

Tree Edit Distance Cannot be Computed in Strongly Subcubic Time (unless APSP can)



Karl Bringmann,
Paweł Gawrychowski,
Shay Mozes,
Oren Weimann

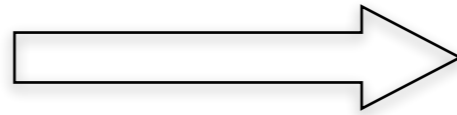


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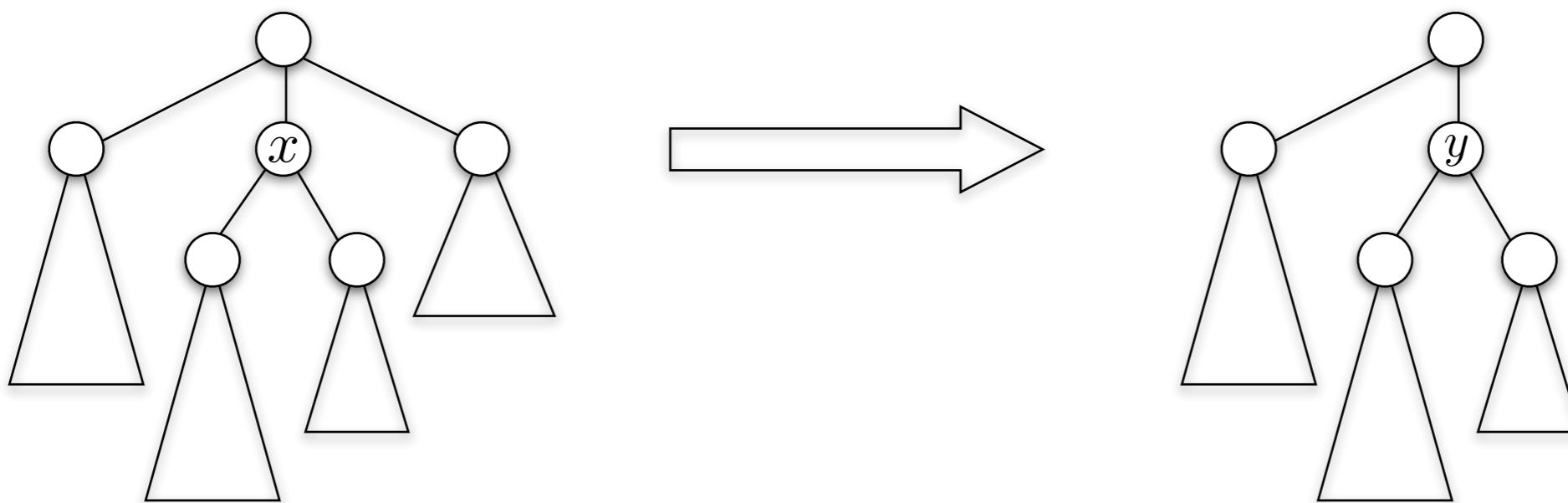
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Minimum edits to transform one tree into the other



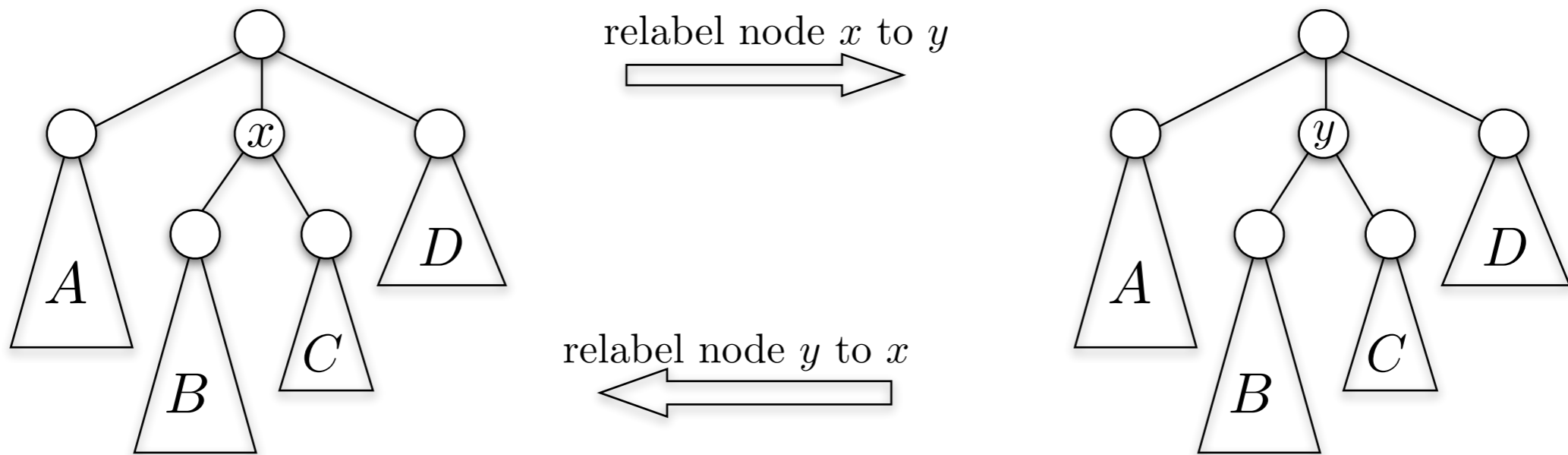
Tree Edit Distance Cannot be Computed in Strongly Subcubic Time (unless APSP can)

Minimum edits to transform one **tree** into the other
rooted, ordered trees with node labels



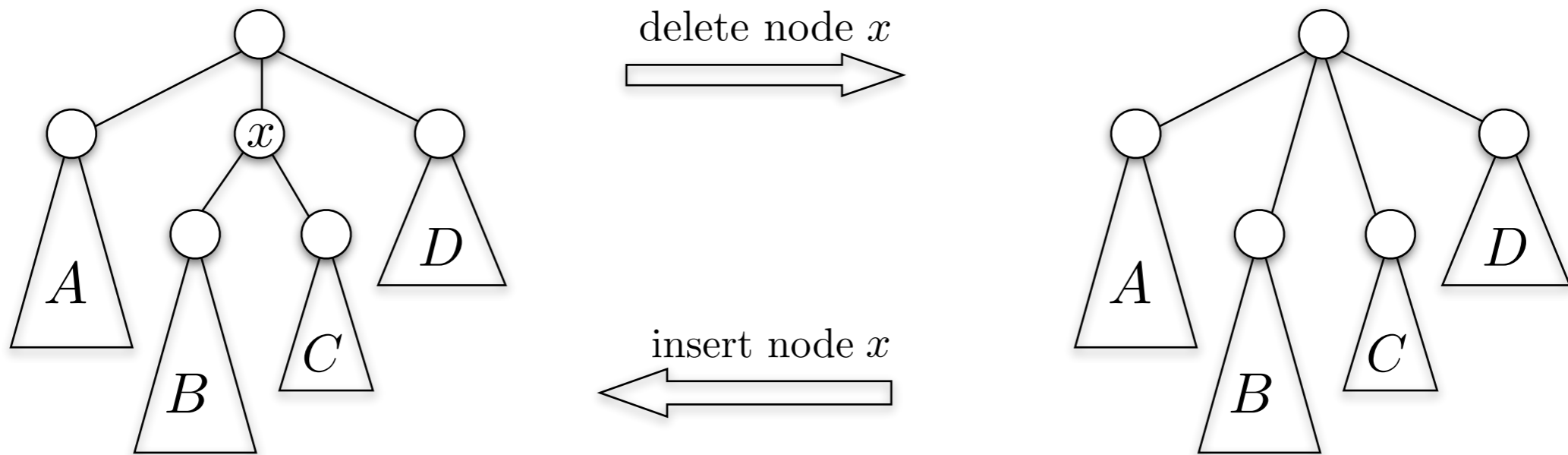
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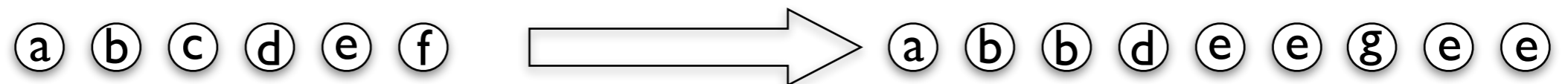
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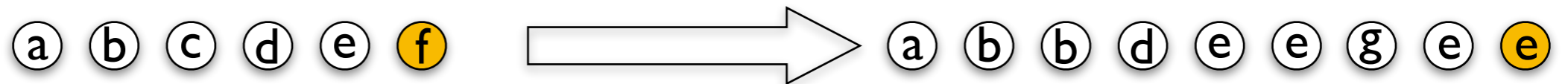
Tree Edit Distance Cannot be Computed in Strongly Subcubic Time (unless APSP can)

