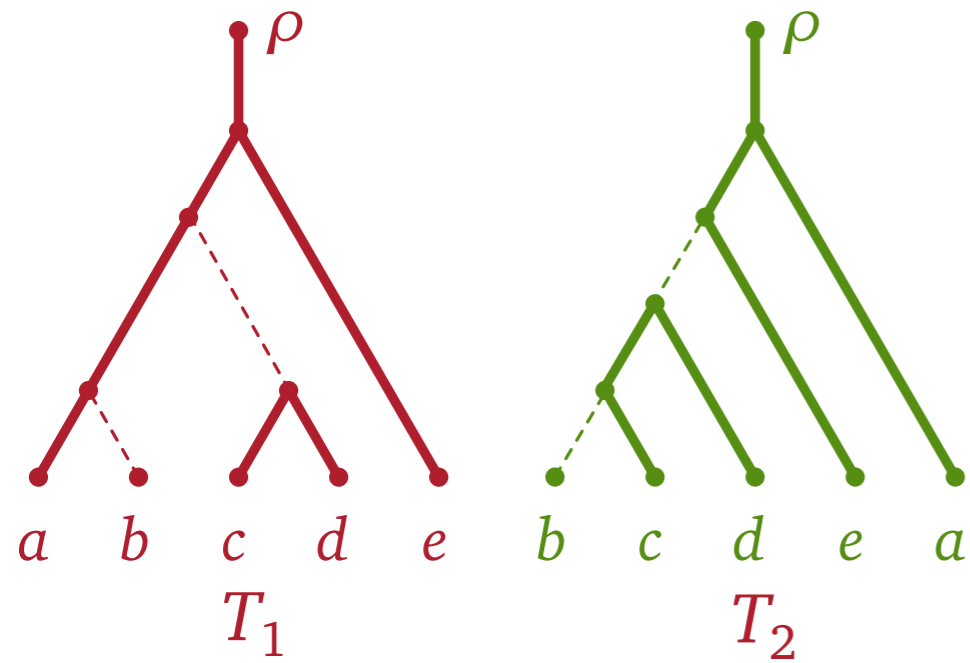
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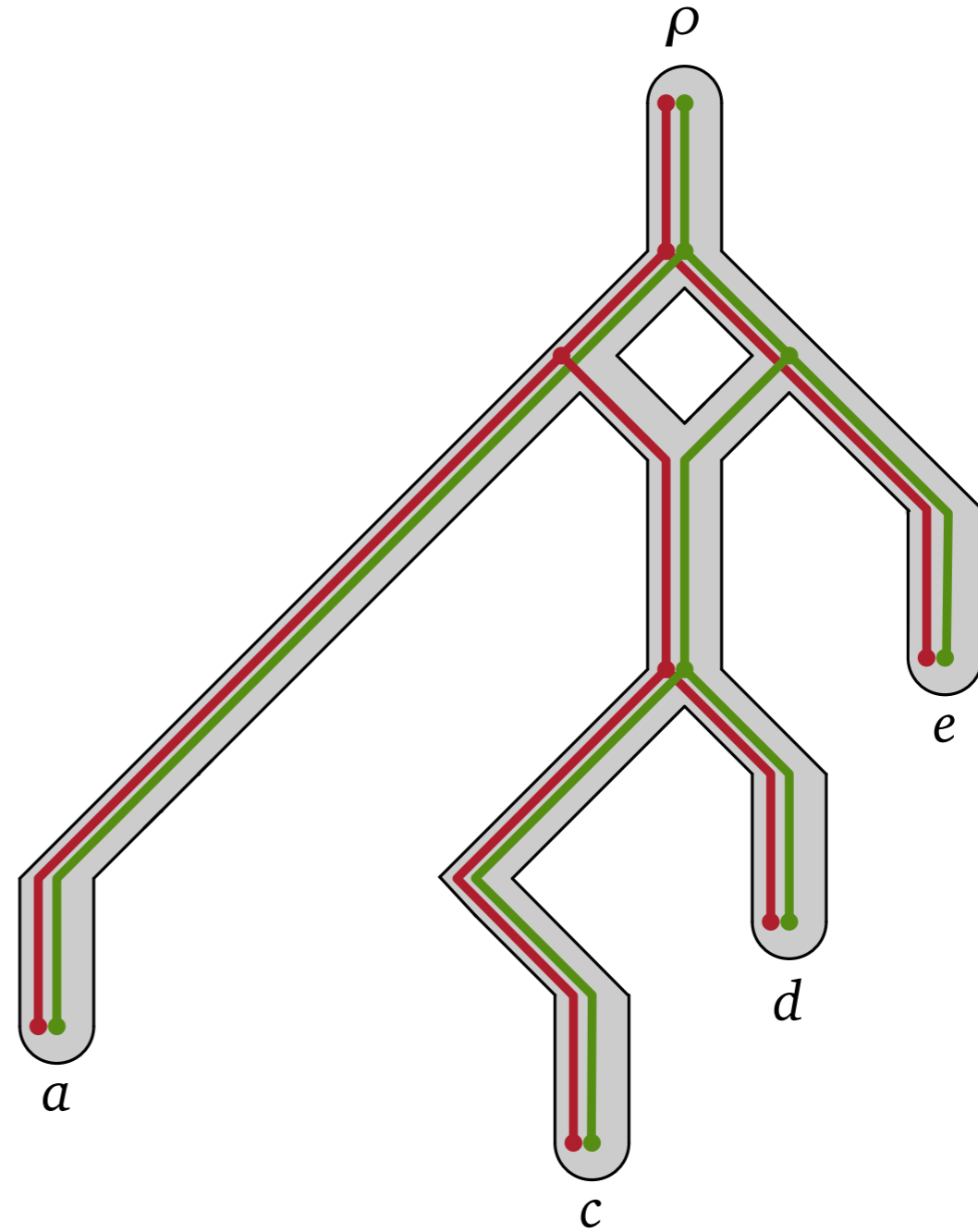
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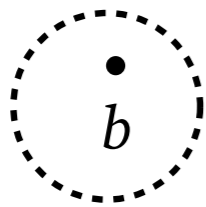
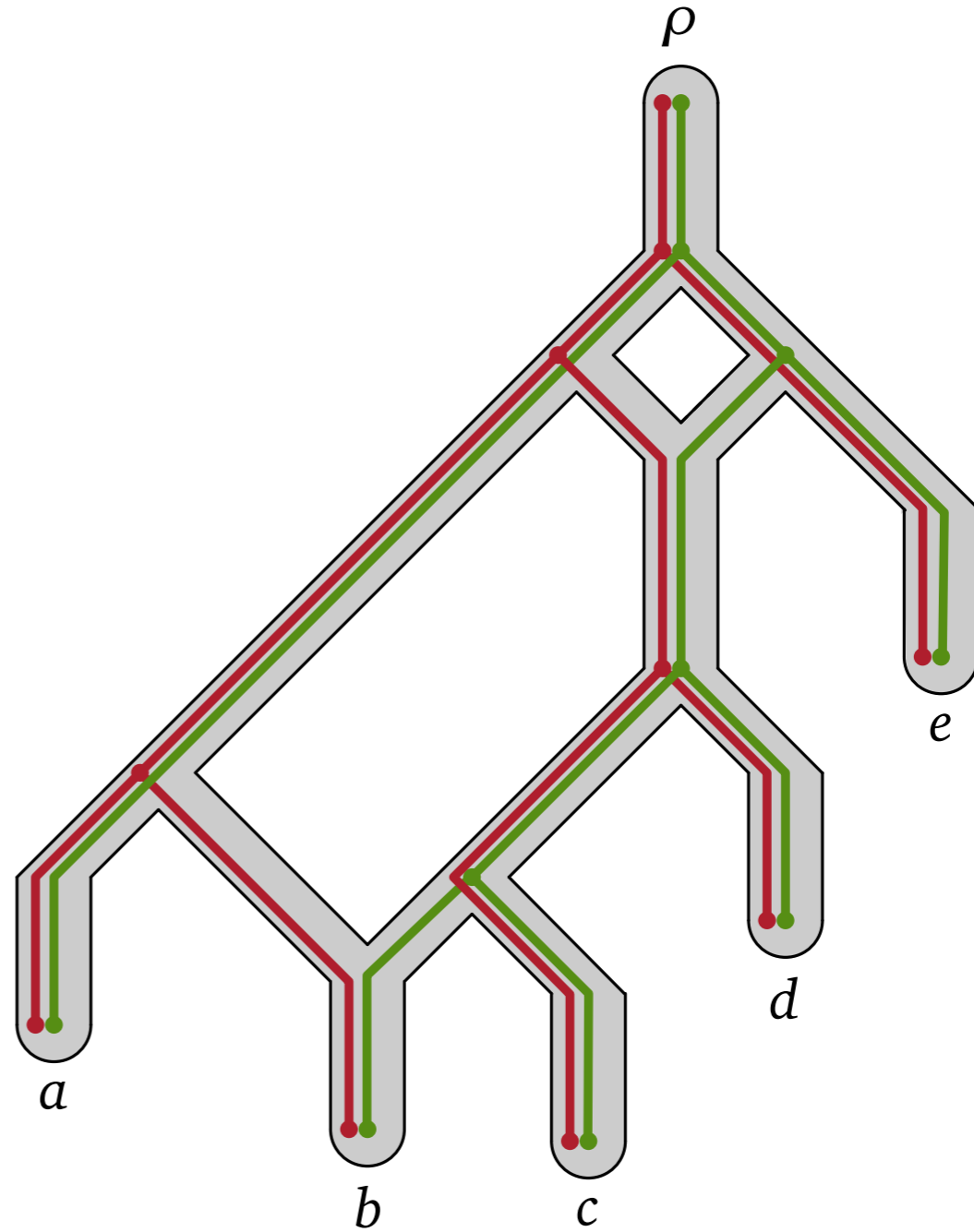
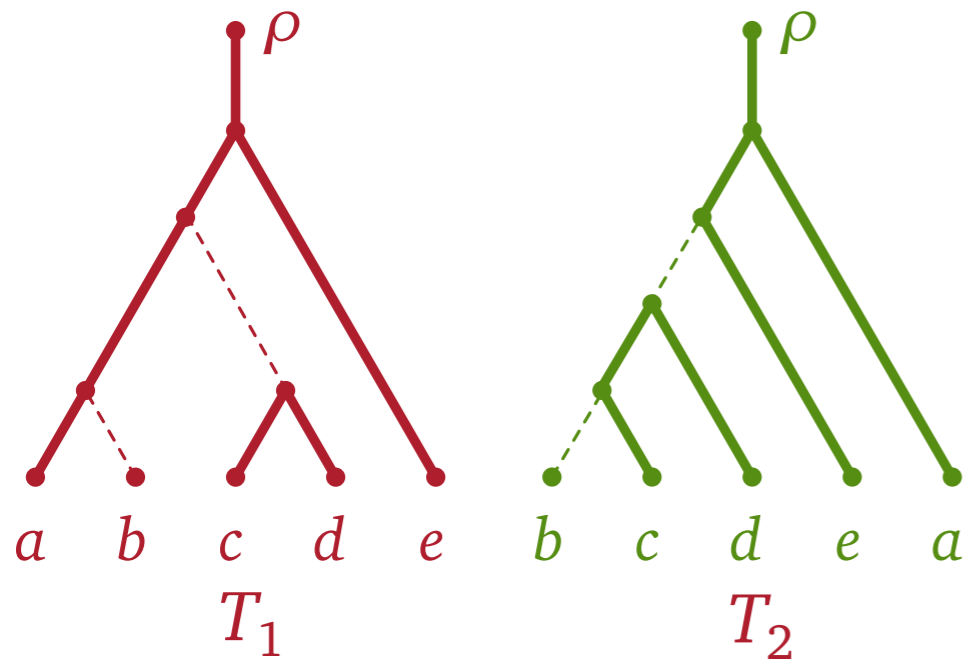
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Inheritance Graph

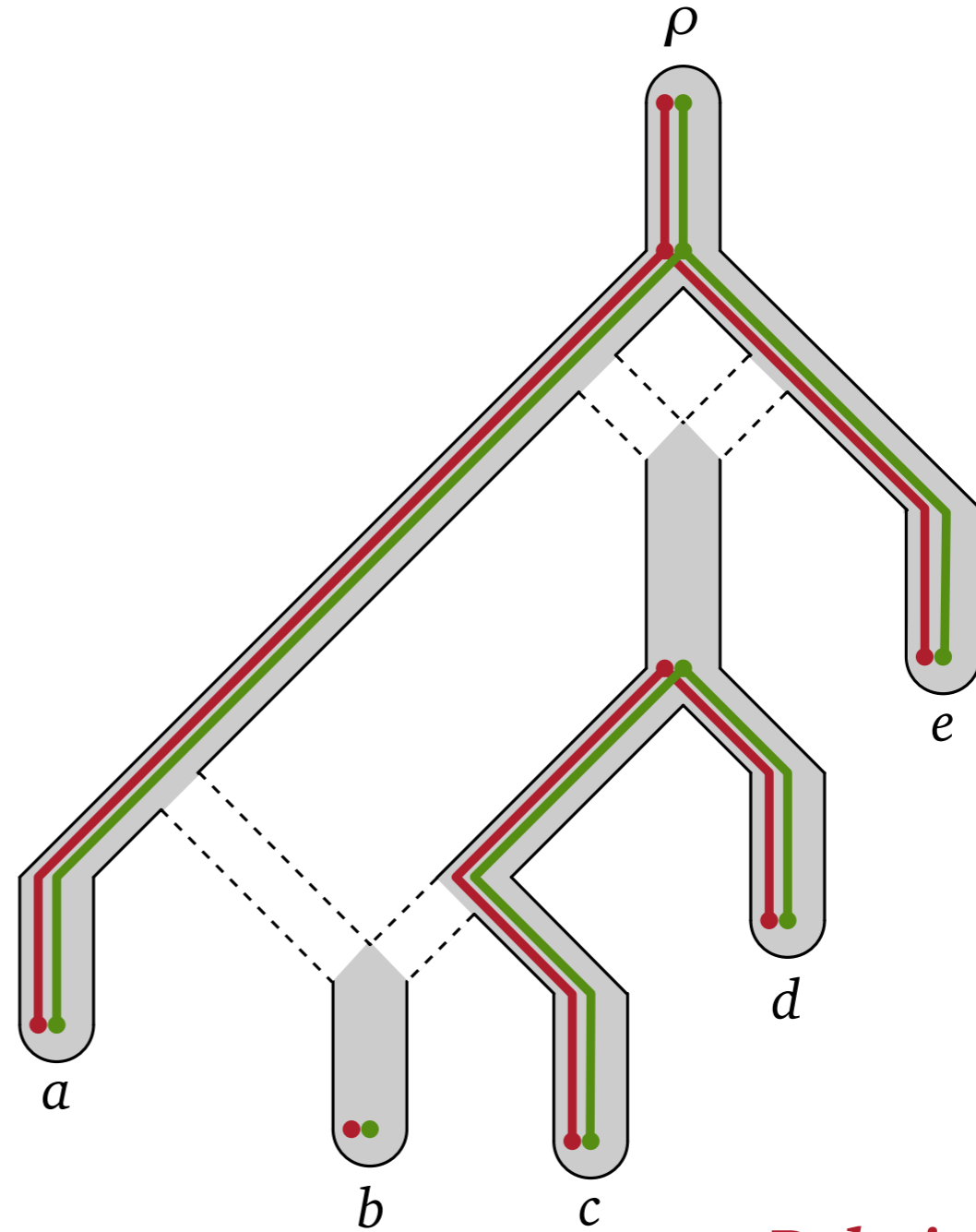
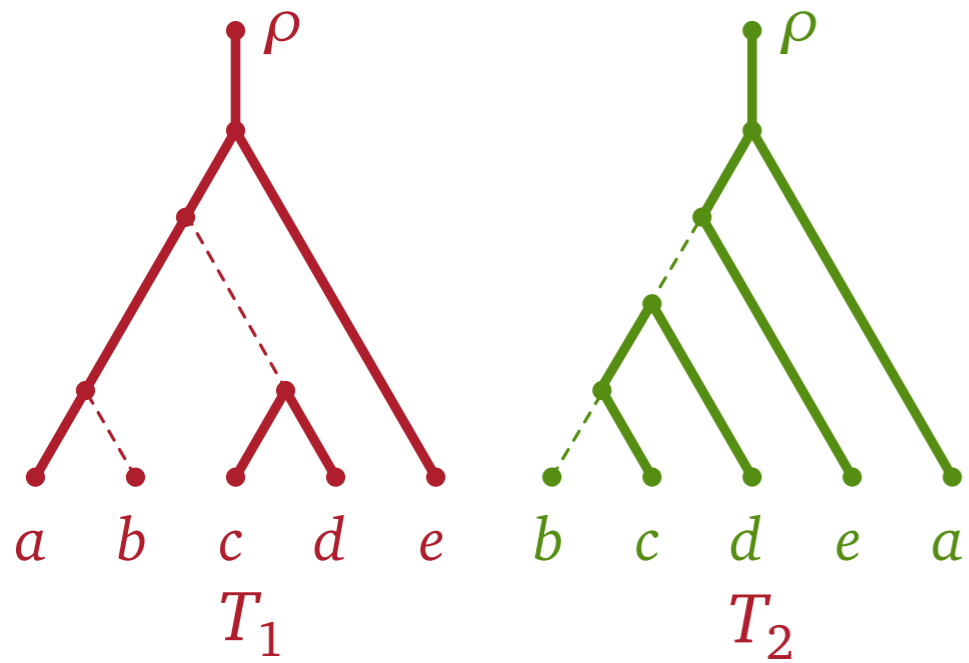