Minimum edits to transform one **string** into the other



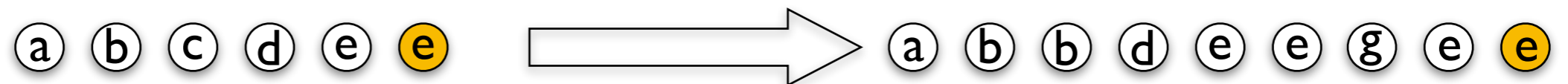
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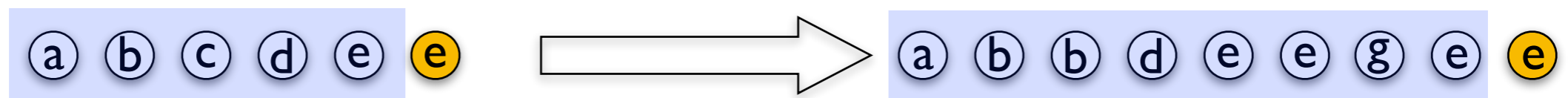
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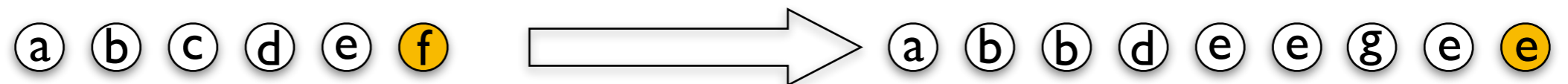
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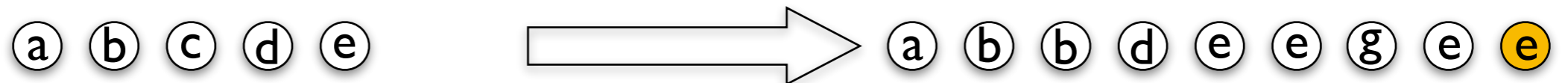
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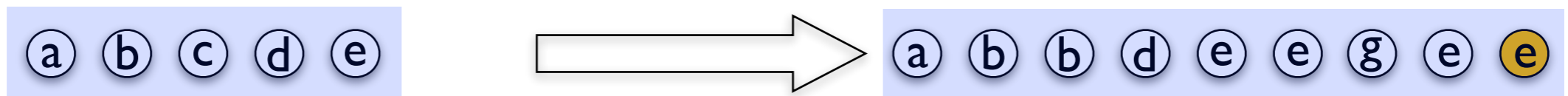
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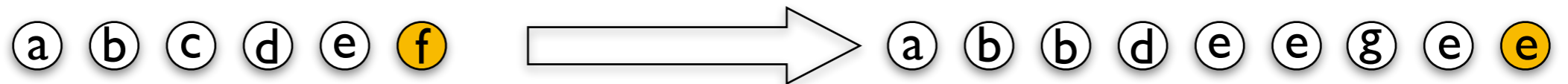
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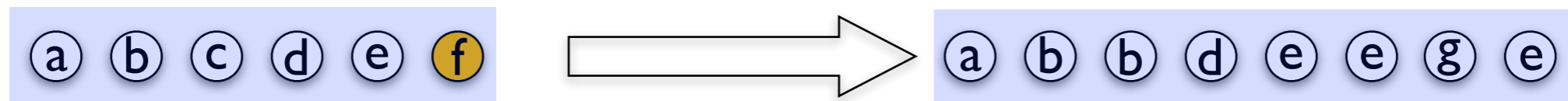
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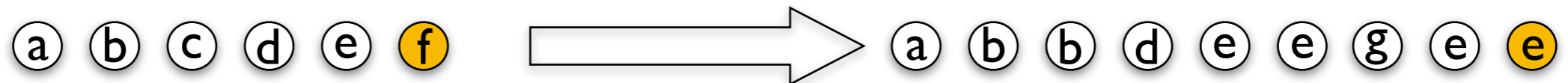
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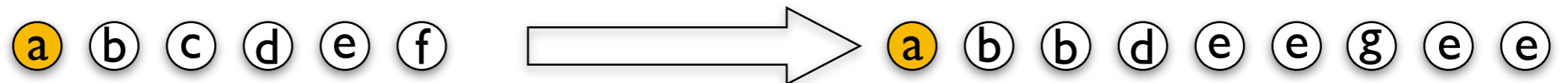
$O(n^2)$ time



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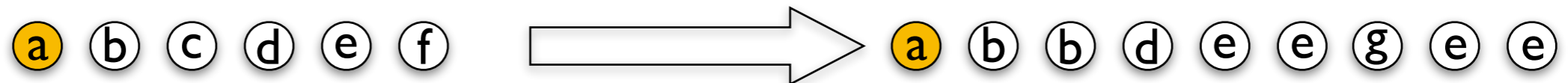


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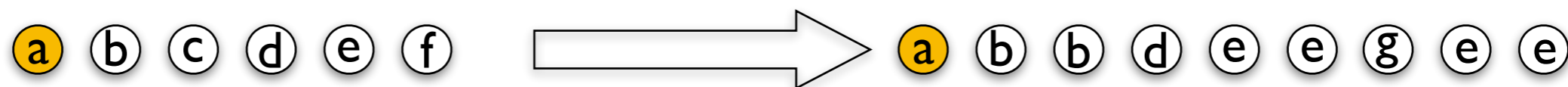
$O(n^4)$ time



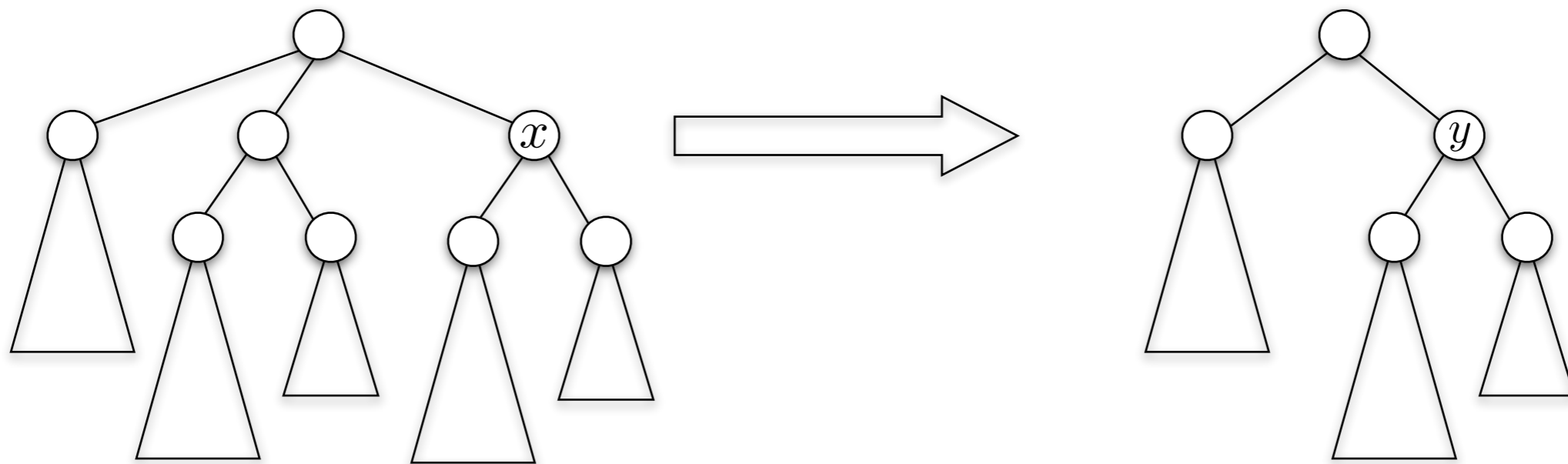
Tree Edit Distance Cannot be Computed in Strongly Subcubic Time (unless APSP can)

String Edit Distance Cannot be Computed in Strongly Subquadratic Time (unless SETH is false)

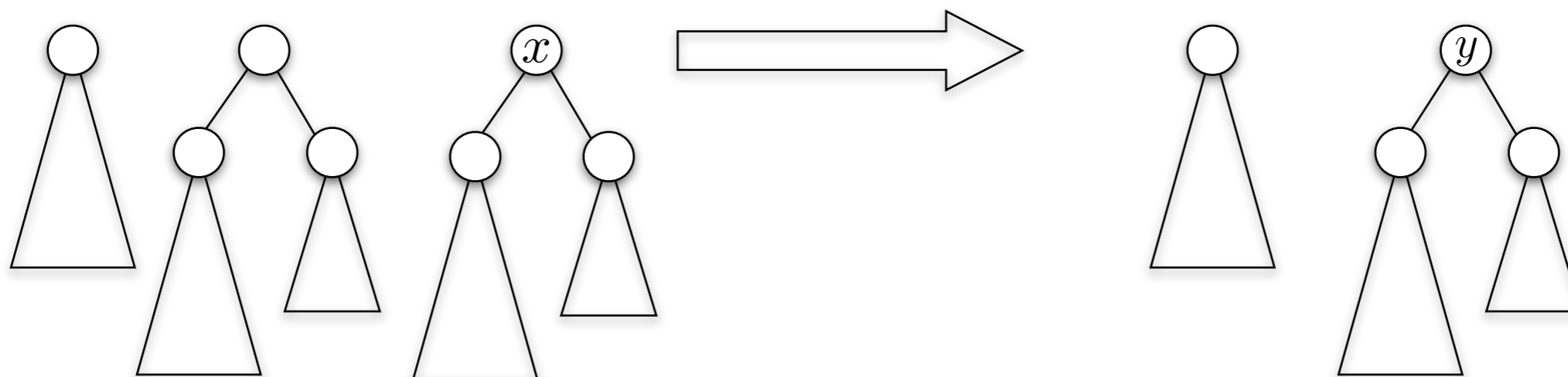
[Backurs, Indyk, STOC'15]