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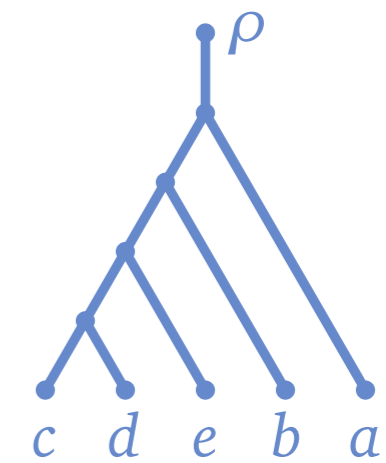
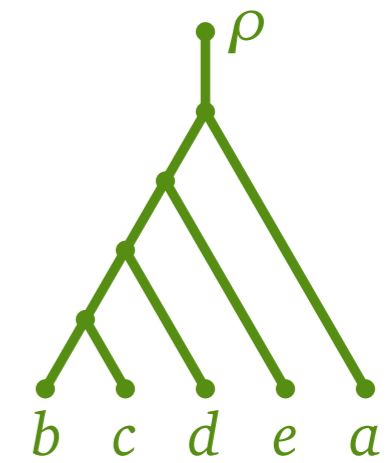
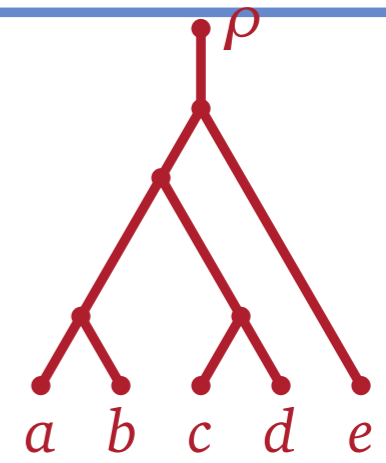
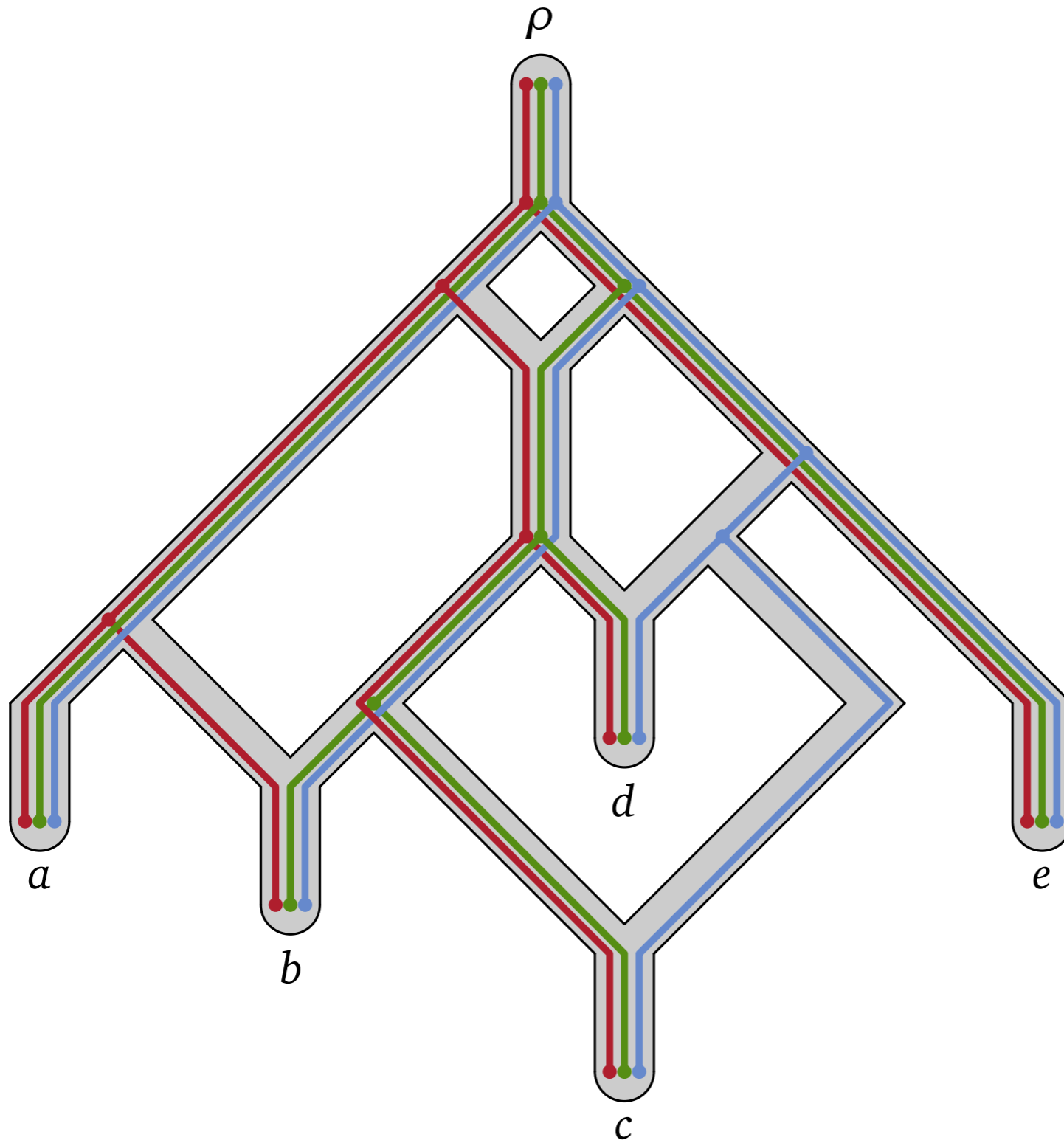
Inheritance Graph

Agreement Forests vs Hybridization Networks



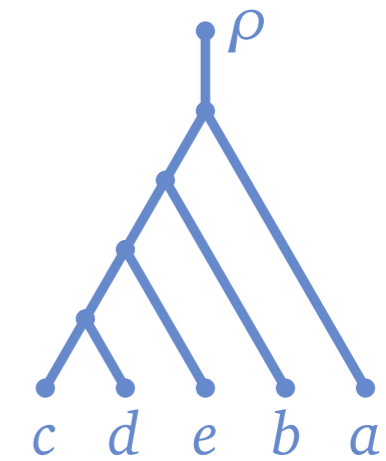
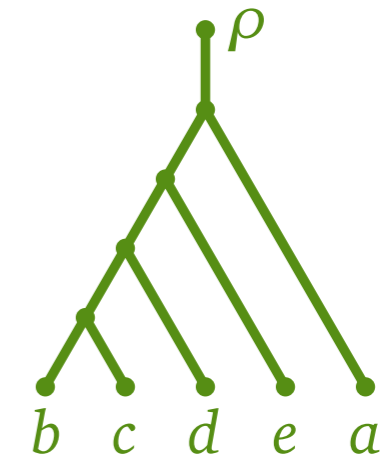
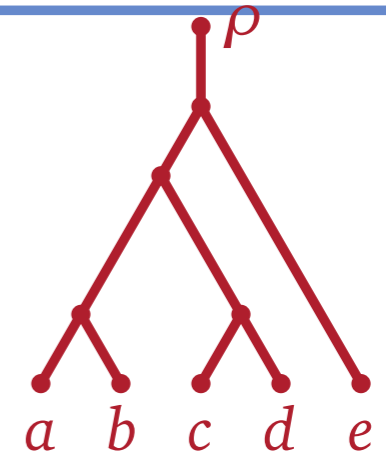
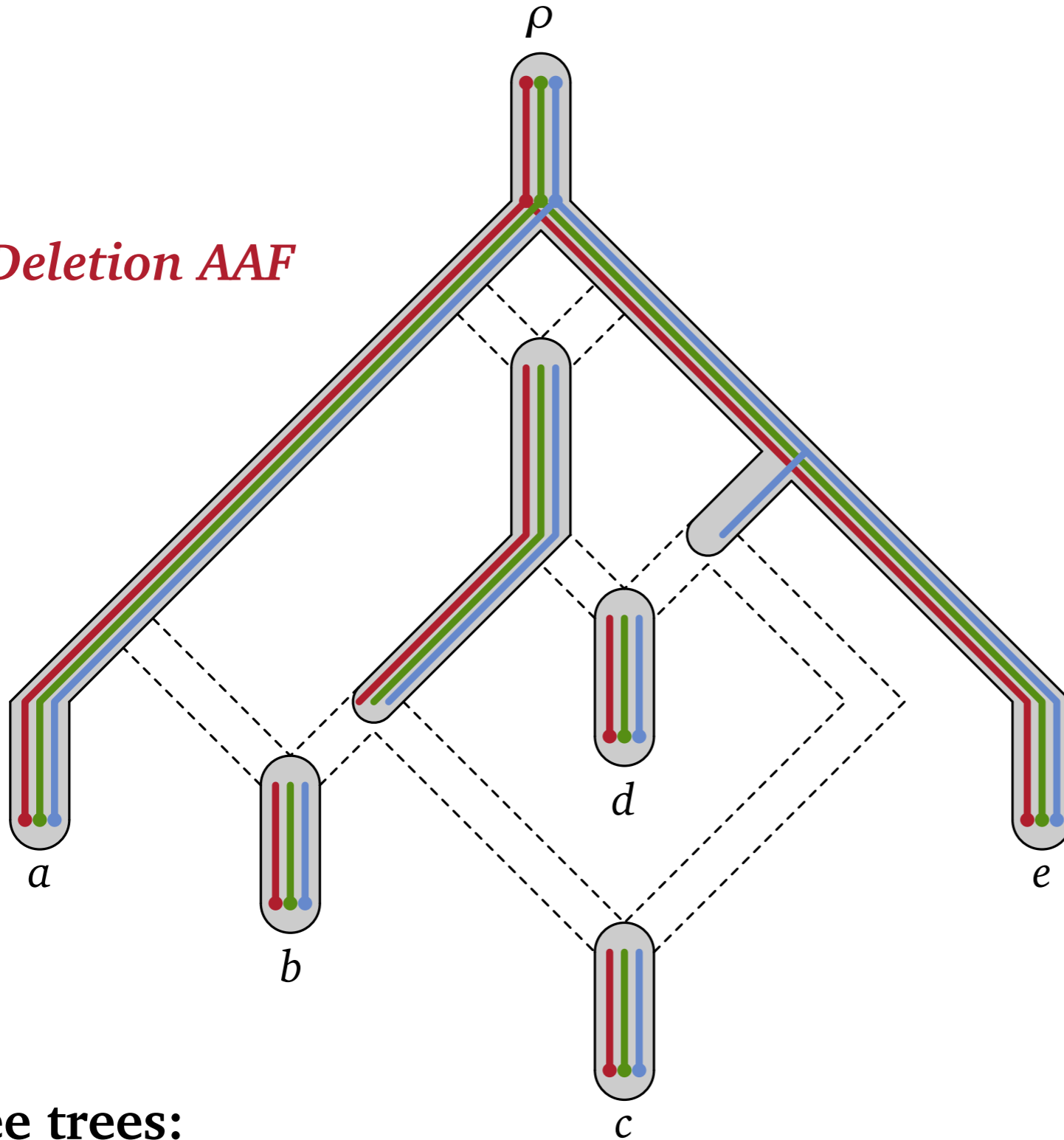
Deletion AAF

Hybridization Number on three trees in $c^k \text{poly}(n)$ time



Hybridization Number on three trees in $c^k \text{poly}(n)$ time

Deletion AAF

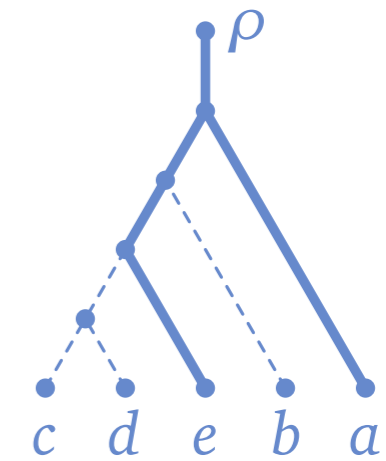
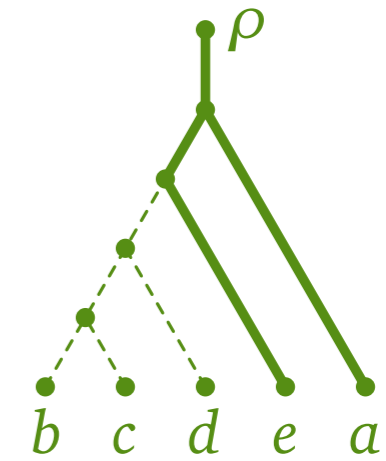
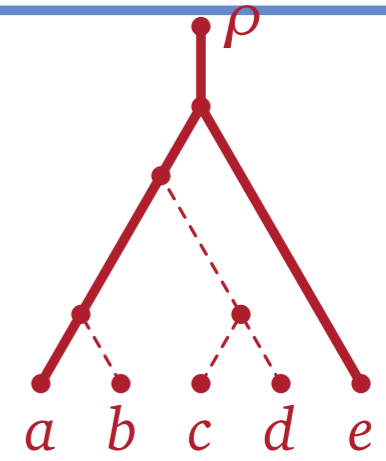
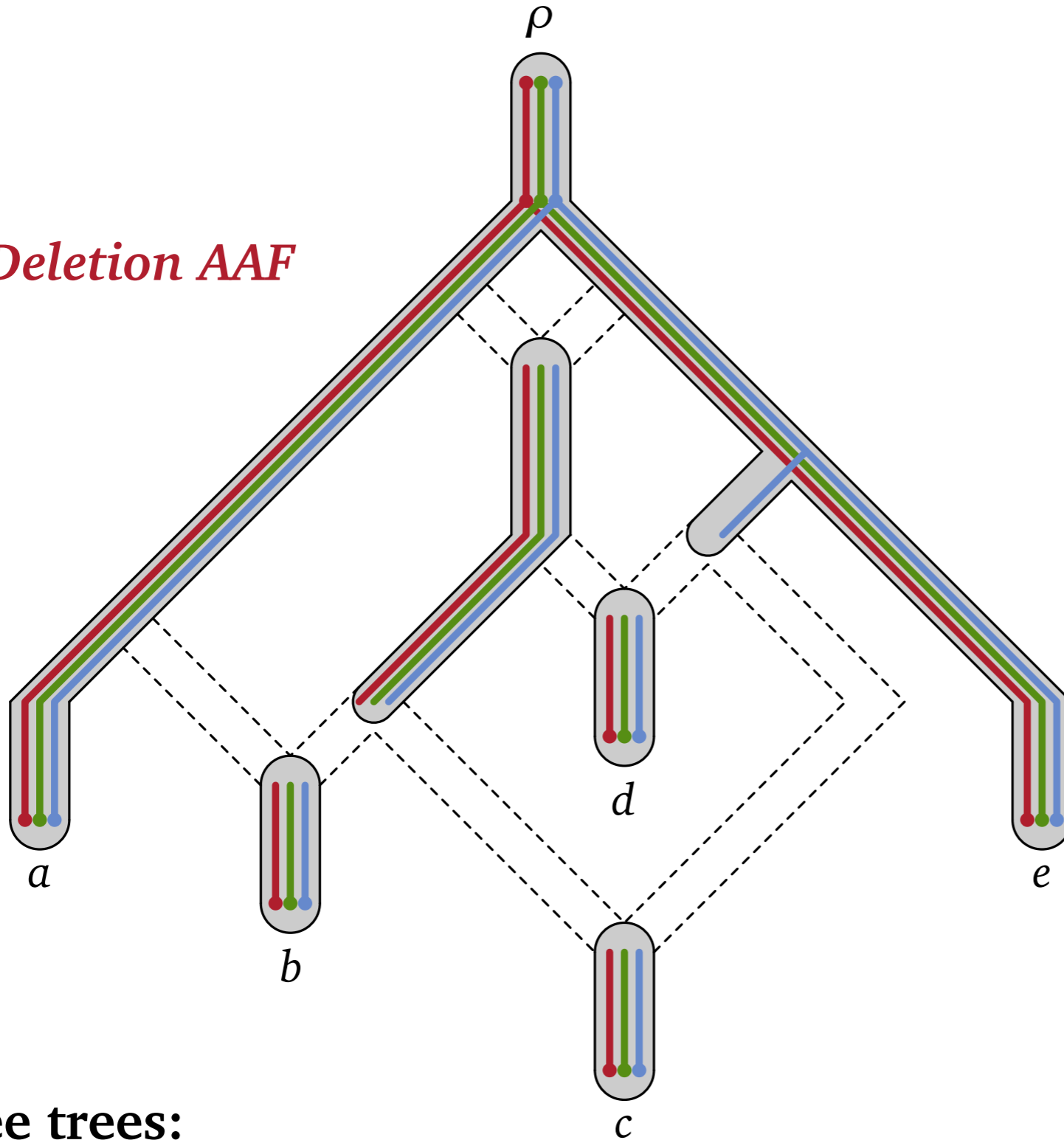