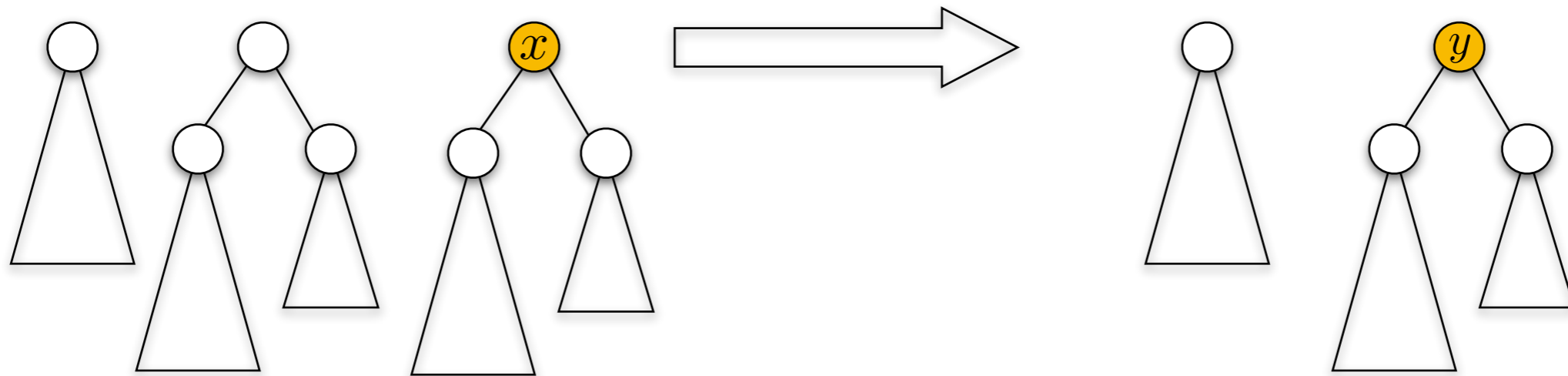
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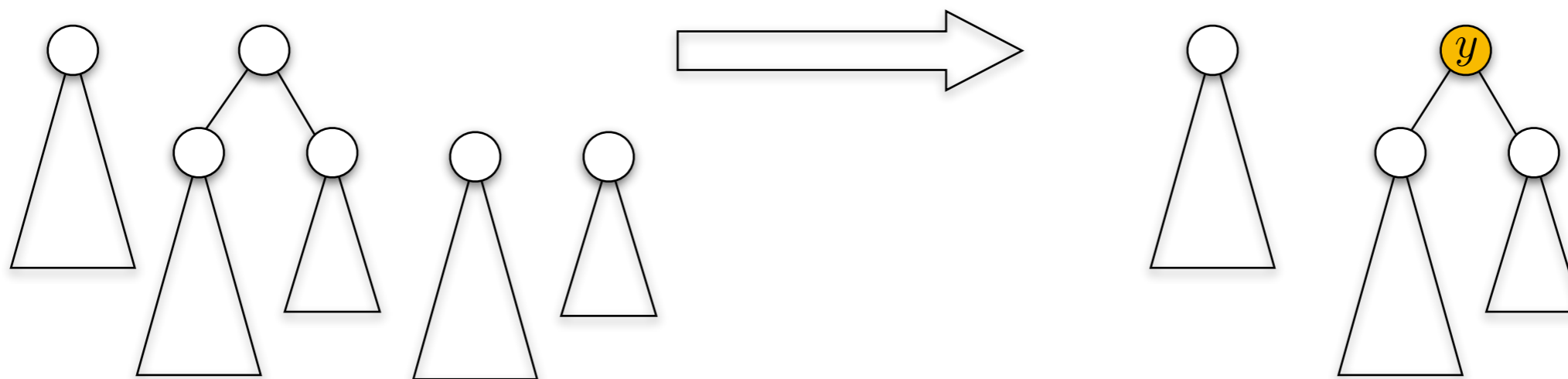
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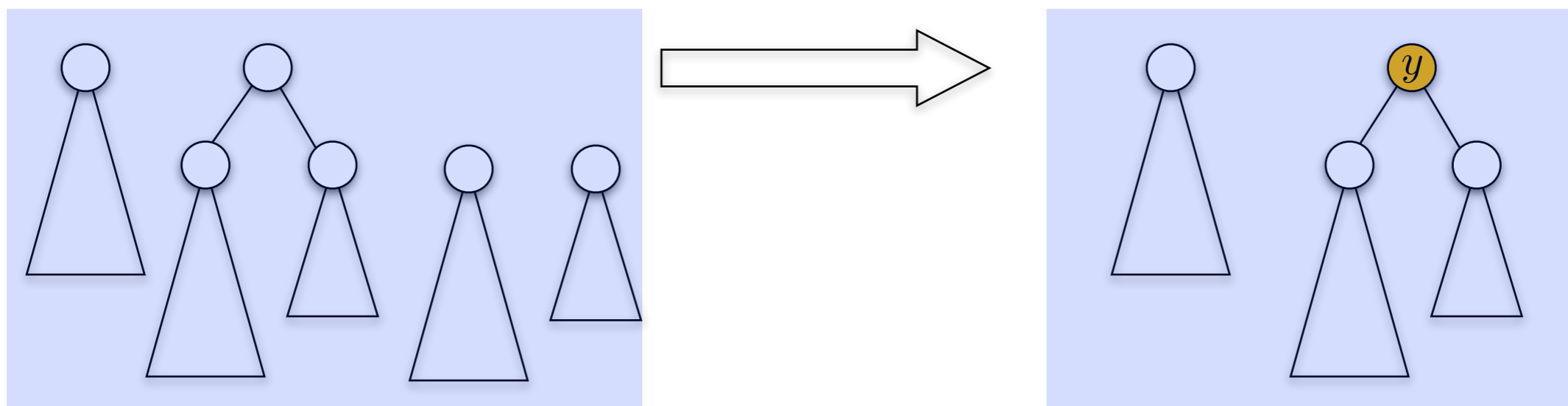
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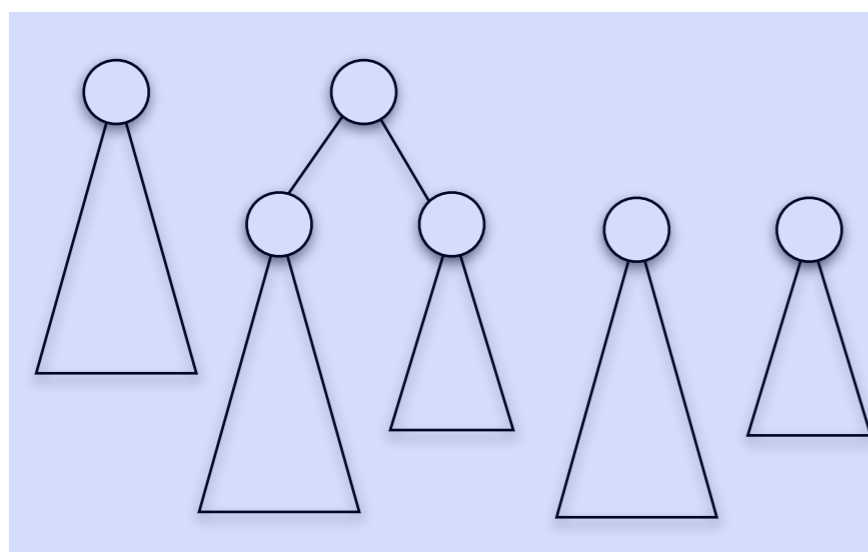
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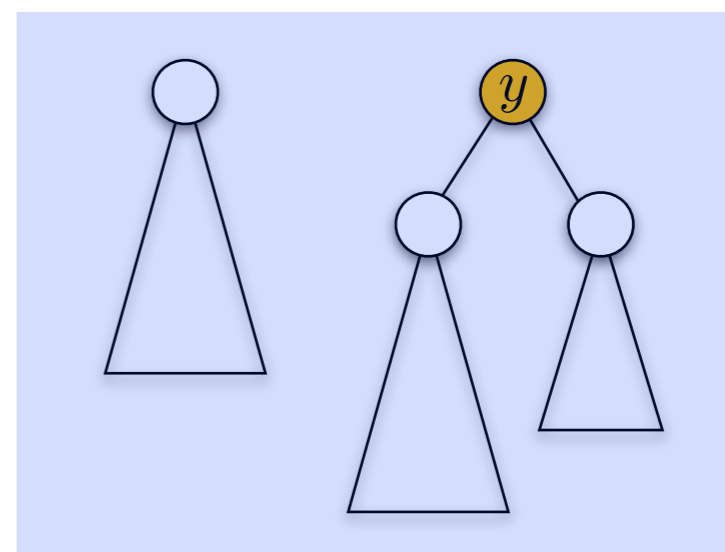
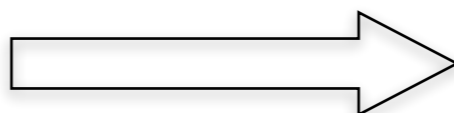
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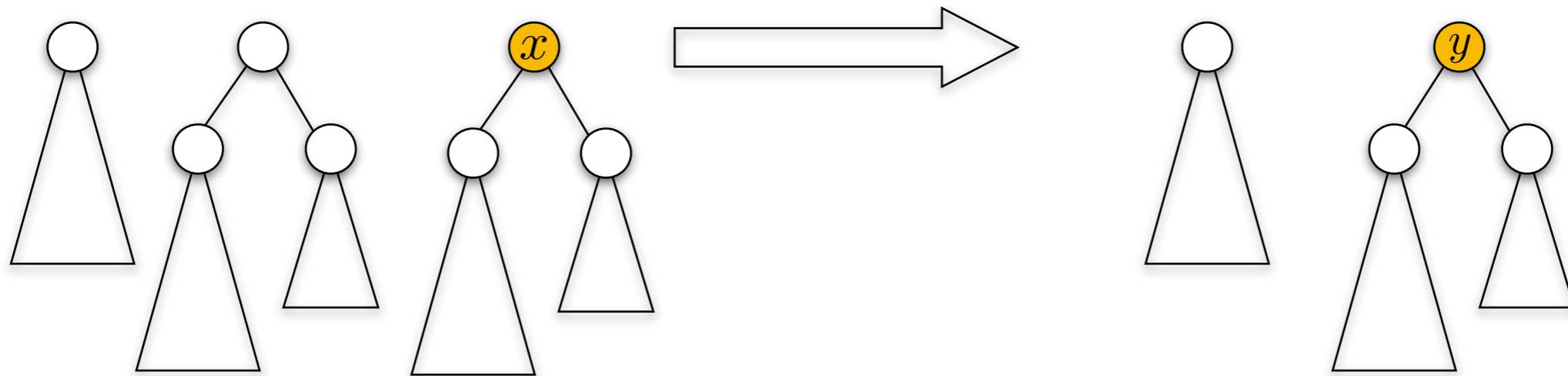