Three trees:

$$\text{HYBRIDIZATION NUMBER} \geq |\text{MAAF}| - 1$$

Hybridization Number on three trees in $c^k \text{poly}(n)$ time

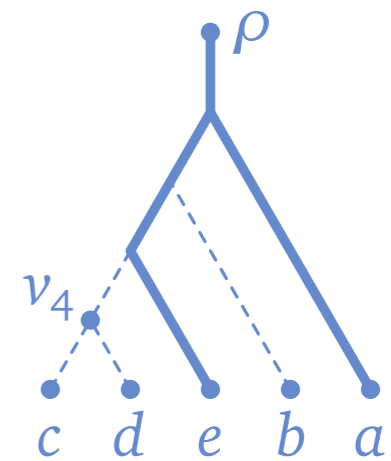
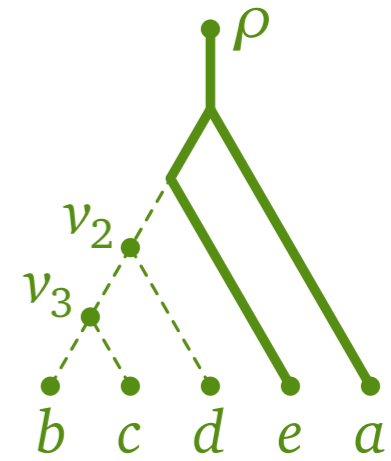
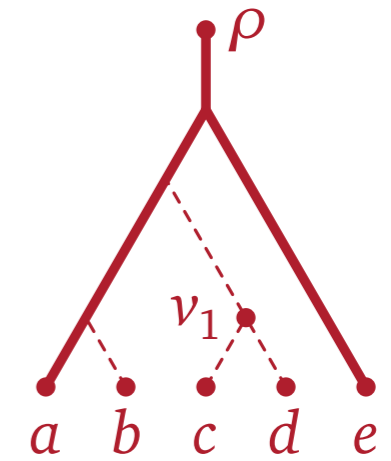
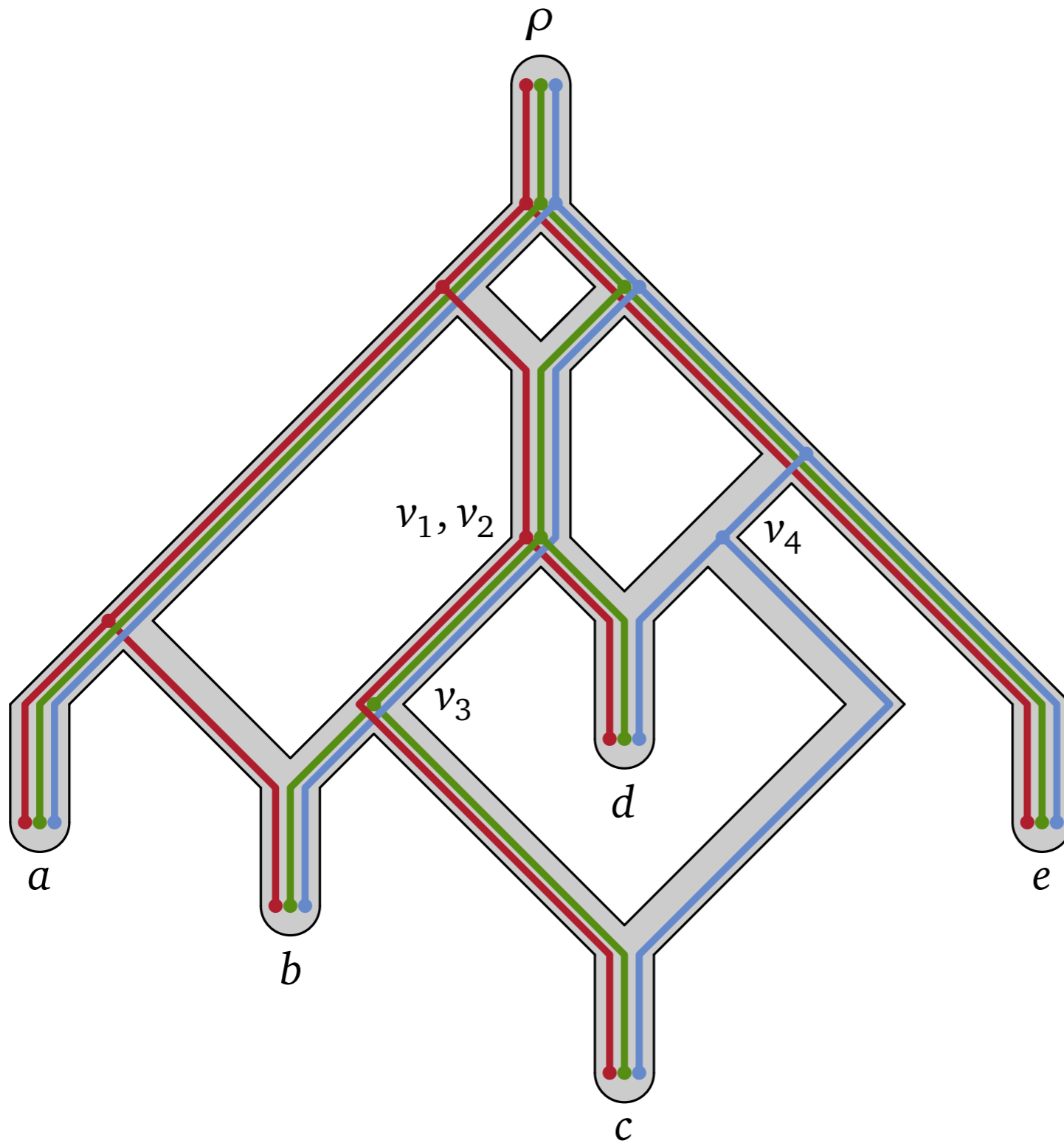
Deletion AAF



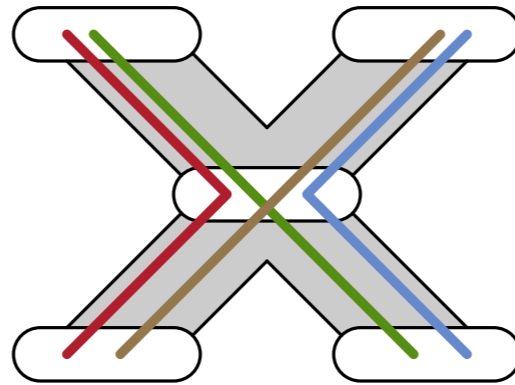
Three trees:

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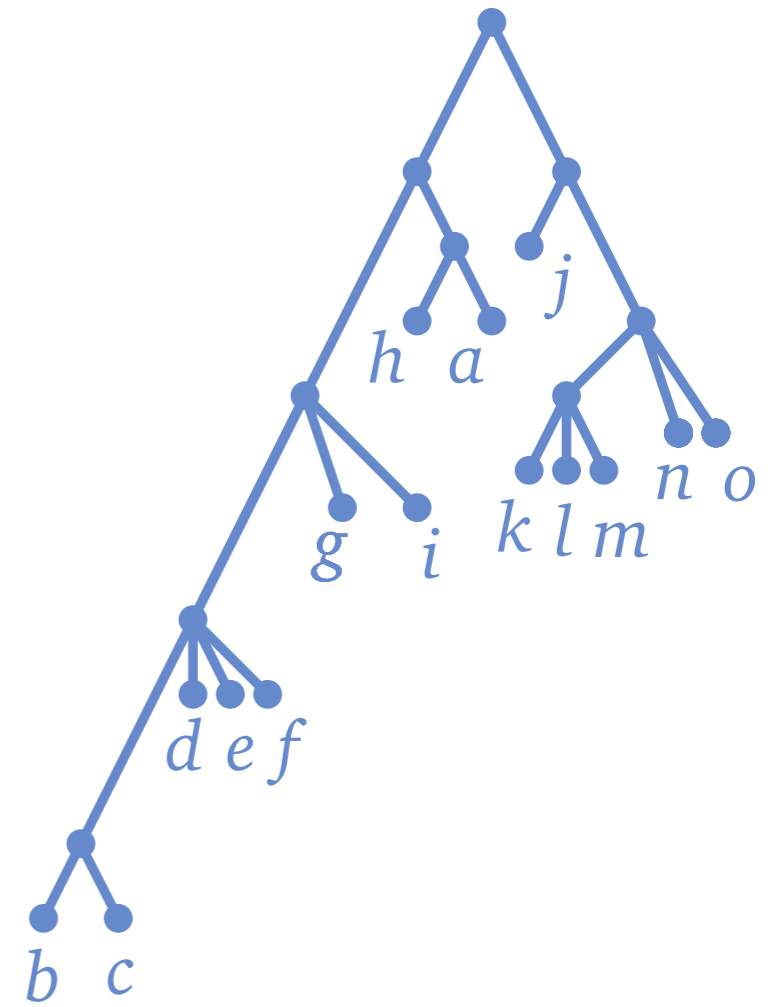
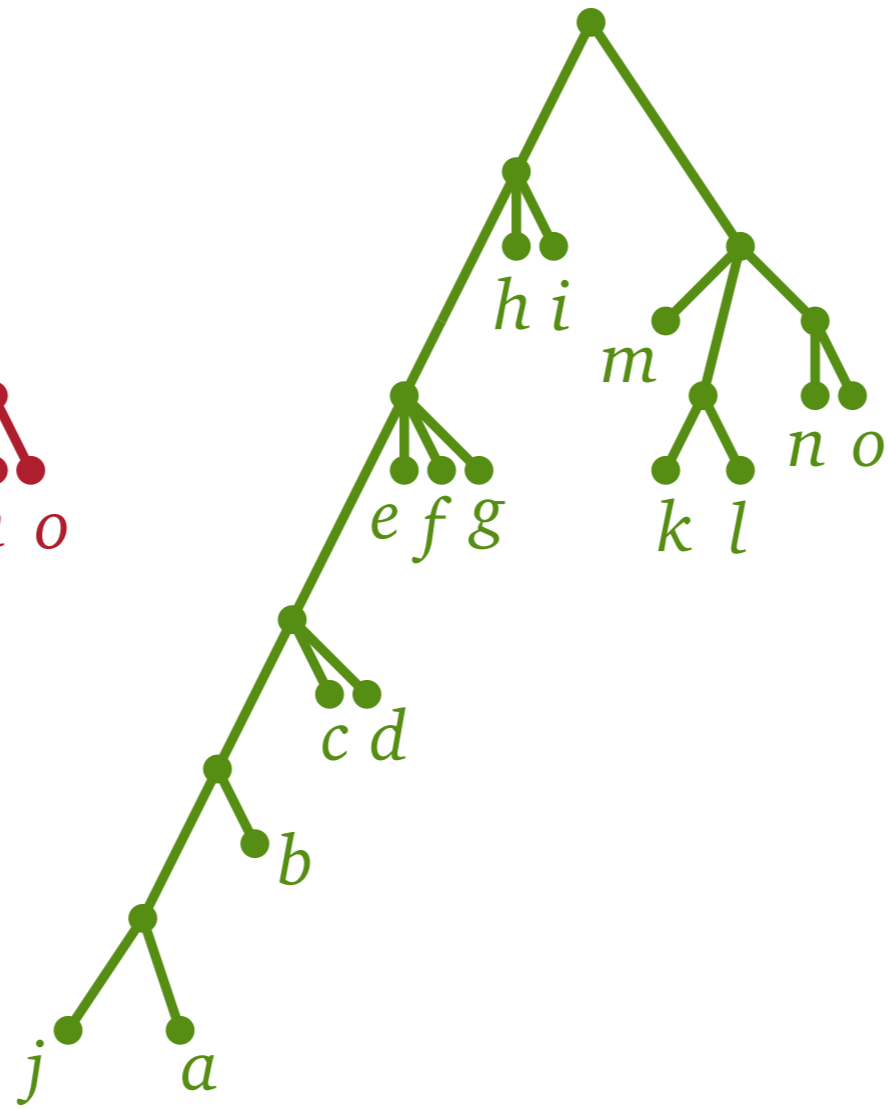
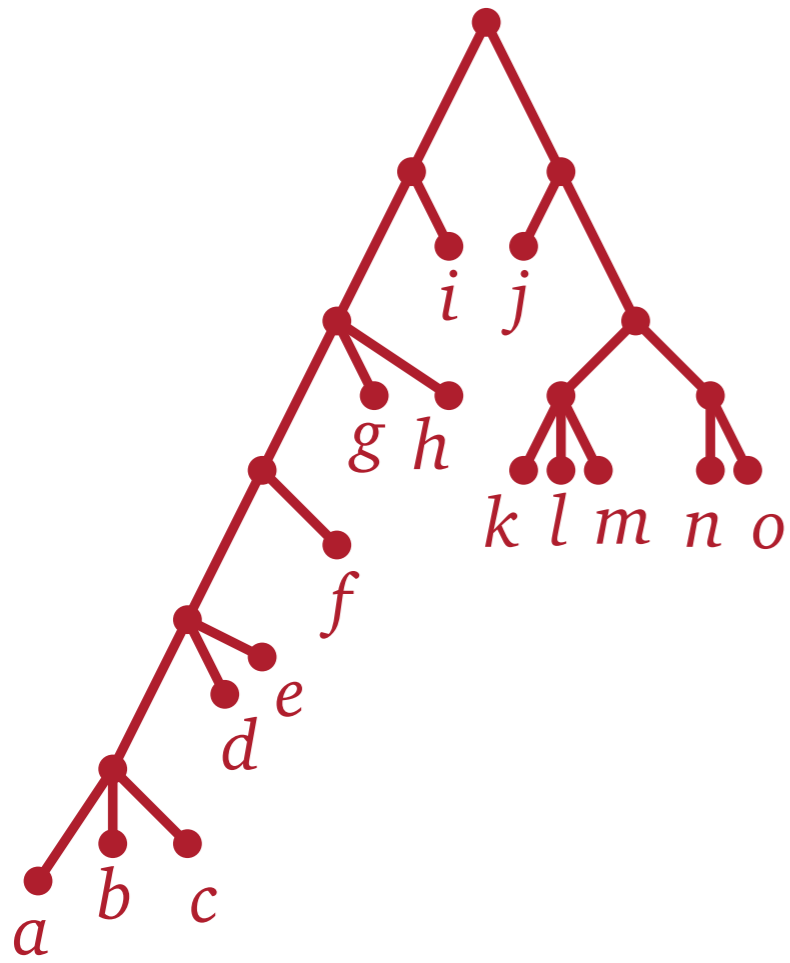
Invisible Components and the Extended AAF



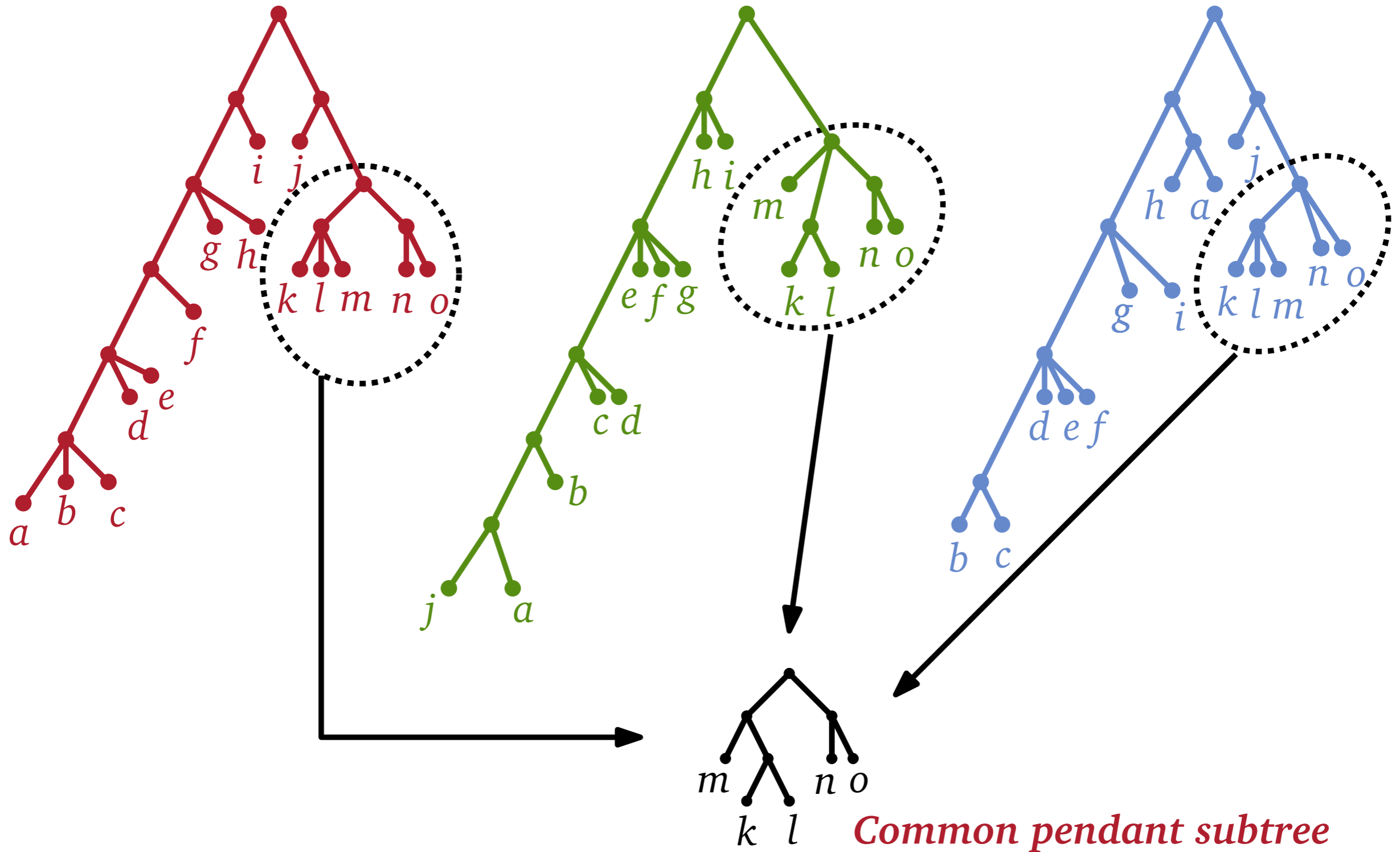
Four Trees May Not Have an Optimal Canonical Network