prefix in postorder traversal

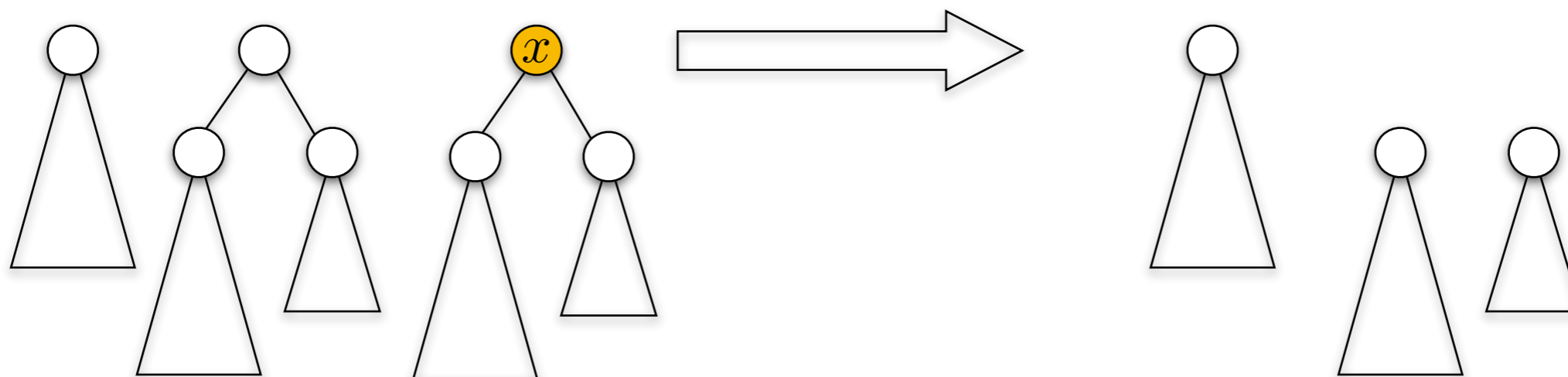


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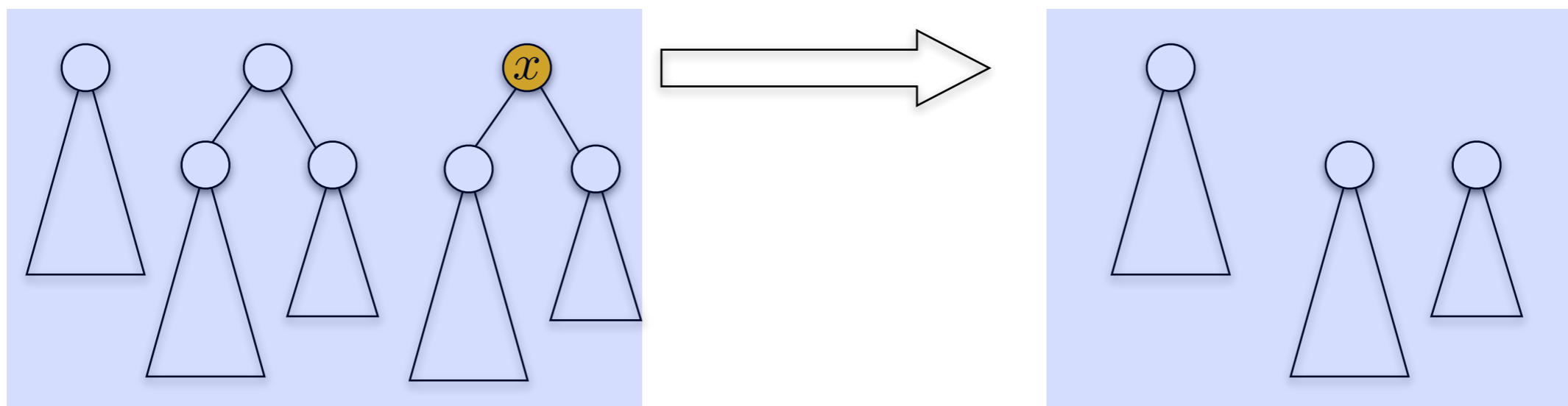
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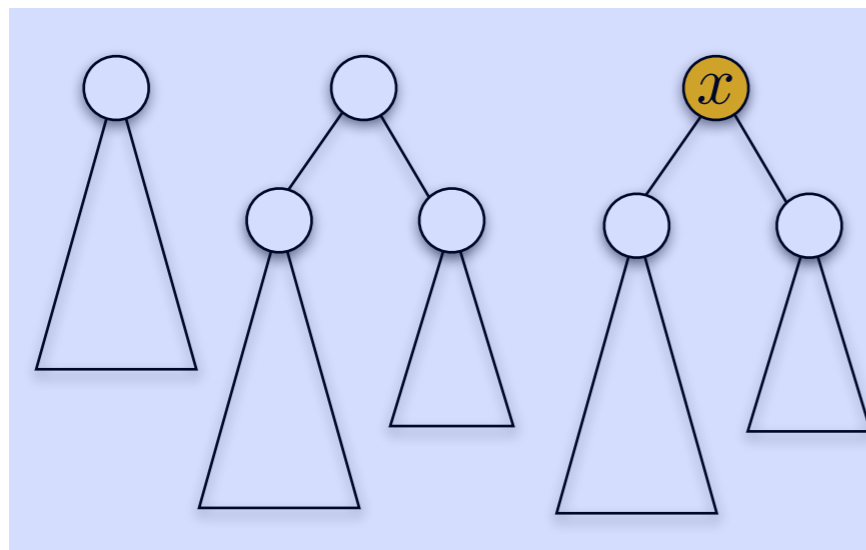
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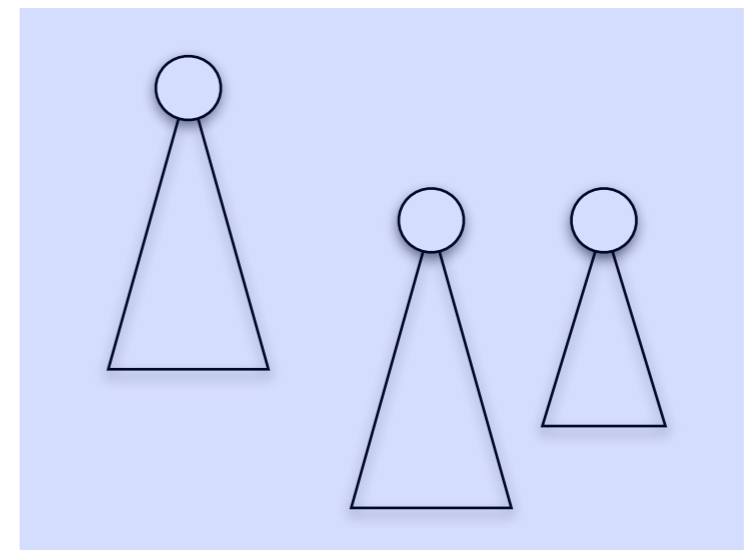
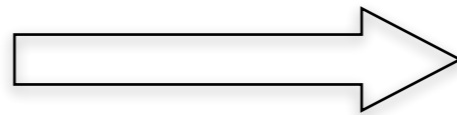
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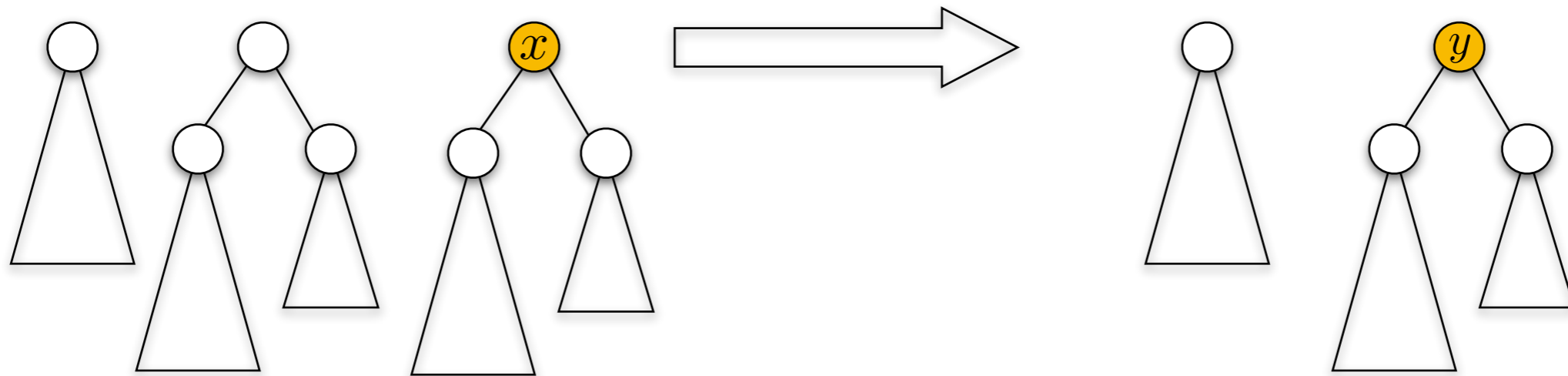