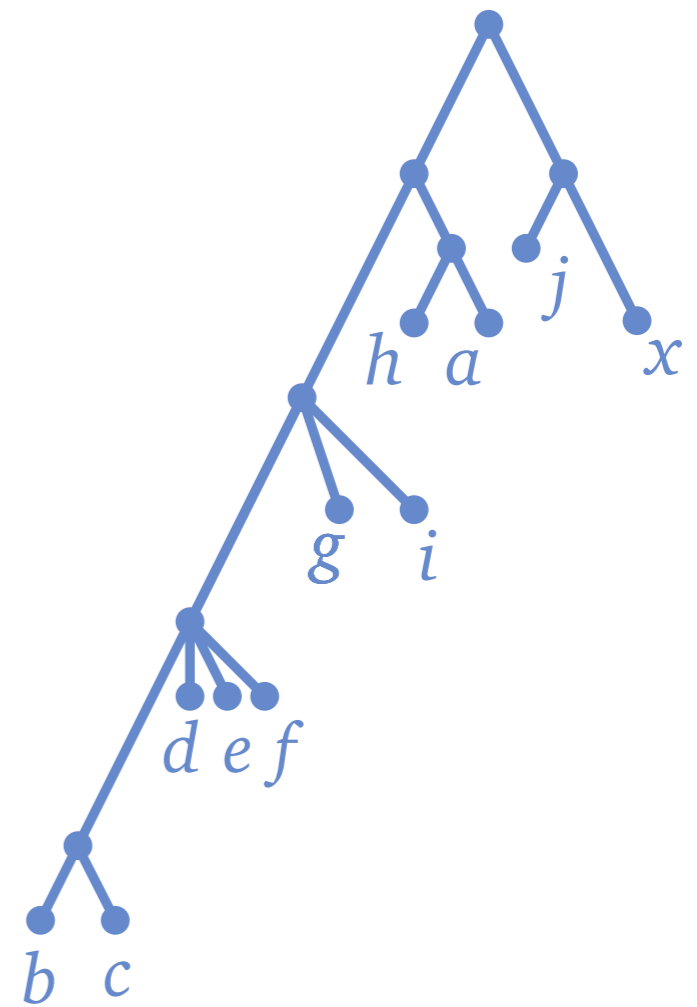
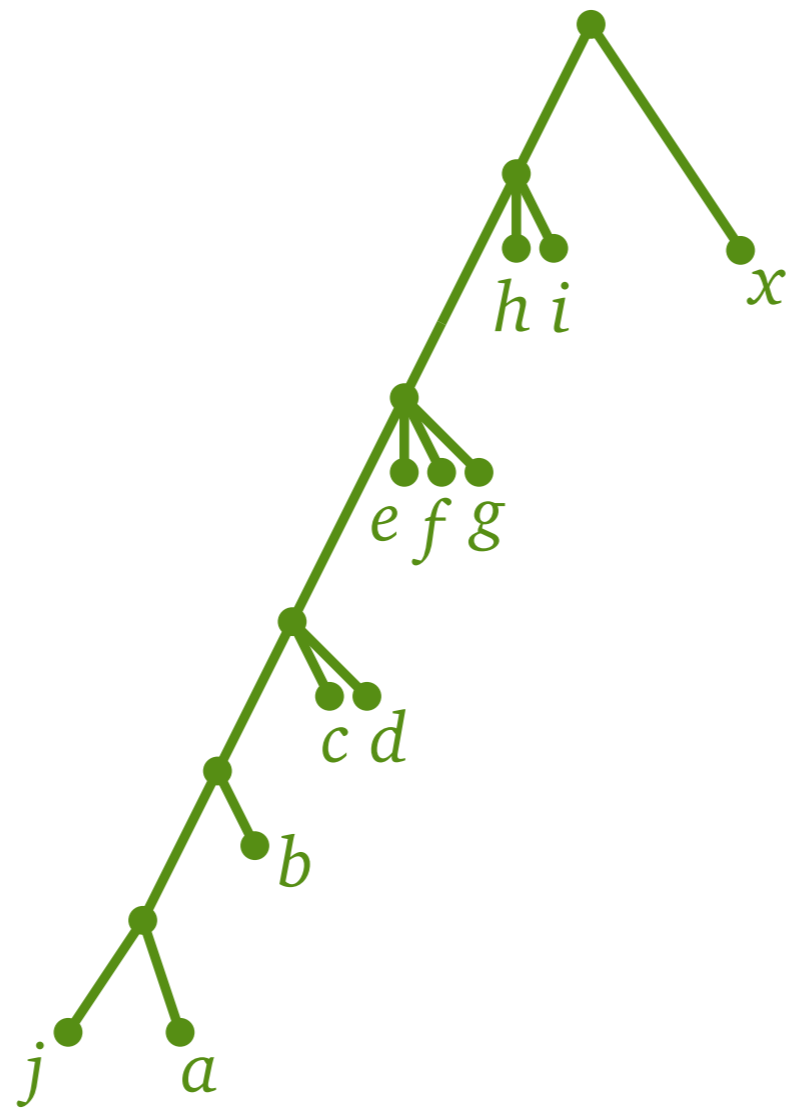
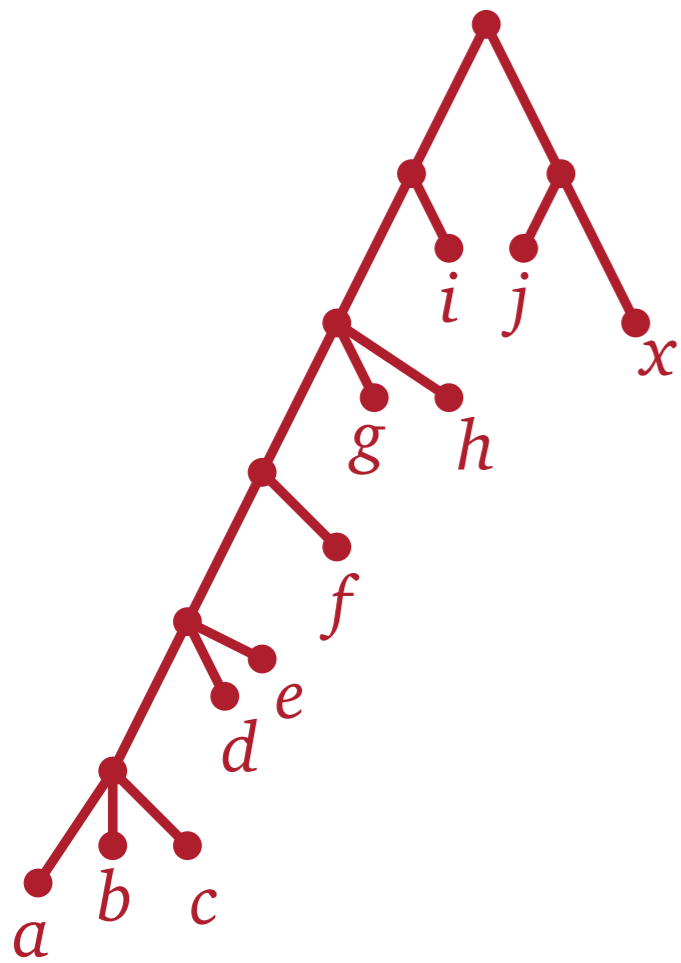
Reduction Rules



Reduction Rules

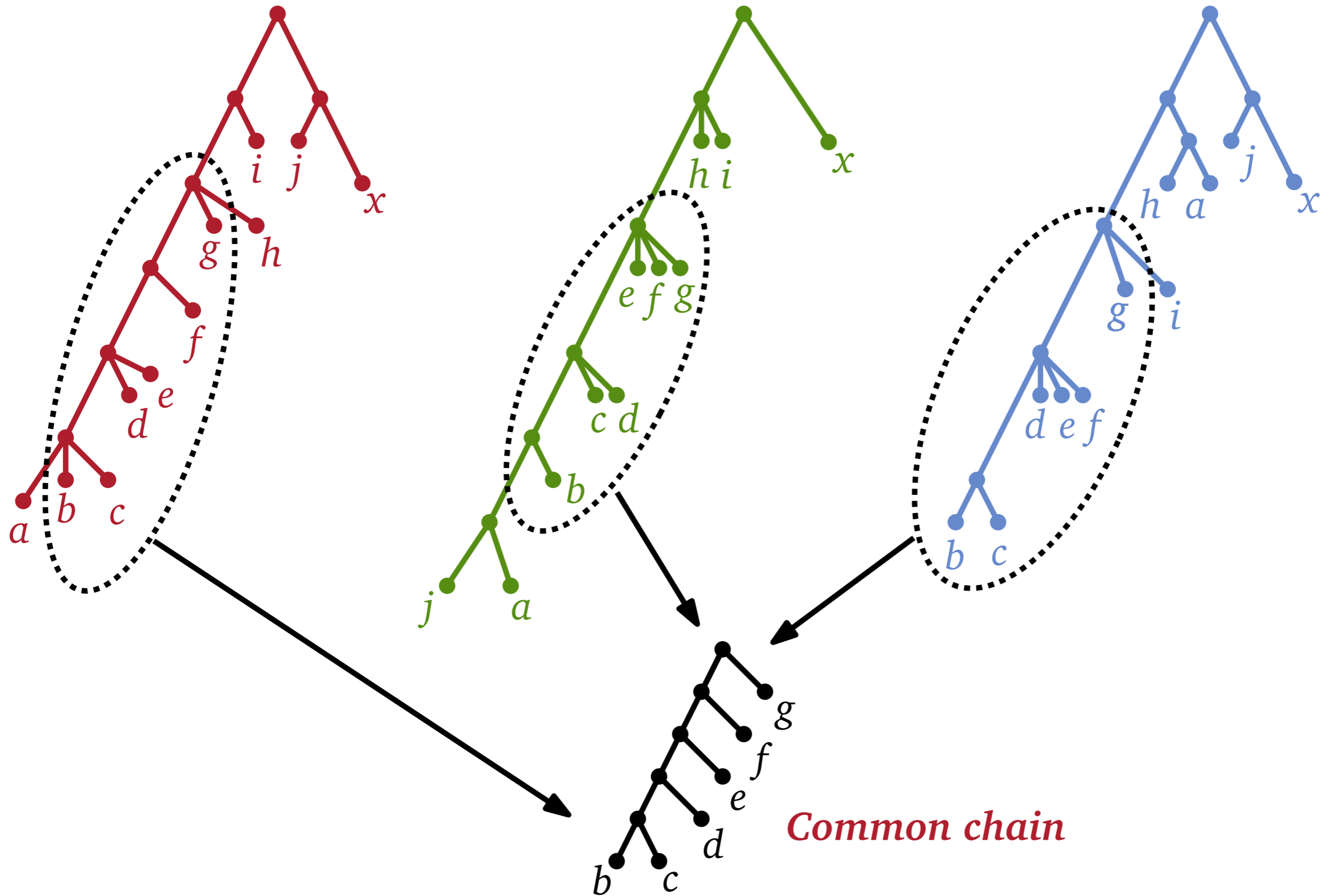


Reduction Rules

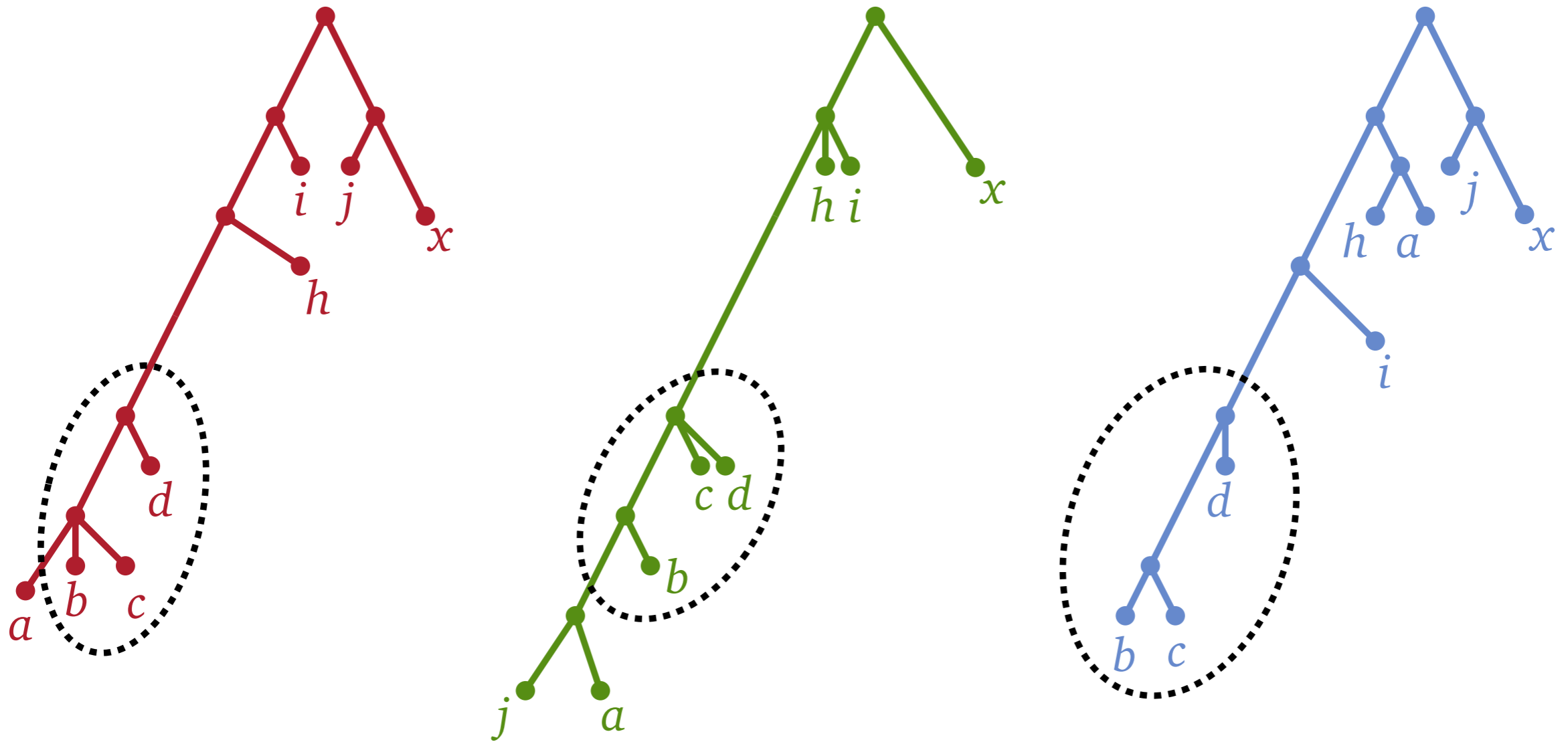


Reduce subtree to a single leaf

Reduction Rules



Reduction Rules



Reduce chain to a certain length

Results

Problem: HYBRIDIZATION NUMBER

Given: Collection of phylogenetic trees \mathcal{T} , each on the same n leaves, $k \in \mathbb{N}$

Question: Does there exist a phylogenetic network that displays each tree in \mathcal{T} and has hybridization number at most k ?

Two binary trees:

- Direct relationship to *maximum acyclic agreement forest* (MAAF)
- $O((28k)^k + n^3)$ -time algorithm (Bordewich & Semple 2007)
- $O(3.18^k n)$ -time algorithm (Whidden, Beiko & Zeh, 2013)
- Same approximability as *directed feedback vertex set* (Kelk, vI, Lekic, Linz, Scornavacca, Stougie, 2012)

Any number of nonbinary trees: (vI, Kelk & Scornavacca, 2014)

- Kernel with $4k(5k)^t$ leaves, with t the number of trees
- Kernel with $20k^2(\Delta^+ - 1)$ leaves, with Δ^+ the maximum outdegree
- $n^{f(k)} t$ -time bounded-search algorithm, with f astronomical

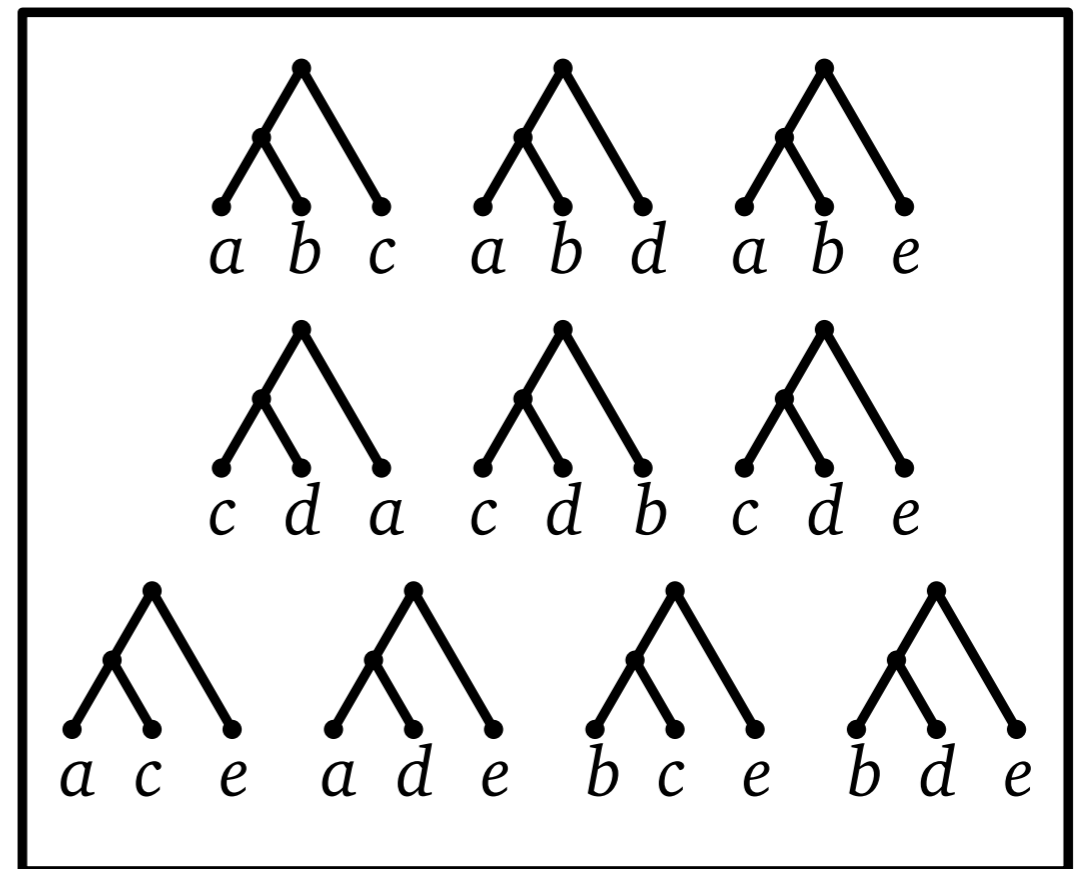
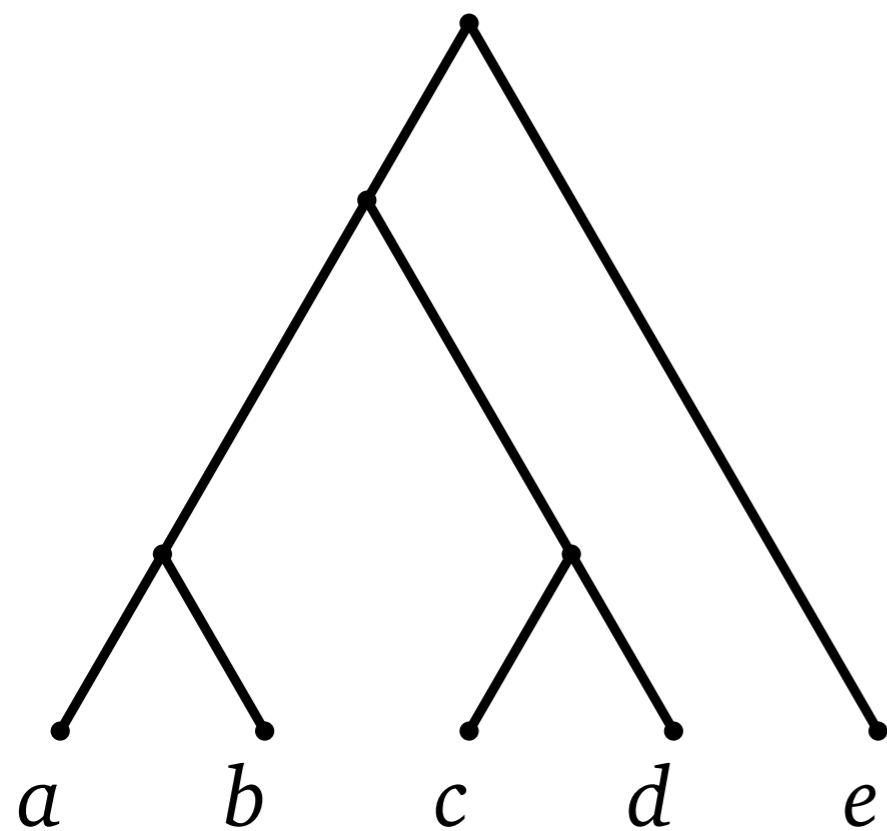
Three binary trees:

- $c^k \text{poly}(n)$ time algorithm (vI, Lekic, Kelk, Whidden & Zeh, 2014)
($c = 1609891840$)
-

PART 2:
NETWORKS FROM
SUBNETWORKS

Encoding Trees

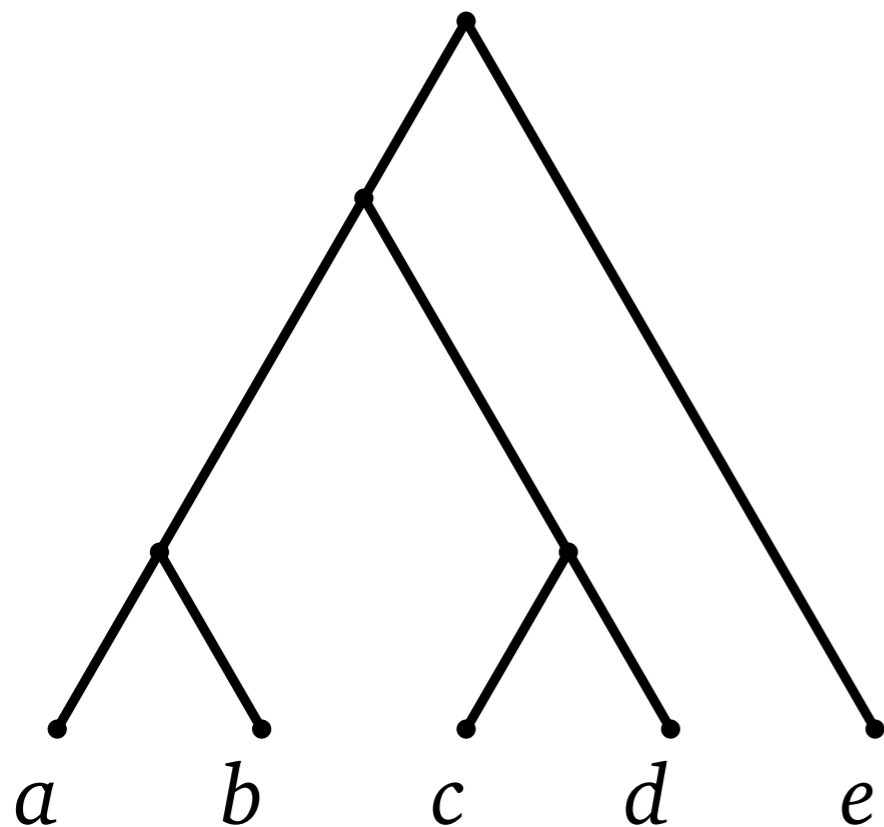
Trees are *encoded* by their *triplets*.