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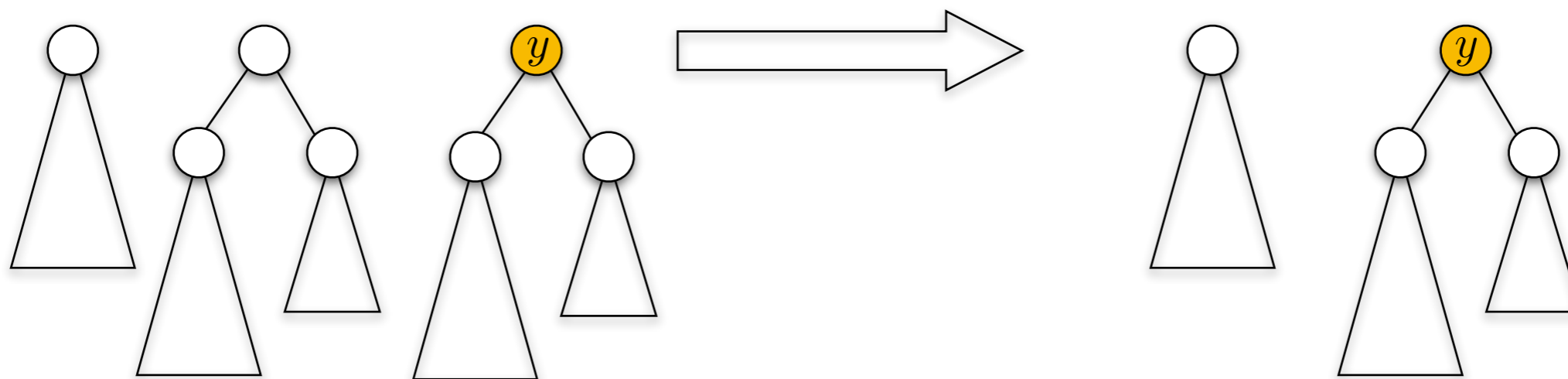


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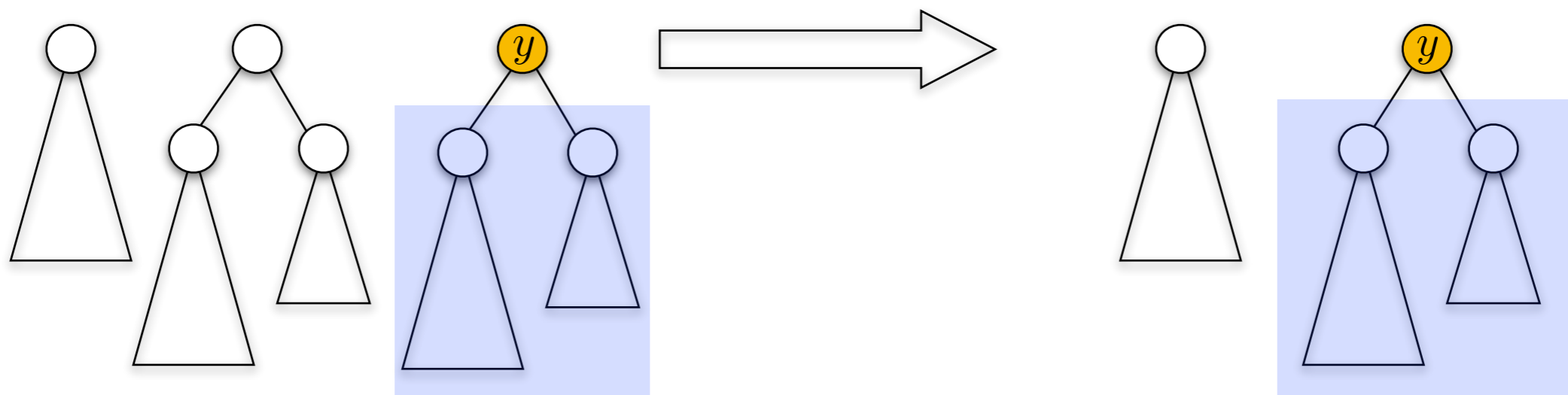
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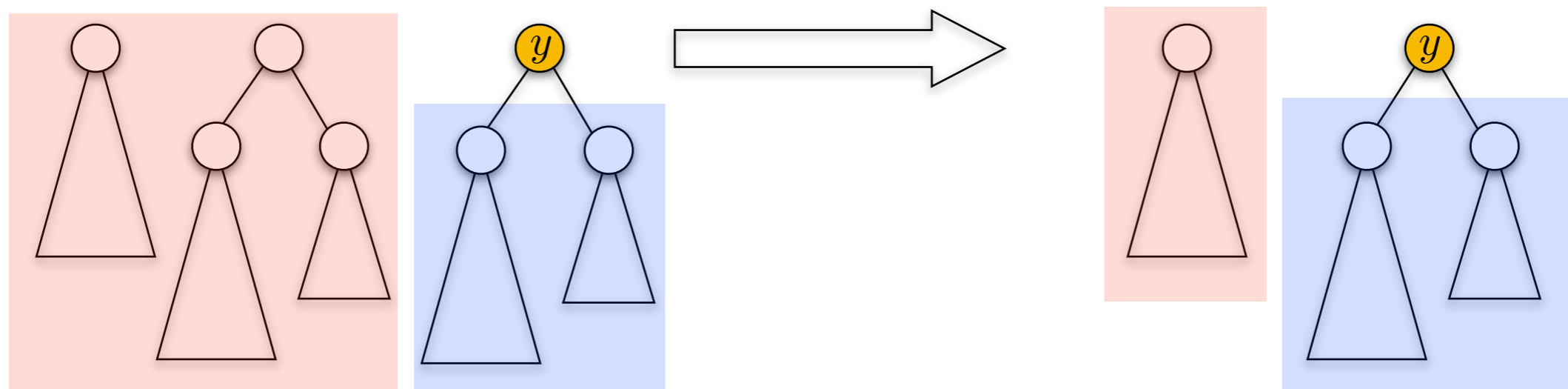
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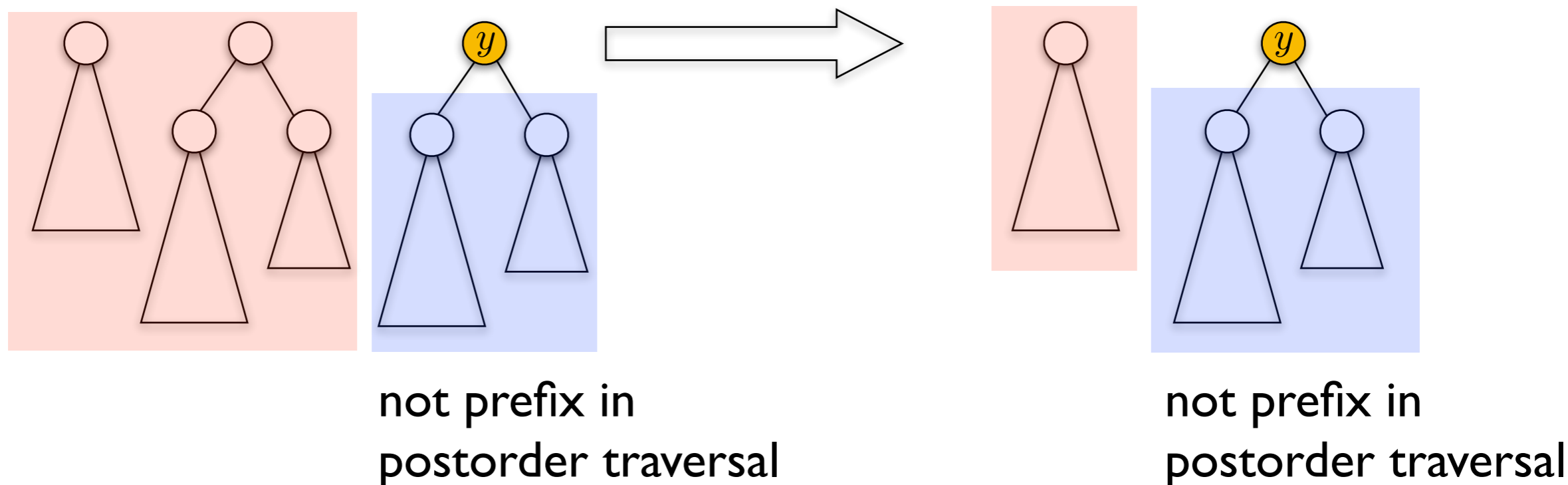
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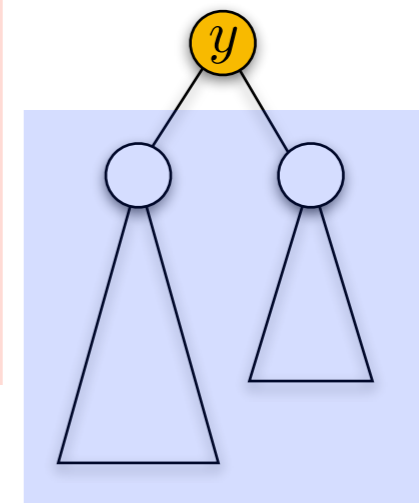
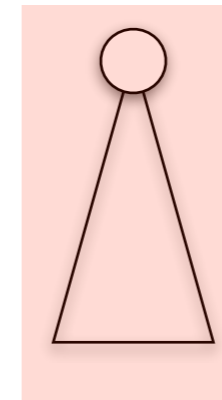
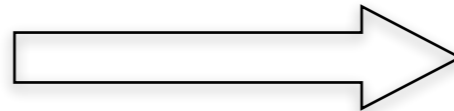
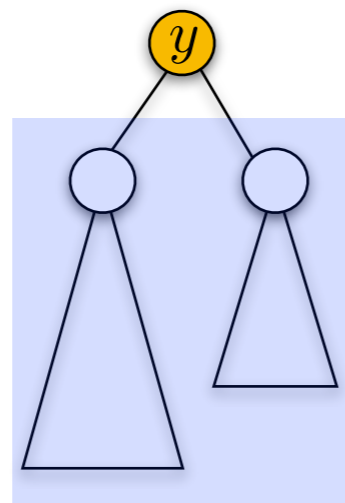
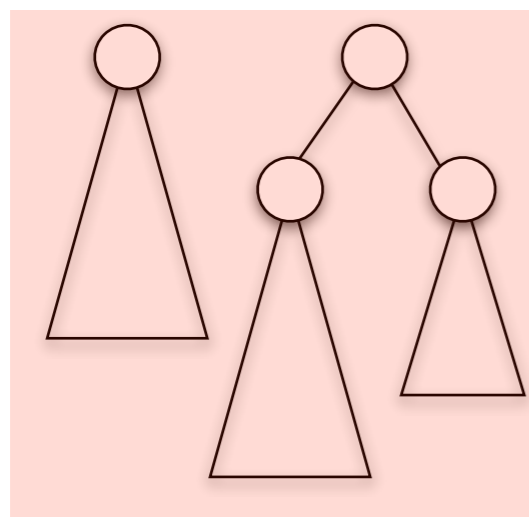
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$O(n^4)$ time

[Shasha Zhang 1989]