Encoding Trees

Trees are *encoded* by their *triplets*.

Trees are *encoded* by their *clusters*.



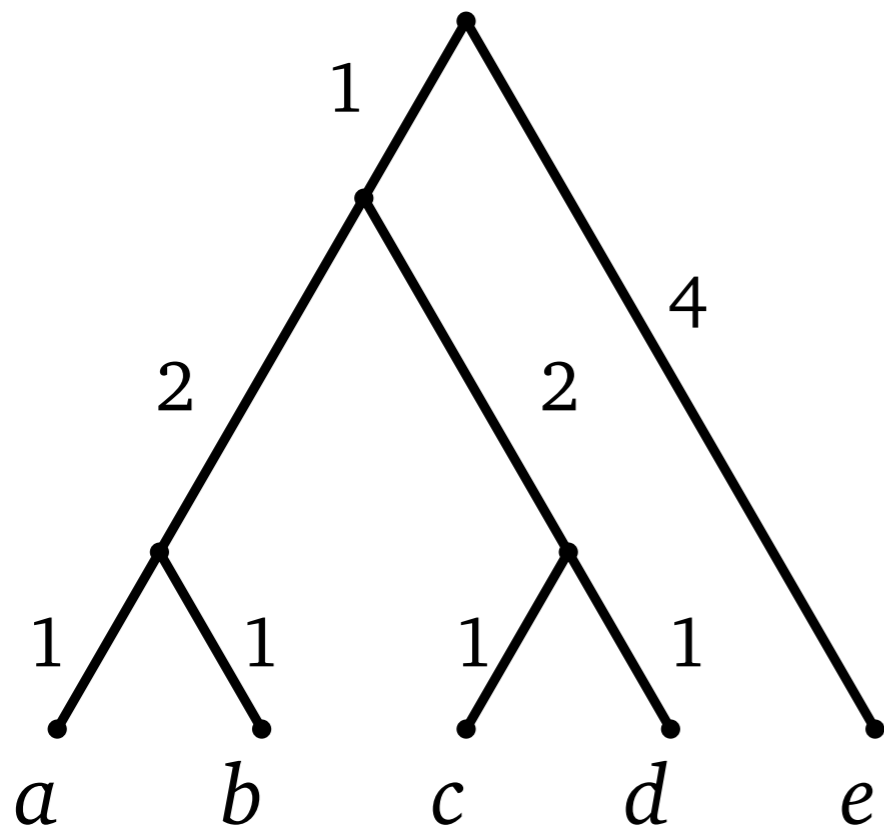
$\{a\}$	$\{b\}$	$\{c\}$
$\{d\}$	$\{a, b\}$	
$\{c, d\}$	$\{a, b, c, d\}$	
	$\{a, b, c, d, e\}$	

Encoding Trees

Trees are *encoded* by their *triplets*.

Trees are *encoded* by their *clusters*.

Trees are *encoded* by their *distances*.



	<i>a</i>	<i>b</i>	<i>c</i>	<i>d</i>	<i>e</i>
<i>a</i>	0	2	6	6	8
<i>b</i>	2	0	6	6	8
<i>c</i>	6	6	0	2	8
<i>d</i>	6	6	2	0	8
<i>e</i>	8	8	8	8	0

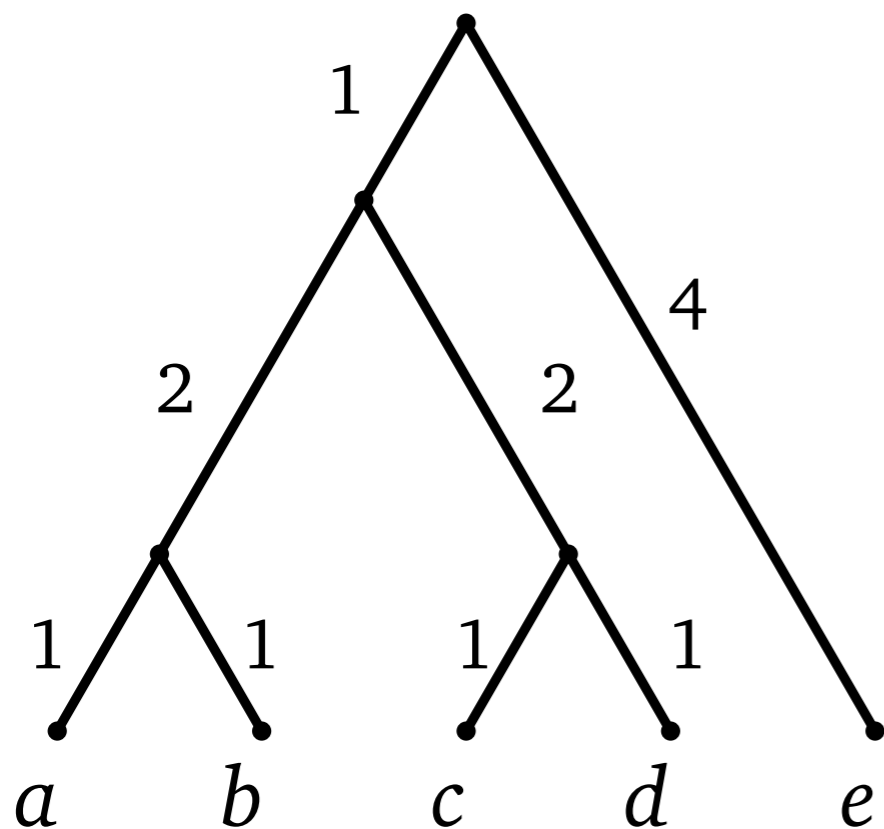
Encoding Trees

Trees are *encoded* by their *triplets*.

Trees are *encoded* by their *clusters*.

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Can we encode *networks*?

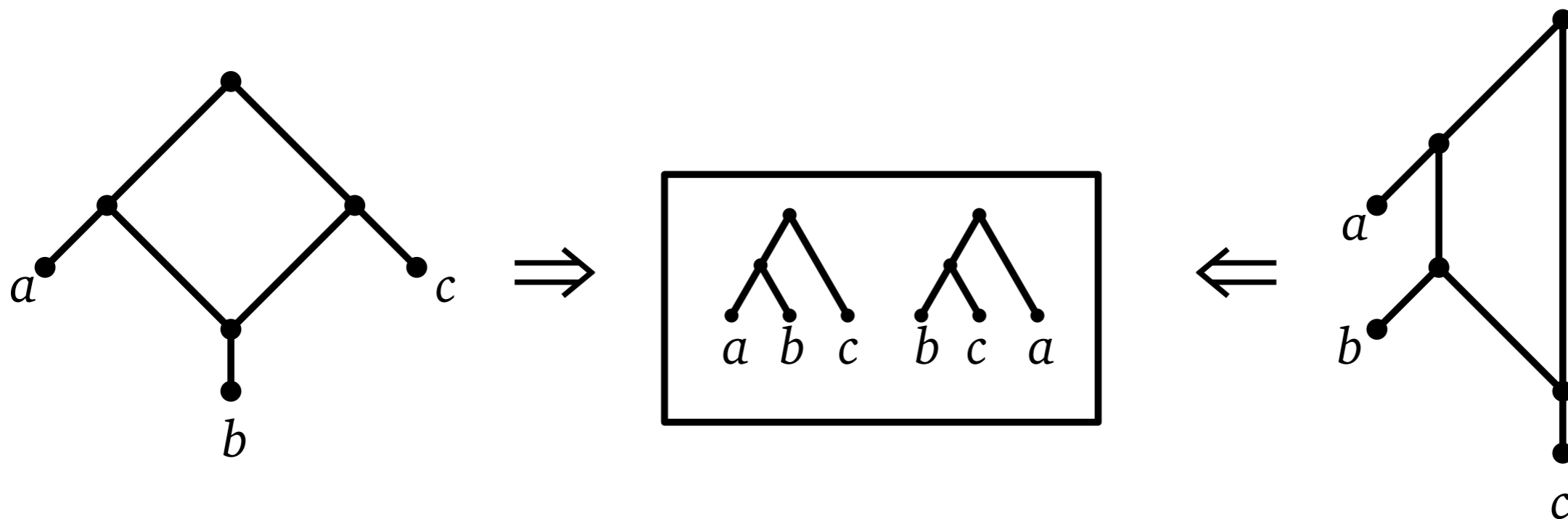


	a	b	c	d	e
a	0	2	6	6	8
b	2	0	6	6	8
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d	6	6	2	0	8
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Encoding Networks

Trees are encoded by their *triplets*.

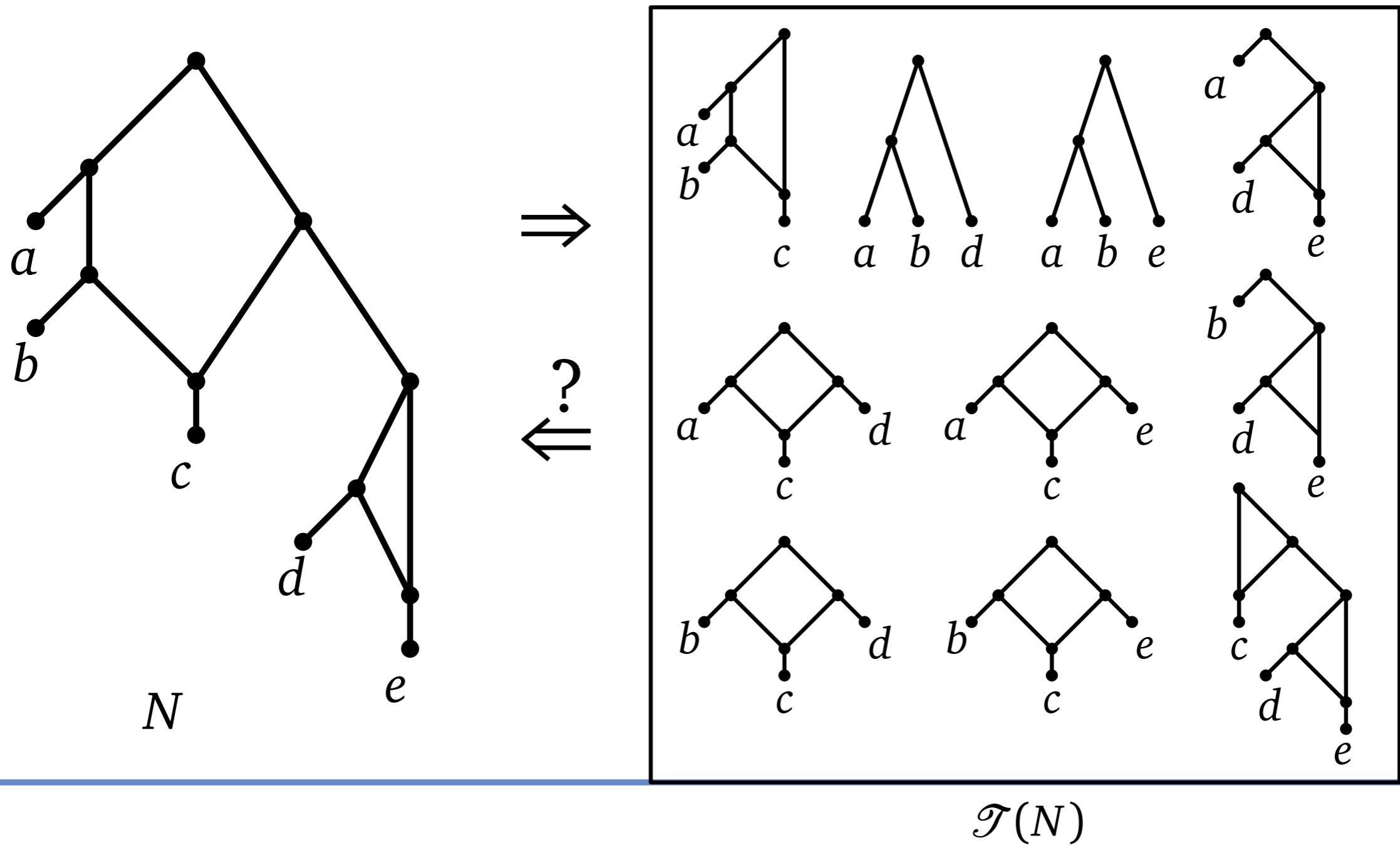
Networks are *not* encoded by their *triplets*.



Trinets and Subnets

Trees are encoded by their *trinets*.

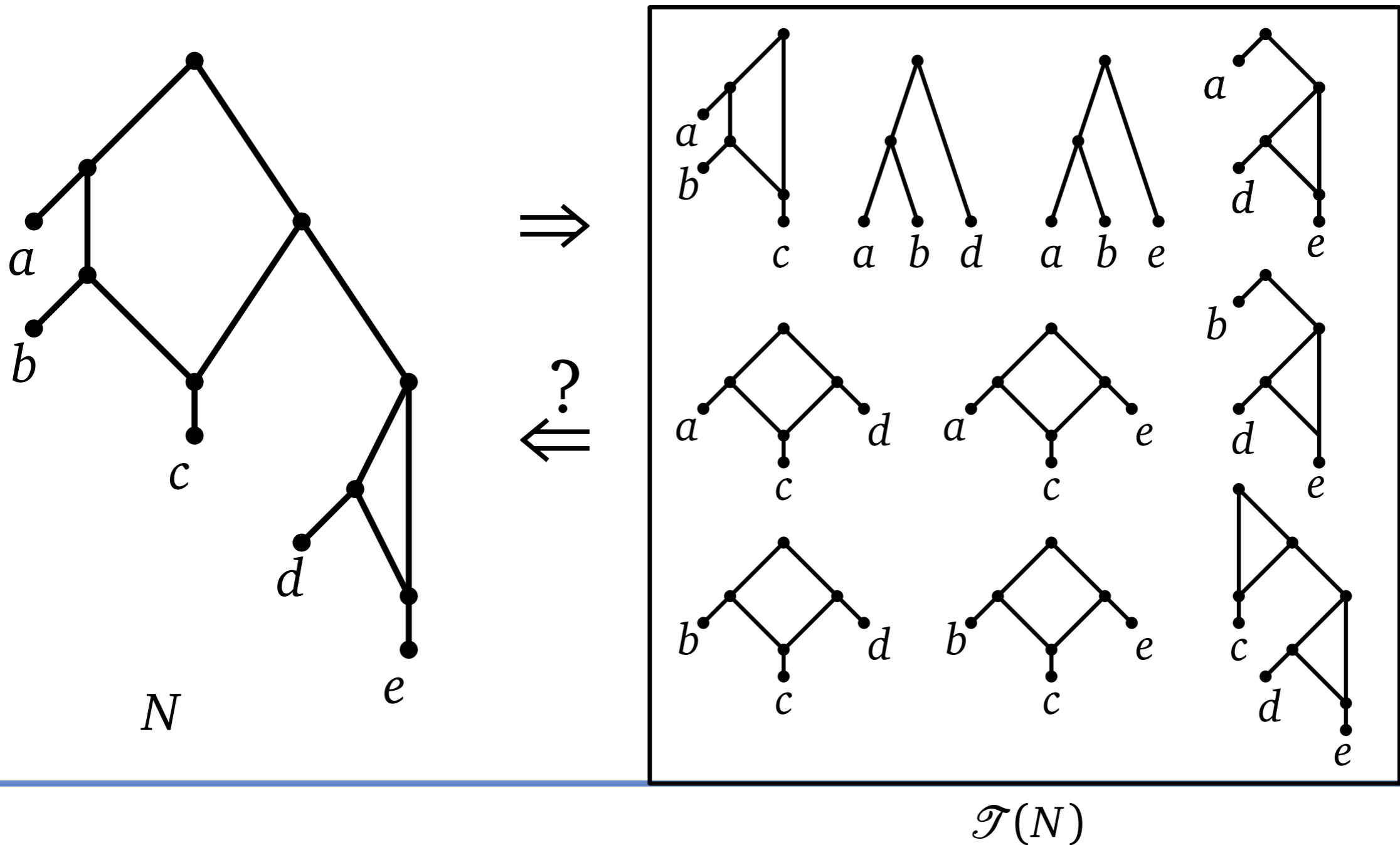
Are *networks* encoded by their *trinets*?



Trinets and Subnets

The *subnet* $N|X'$ is obtained from N by

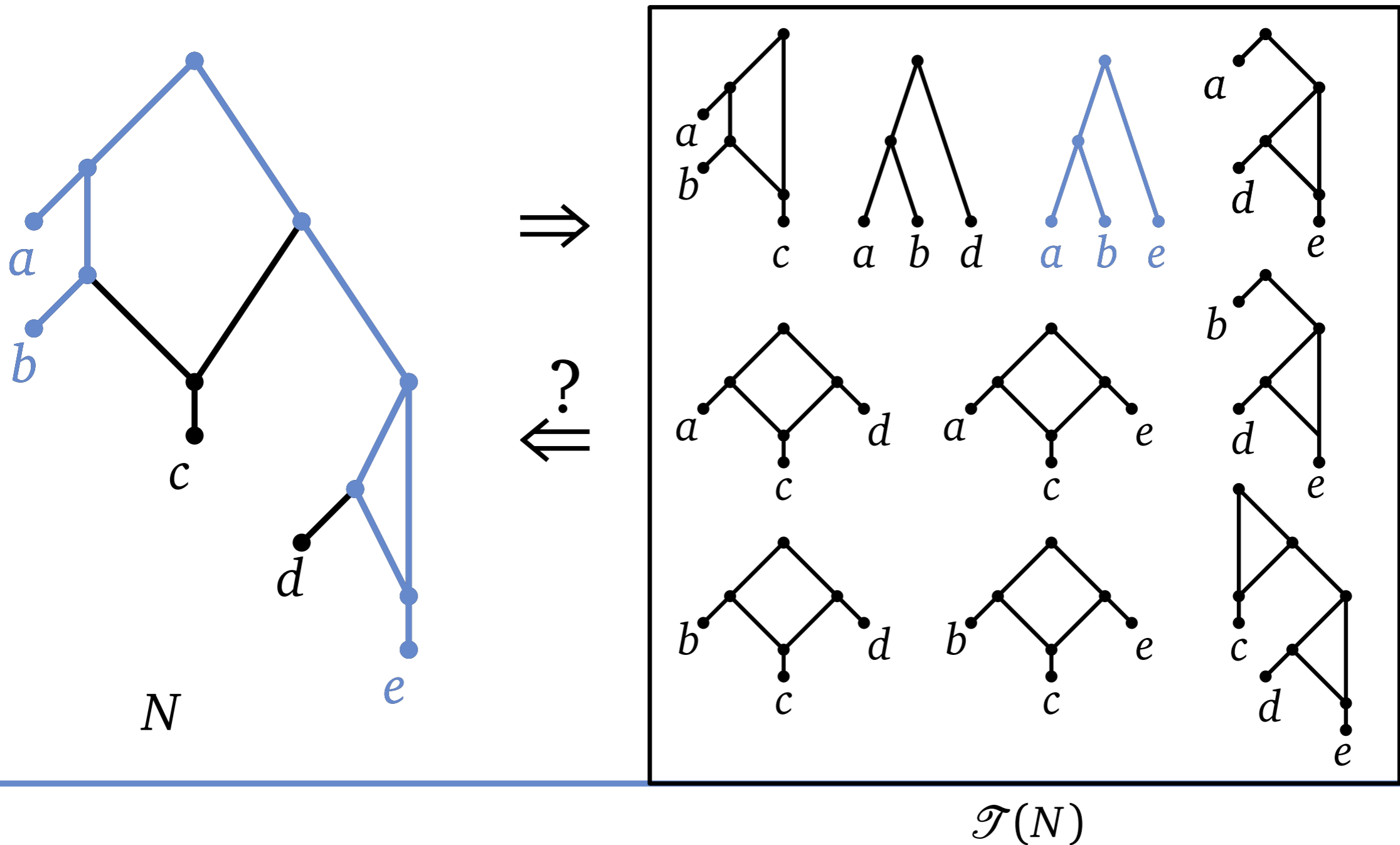
1. deleting all vertices that are not on *any* path from the root to a leaf in X' ;
2. deleting all vertices that are on *all* paths from the root to a leaf in X' ;
3. suppressing indegree-1 outdegree-1 vertices and parallel arcs.



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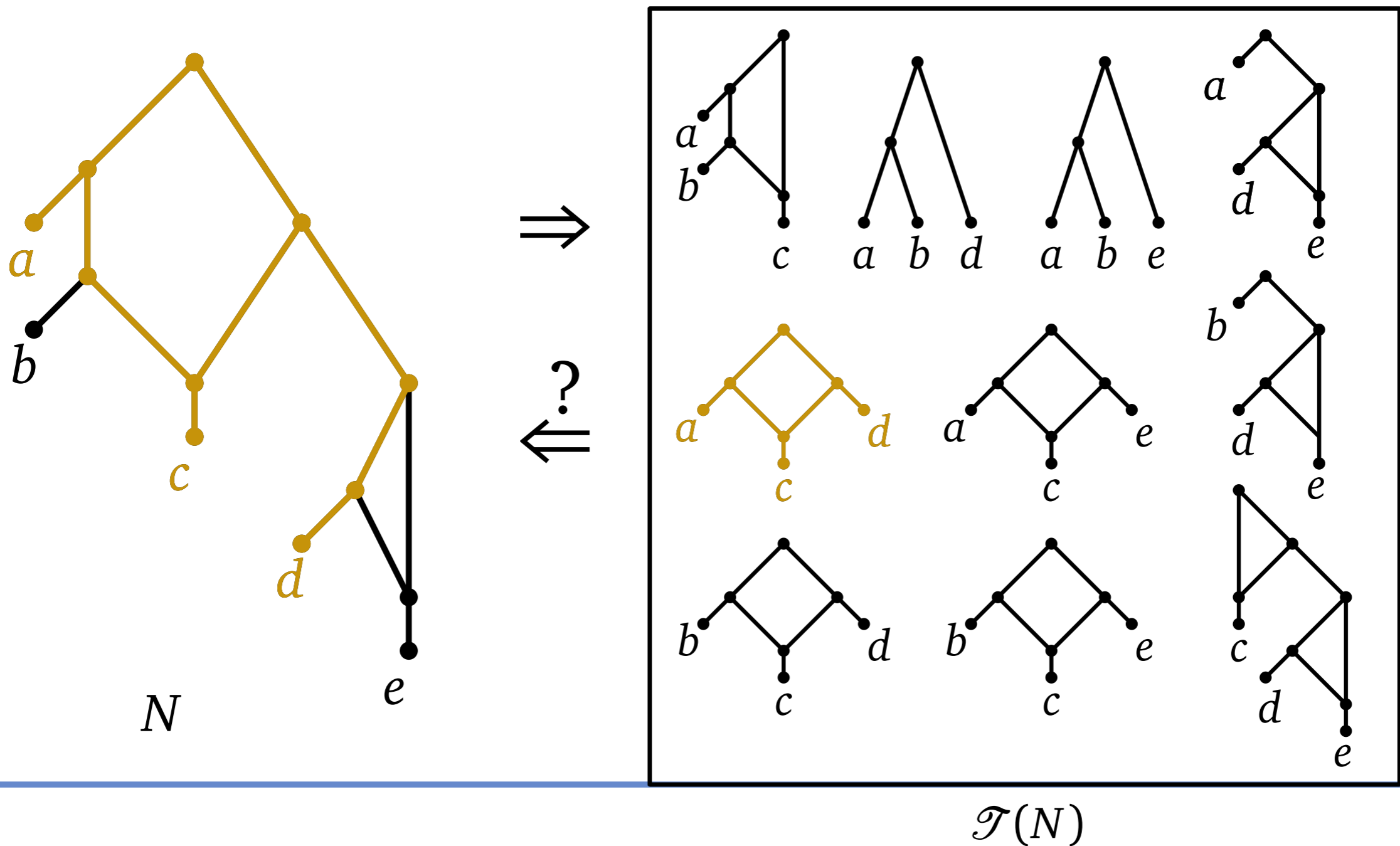
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Trinets and Subnets

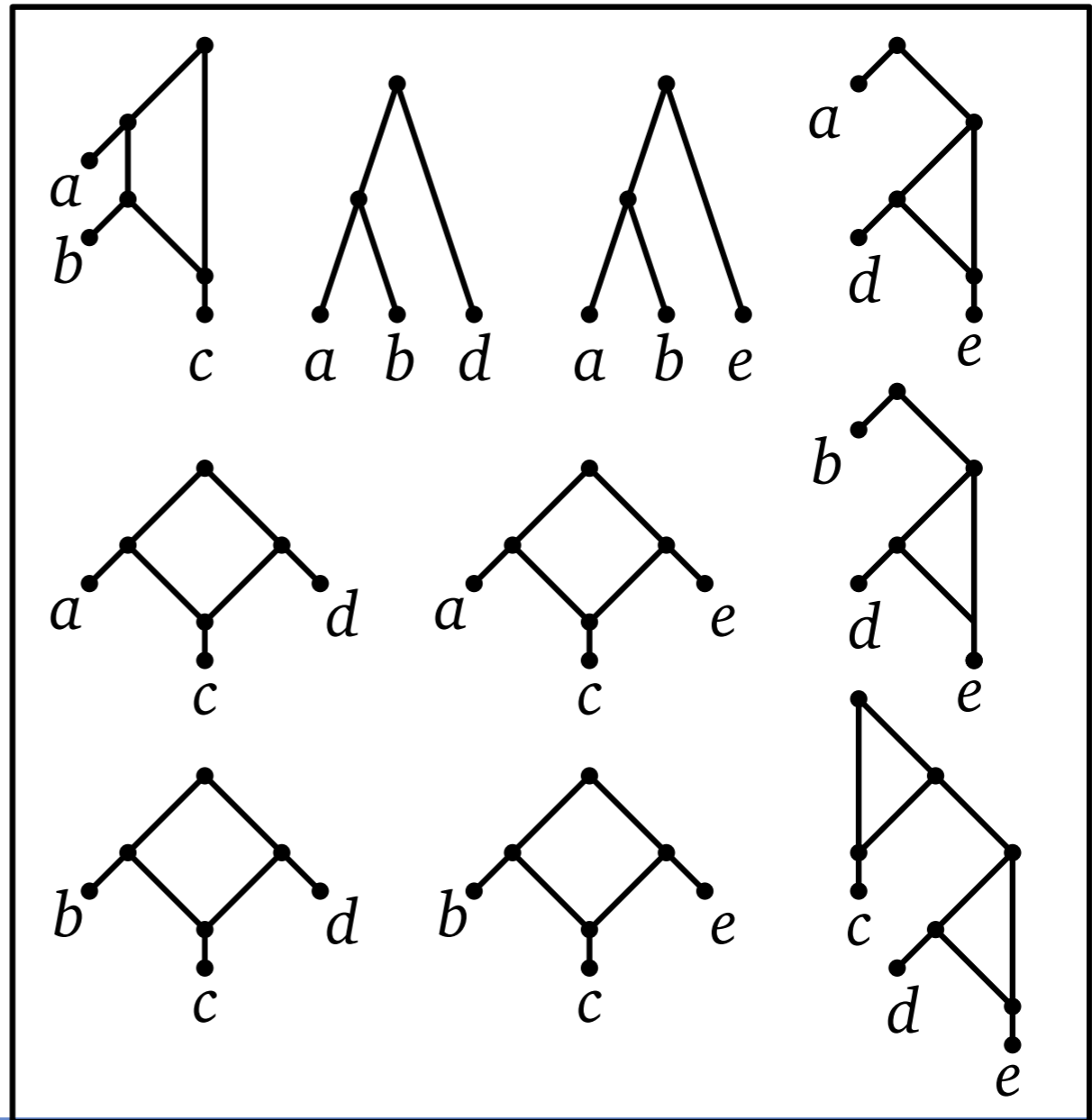
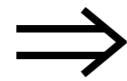
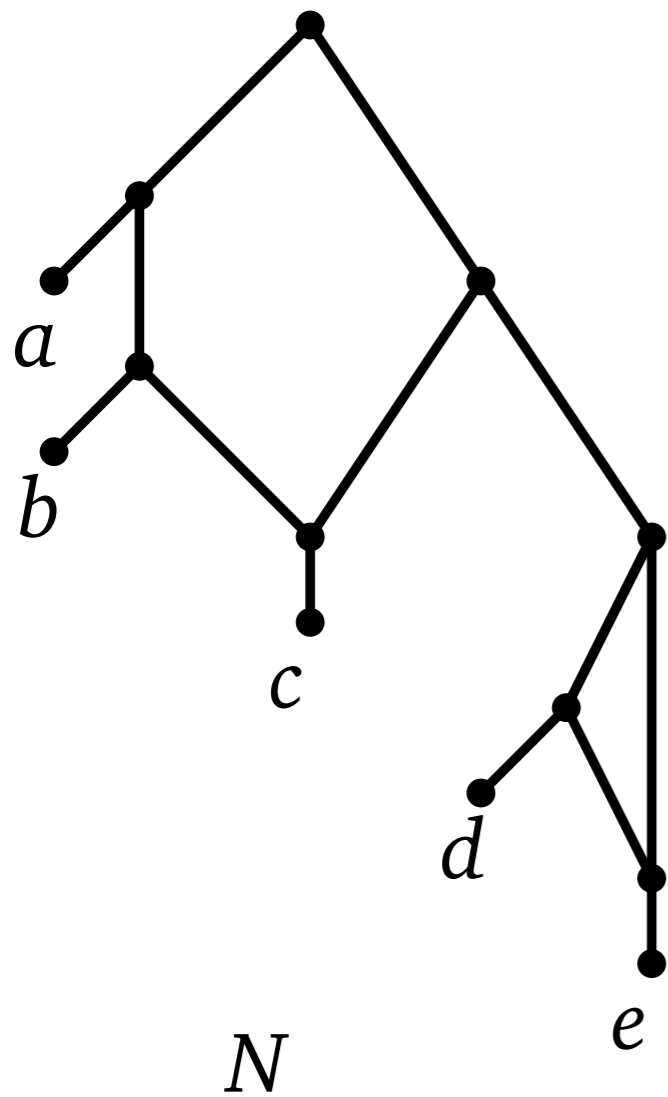
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Trinets and Subnets

A *trinet* is a subnet with 3 leaves.
A *binet* is a subnet with 2 leaves.

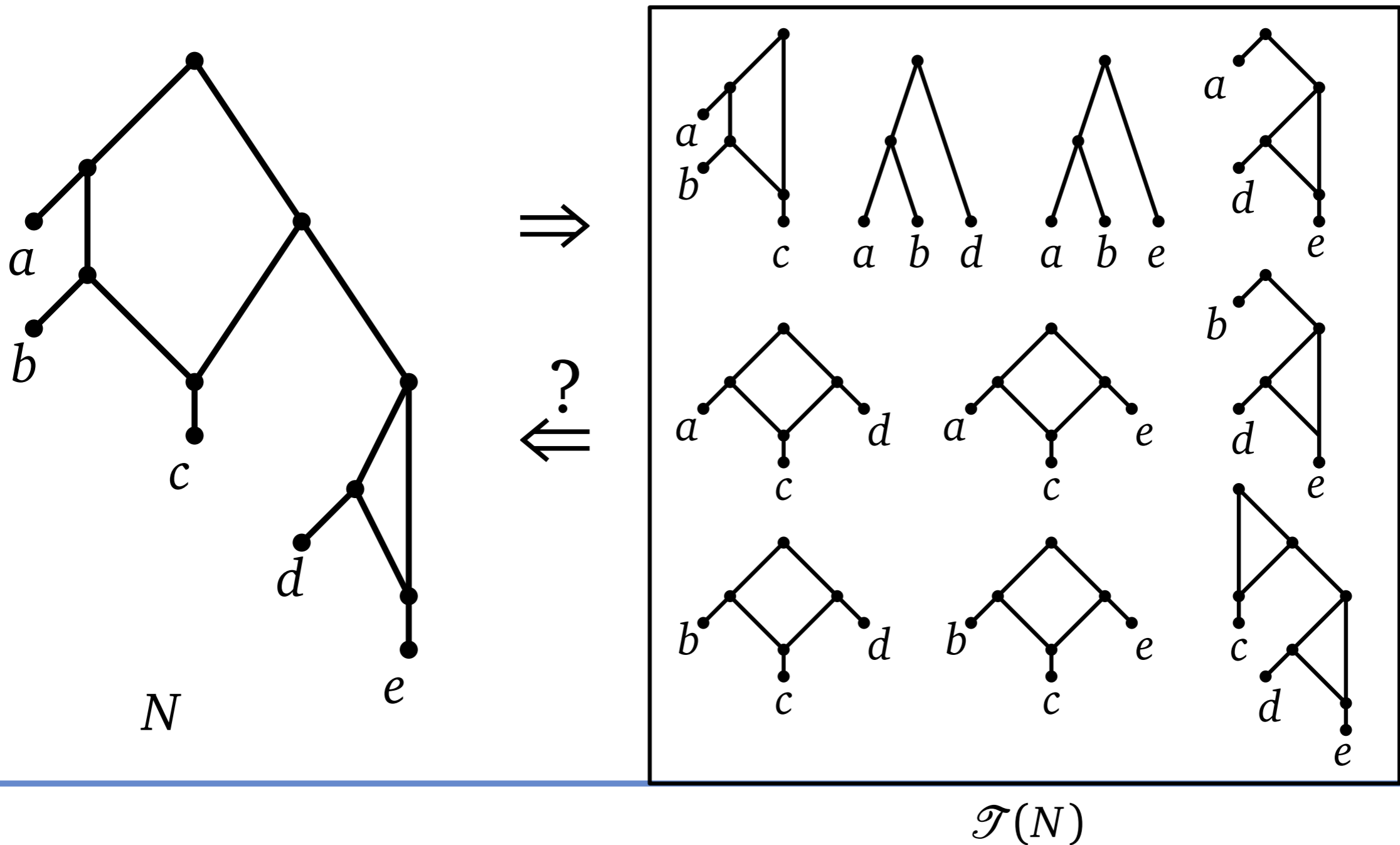


$\mathcal{T}(N)$

Trinets and Subnets

Definition.

- *level-k*: each biconnected component has hybridization number $\leq k$;
- *tree-child*: each non-leaf vertex has a child with indegree-1.

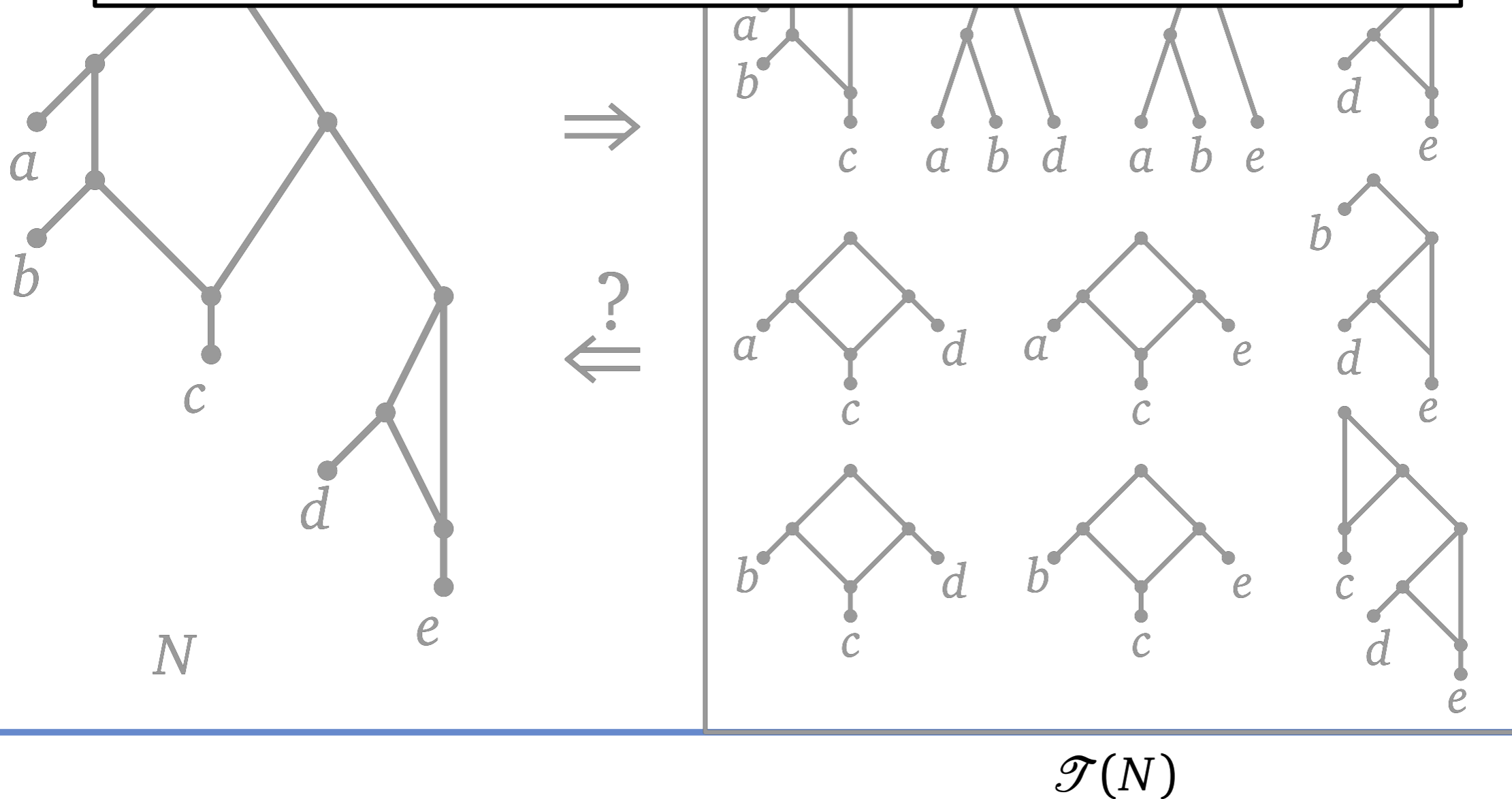


Trinets and Subnets

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- **level- k** : each biconnected component has hybridization number $\leq k$;
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Theorem. (Huber, vI & Moulton) Binary level-1, level-2 and tree-child networks are all encoded by their trinets.



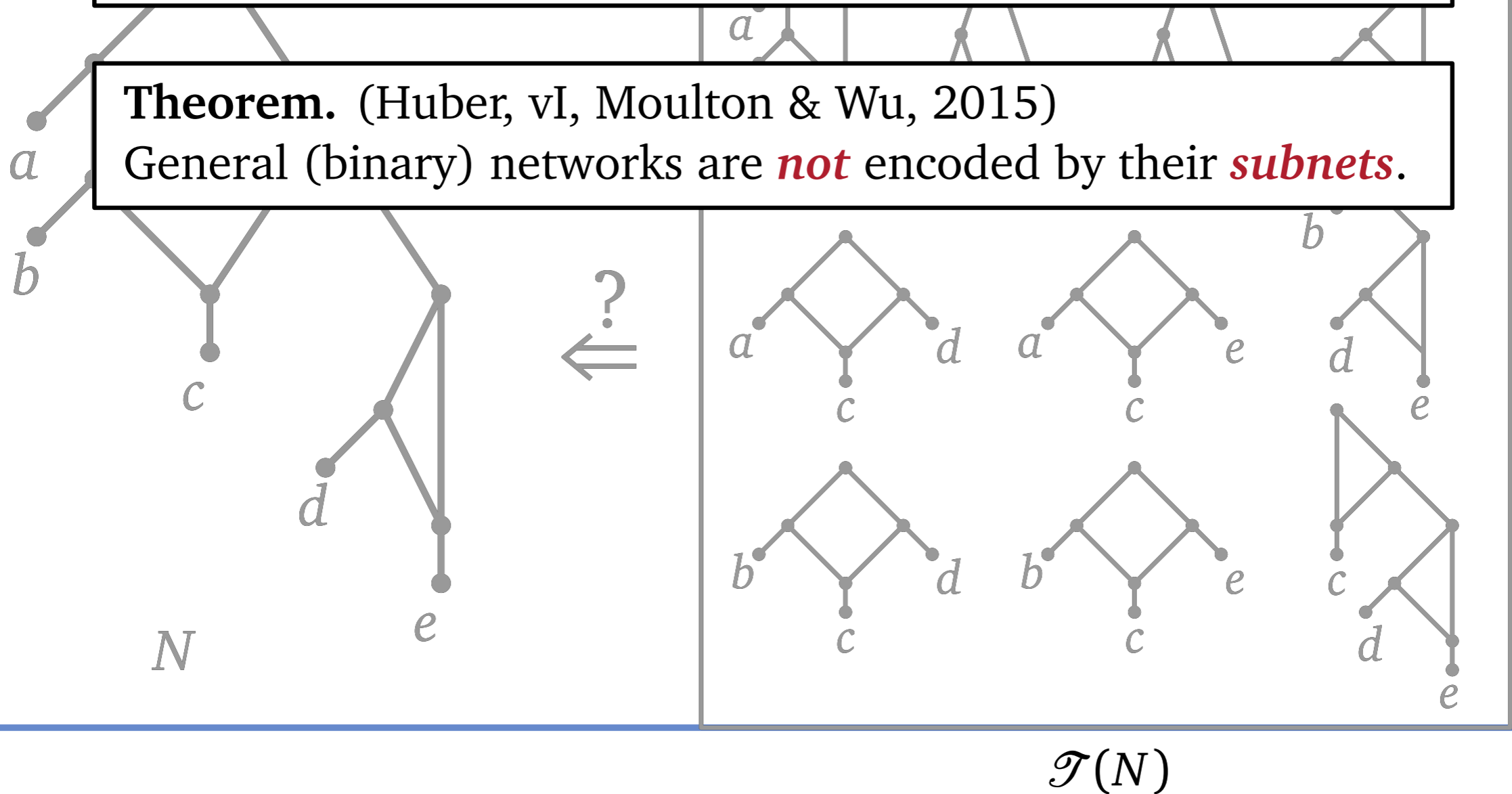
Trinets and Subnets

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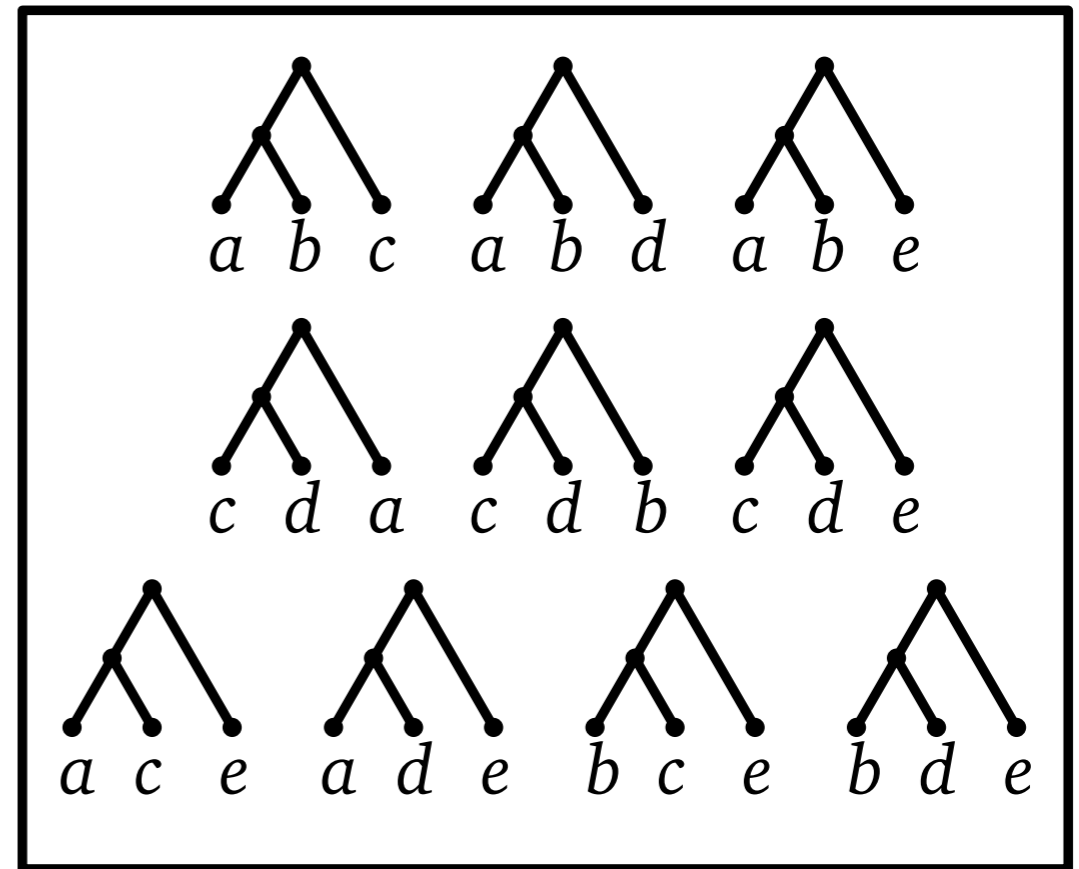
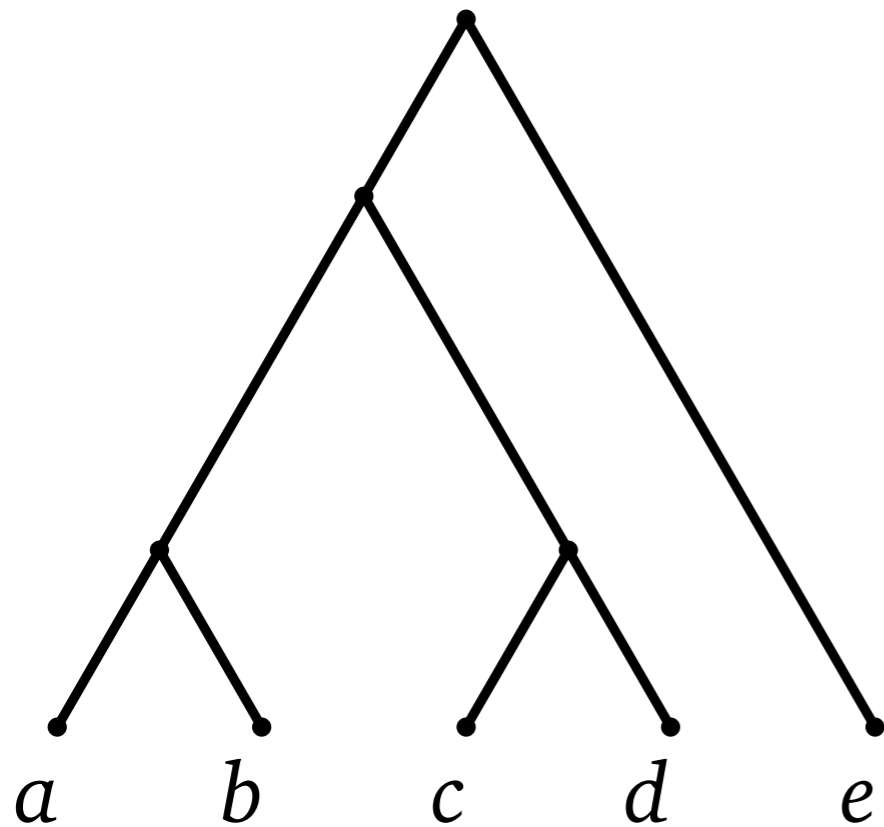
Theorem. (Huber, vI & Moulton) Binary level-1, level-2 and tree-child networks are all encoded by their trinets.

Theorem. (Huber, vI, Moulton & Wu, 2015) General (binary) networks are *not* encoded by their *subnets*.



Reconstructing trees from triplets

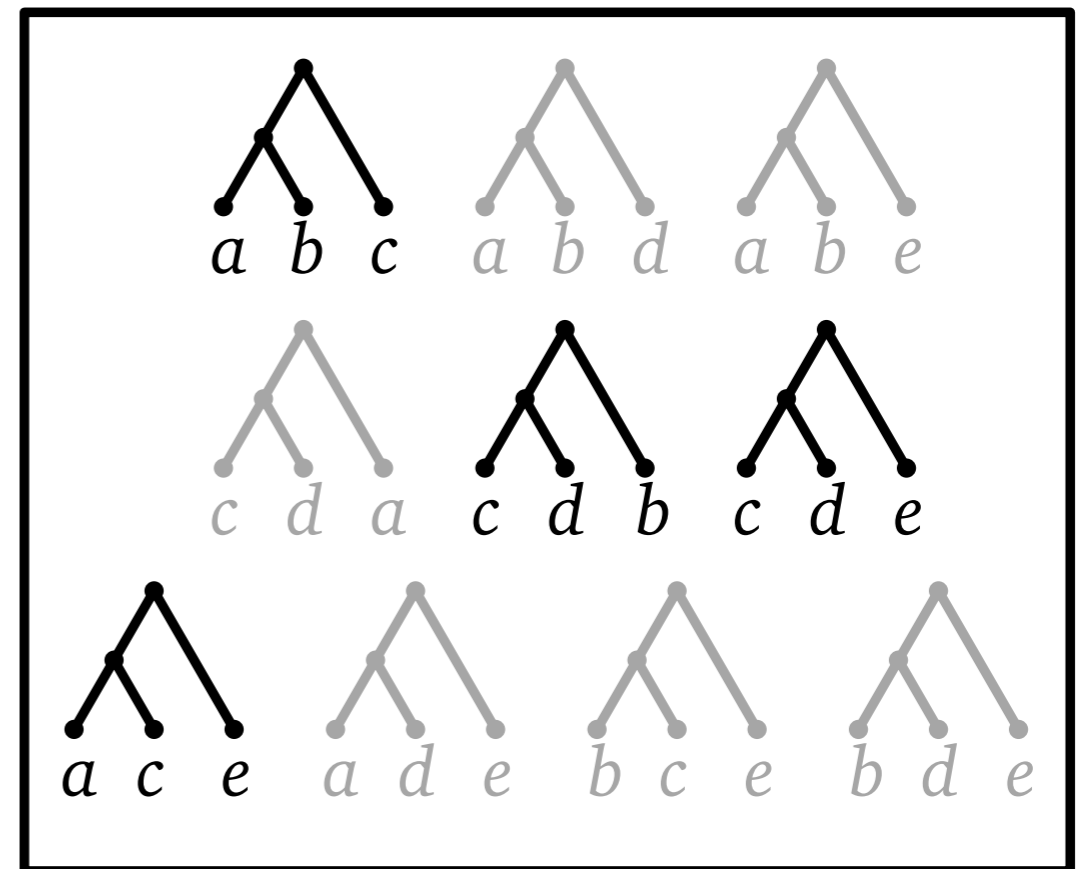
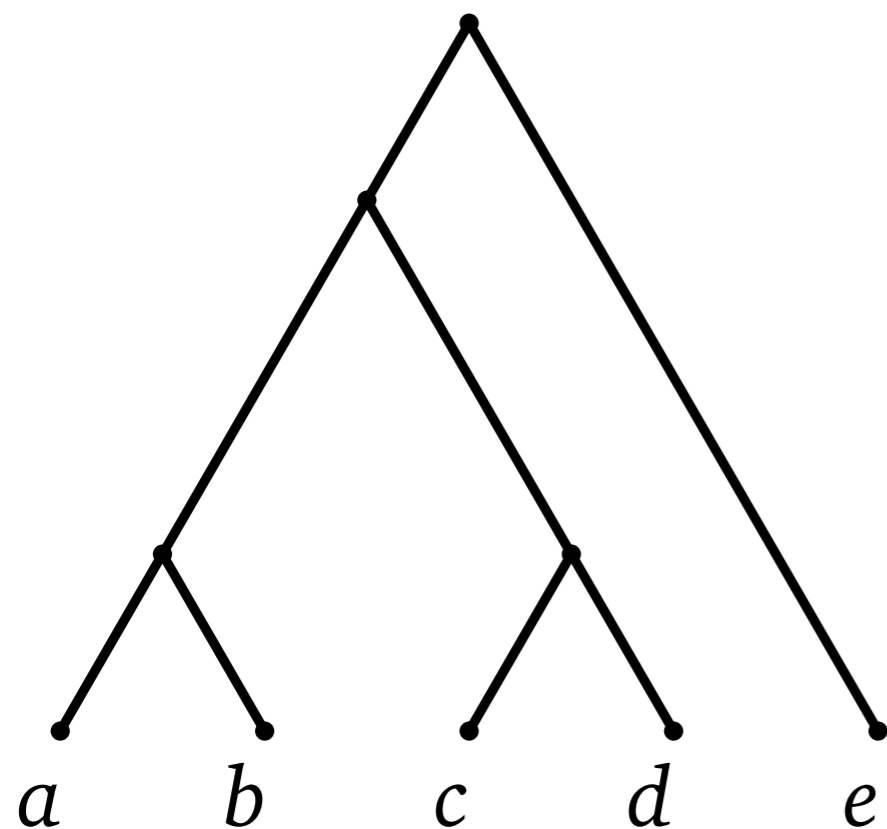
Trees are *encoded* by their *triplets*



Reconstructing trees from triplets

Trees are *encoded* by their *triplets* and given any set of triplets, we can *construct* a tree displaying them, if one exists, in polynomial time.

(Aho, Sagiv, Szymanski, Ullman, 1981)



Reconstructing networks from trinets

Level-1 networks are encoded by their *trinets*

- and given a *complete* set of trinets, we can construct a level-1 network displaying them, if one exists, in polynomial time.

(Huber & Moulton, 2013)

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Level-1 networks are encoded by their *trinets*

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Reconstructing networks from trinets

Level-1 networks are encoded by their *trinets*

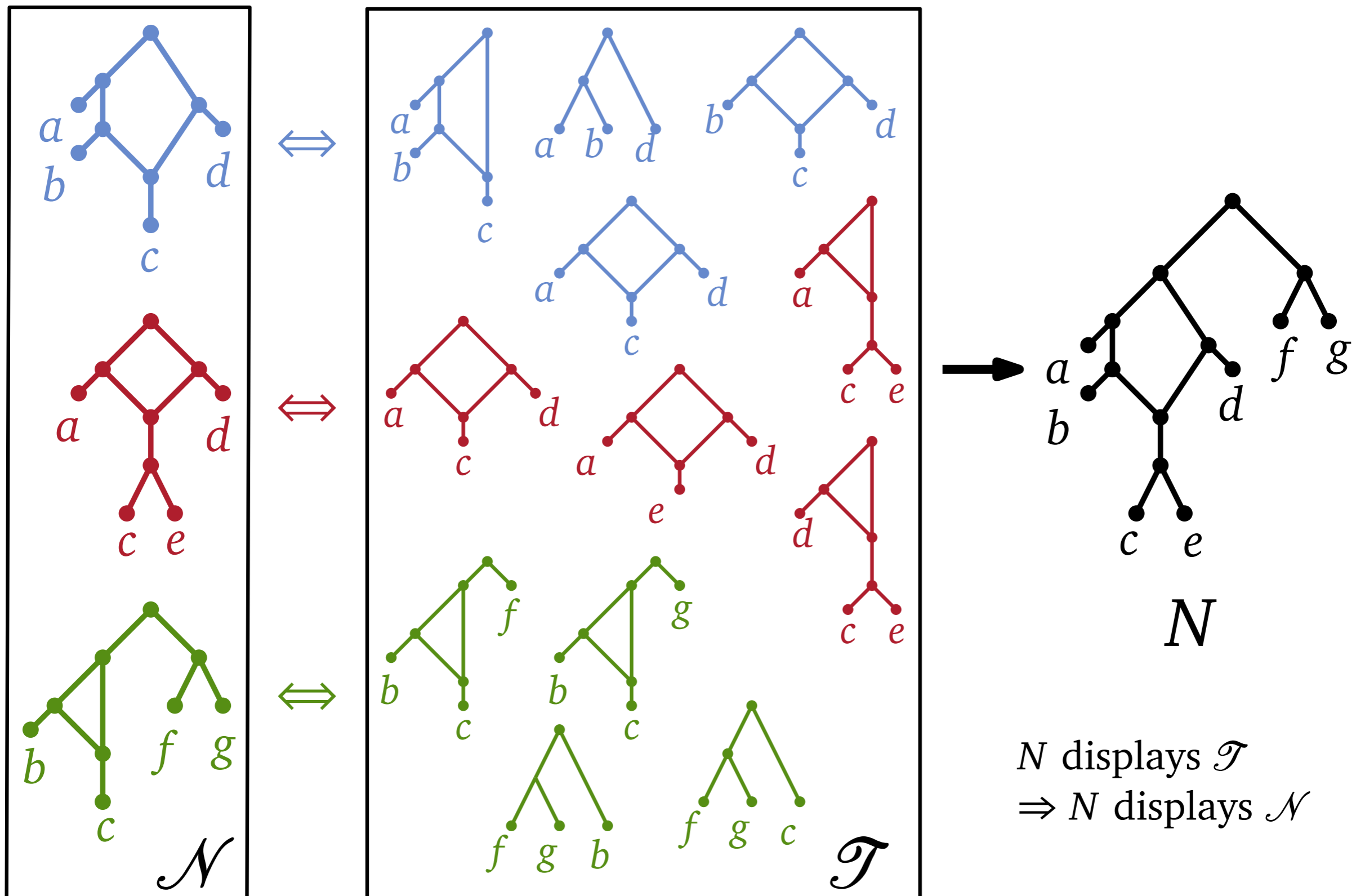
- and given a *complete* set of trinets, we can construct a level-1 network displaying them, if one exists, in polynomial time.

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- for an *arbitrary* set of trinets, this is *NP-hard* but solvable in $O(3^n \text{poly}(n))$ time
- for an arbitrary set of *binets*, this is polynomial-time solvable
- and also for *subnets* in which all cycles have size 3.

(Huber, vI, Moulton, Scornavacca & Wu 2014)

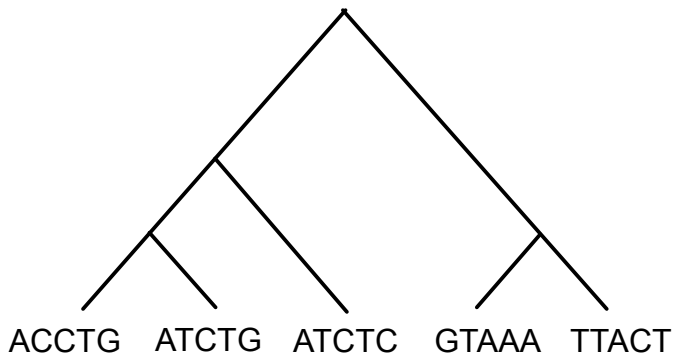
Supernetwork Methods



PART 3:
NETWORKS FROM
SEQUENCES

Maximum Parsimony for trees

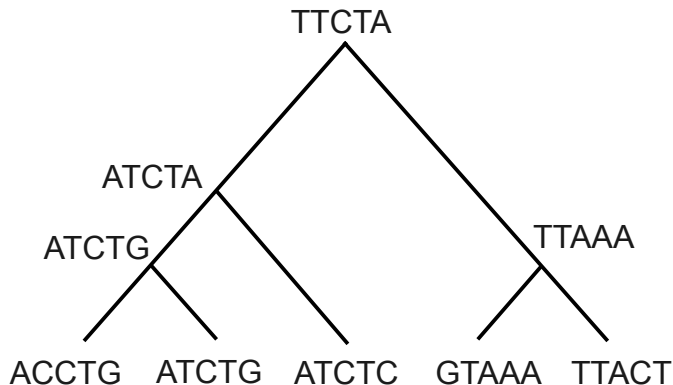
Small parsimony problem: given a tree and a sequence for each leaf, assign sequences to the internal vertices in order to **minimize** the total number of **changes**.



Example input

Maximum Parsimony for trees

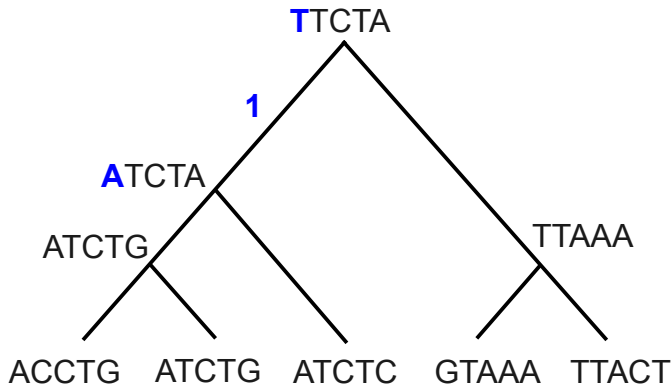
Small parsimony problem: given a tree and a sequence for each leaf, assign sequences to the internal vertices in order to **minimize** the total number of **changes**.



Example labelling of internal vertices

Maximum Parsimony for trees

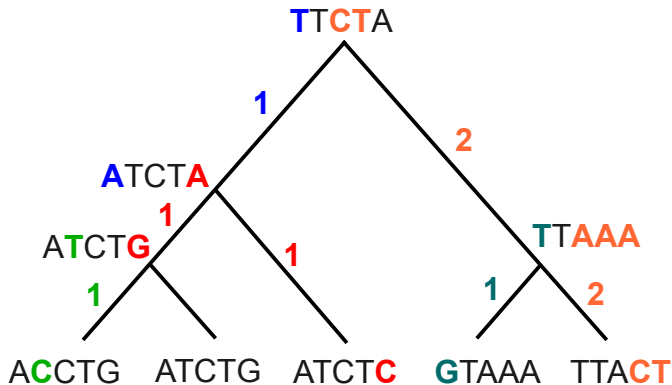
Small parsimony problem: given a tree and a sequence for each leaf, assign sequences to the internal vertices in order to **minimize** the total number of **changes**.



Example of one change

Maximum Parsimony for trees

Small parsimony problem: given a tree and a sequence for each leaf, assign sequences to the internal vertices in order to **minimize** the total number of **changes**.



The parsimony score is 9.

Maximum Parsimony for trees

Small parsimony problem: given a tree and a sequence for each leaf, assign sequences to the interior vertices in order to **minimize** the total number of **changes**.

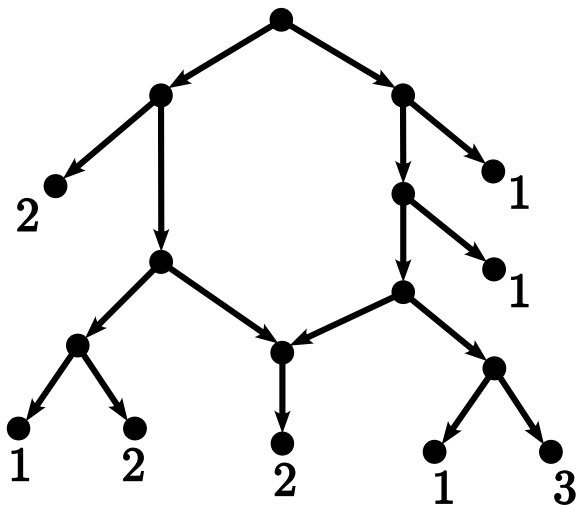
- Polynomial-time solvable:
 - ▶ Consider each character (position in the sequences) separately.
 - ▶ Use dynamic programming (Fitch, 1971).

Small Parsimony Problem on **Networks**

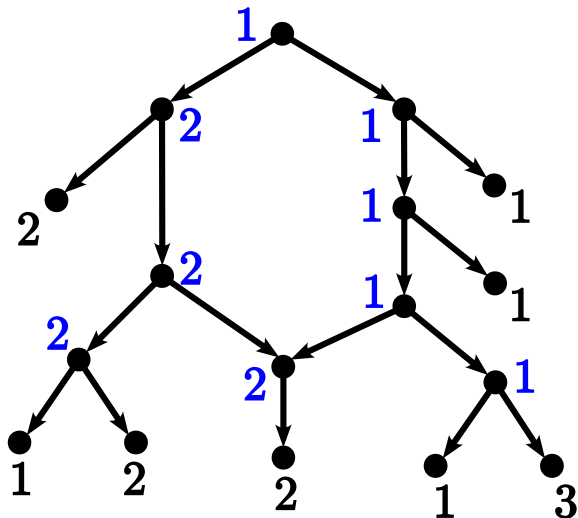
Given a network and a state for each leaf.

- **Hardwired** Parsimony Score: the minimum number of state-changes over all possible assignments of states to internal vertices.
- **Softwired** Parsimony Score: the minimum parsimony score of a tree displayed by the network.

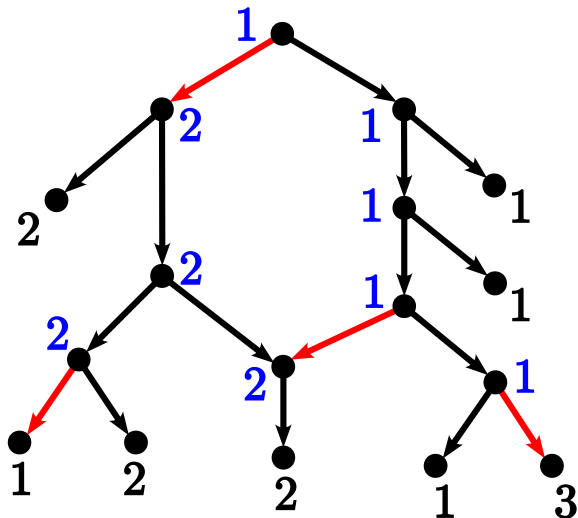
Example: Input



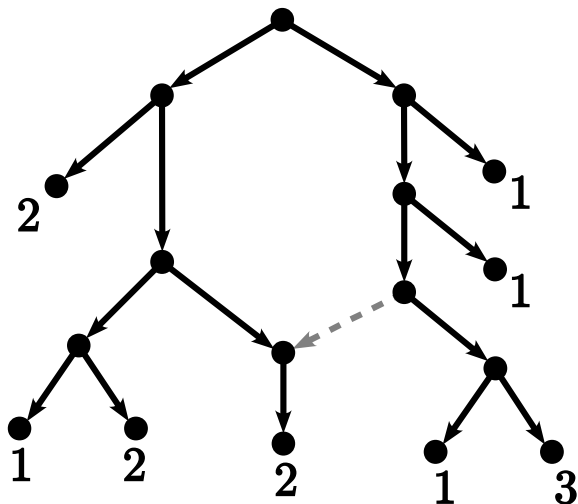
Possible assignment of states to internal vertices



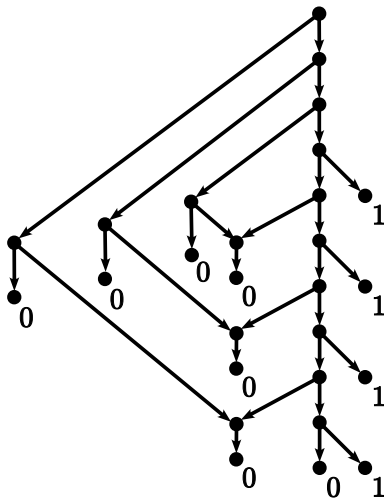
Hardwired Parsimony Score = 4



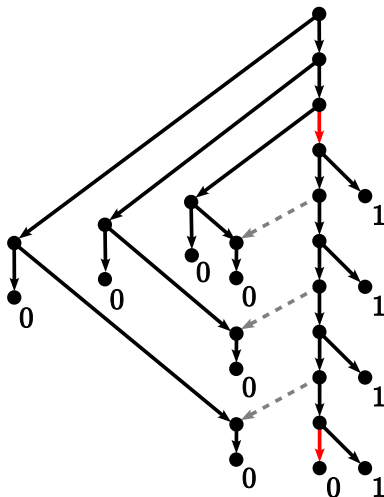
One of the two trees displayed by the network



Hardwired and Softwired scores can be arbitrarily far apart

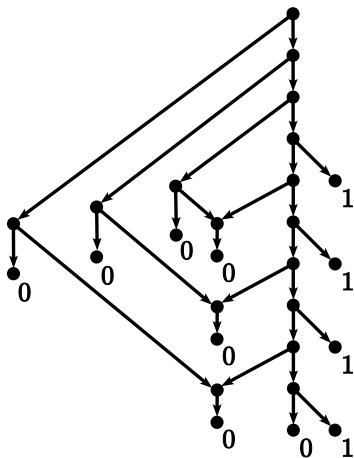


Hardwired and Softwired scores can be arbitrarily far apart

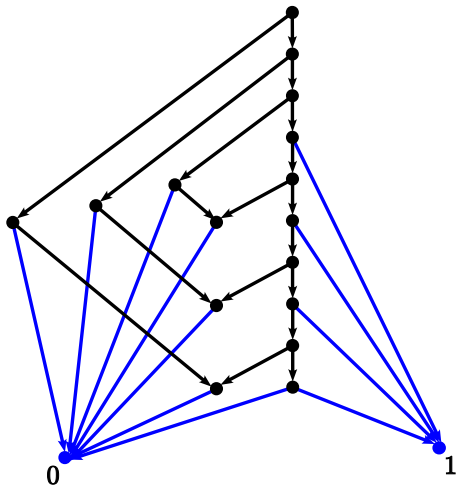


Softwired Parsimony Score = 2

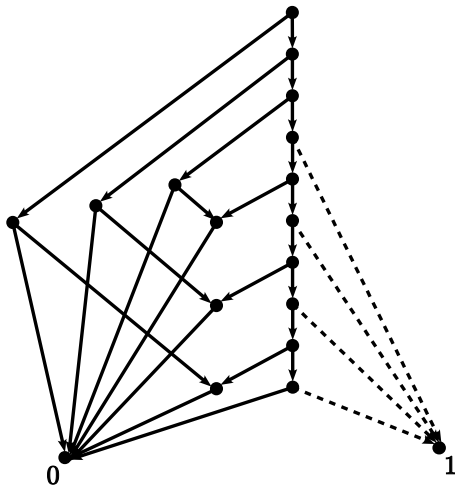
The **hardwired** parsimony score equals the size of a **minimum multiterminal cut** in the graph obtained by merging all leaves with the same state into a single vertex, and letting the merged vertices be the terminals.



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- The **hardwired** parsimony score can be computed in polynomial time when there are two states,

- The **hardwired** parsimony score can be computed in polynomial time when there are two states,
- and approximated well when there are more than two states.

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Theorem (Fischer, vl, Kelk & Scornavacca, 2015)

*For every constant $\epsilon > 0$ there is **no polynomial-time approximation algorithm** that approximates the **softwired** parsimony score to a factor $n^{1-\epsilon}$ for a network and a binary character, unless $P = NP$.*

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For every constant $\epsilon > 0$ there is **no polynomial-time approximation algorithm** that approximates the **softwired** parsimony score to a factor $n^{1-\epsilon}$ for a network and a binary character, unless $P = NP$.

Luckily, the softwired parsimony score can be computed efficiently when the hybridization number (or “level”) of the network is small.

Main open questions (from all parts)

- Is there is an FPT algorithm for HYBRIDIZATION NUMBER on multiple nonbinary trees and the hybridization number as only parameter.

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- Which classes of networks are encoded by trinetts?

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- Is there is an FPT algorithm for HYBRIDIZATION NUMBER on multiple nonbinary trees and the hybridization number as only parameter.
- Which classes of networks are encoded by trinetts?
- How can we search for a network with optimal softwired parsimony score, over all networks with hybridization number at most k ?

Thanks

- Mareike Fischer (Greifswald)
- Katharina Huber (Norwich)
- Steven Kelk (Maastricht)
- Nela Lekić (Maastricht)
- Simone Linz (Christchurch)
- Vincent Moulton (Norwich)
- Celine Scornavacca (Montpellier)
- Leen Stougie (Amsterdam)
- Taoyang Wu (Norwich)