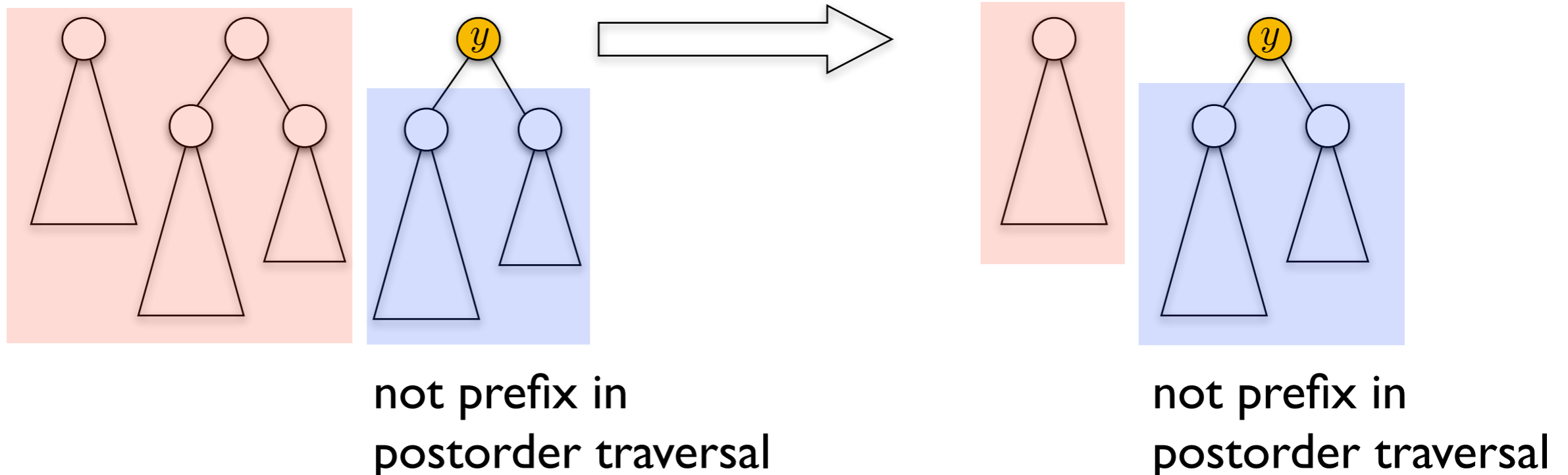
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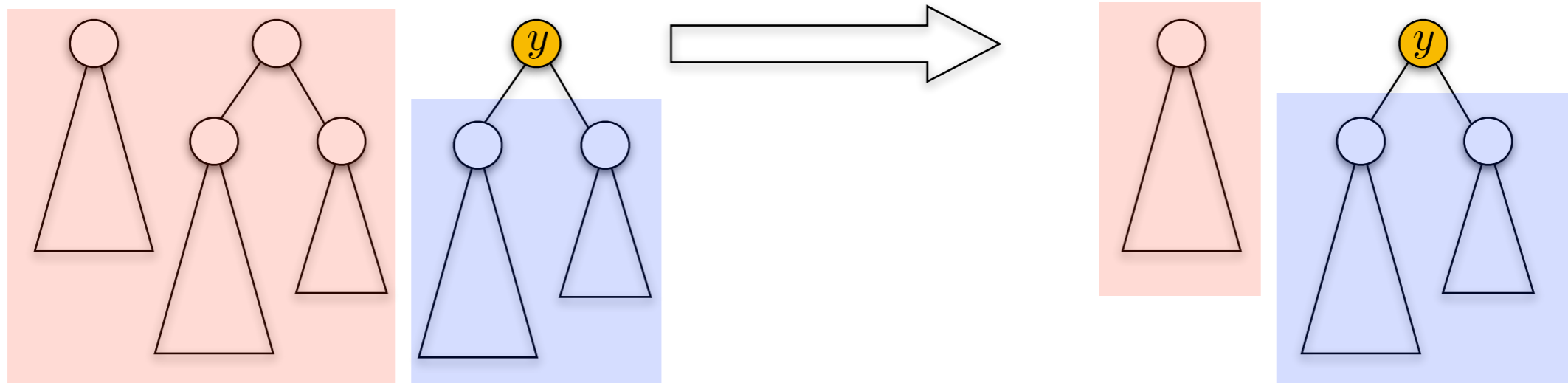


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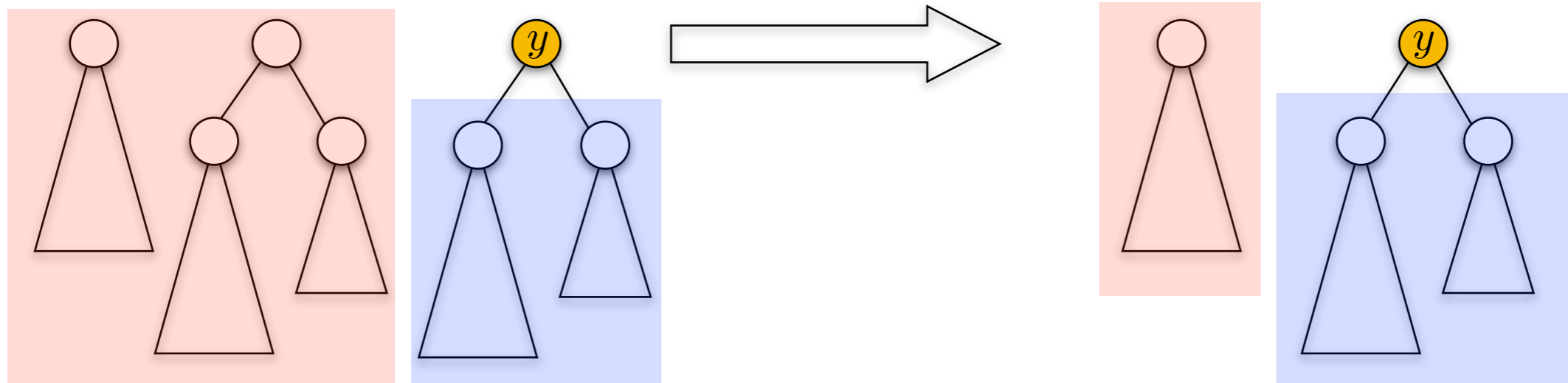
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Conjecture (APSP):

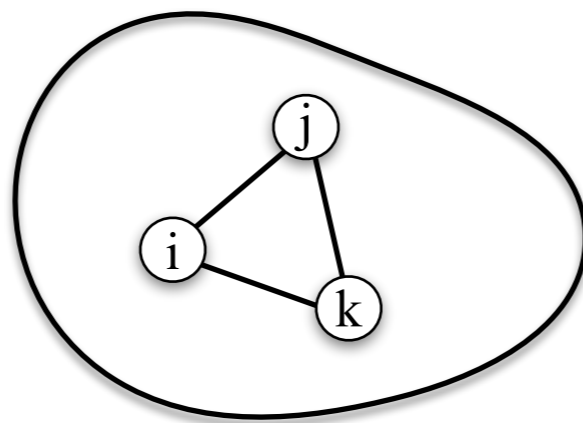
For any $\varepsilon > 0$ there exists $c > 0$, such that All Pairs Shortest Paths on n node graphs with edge weights in $\{1, \dots, n^c\}$ cannot be solved in $O(n^{3-\varepsilon})$ time.

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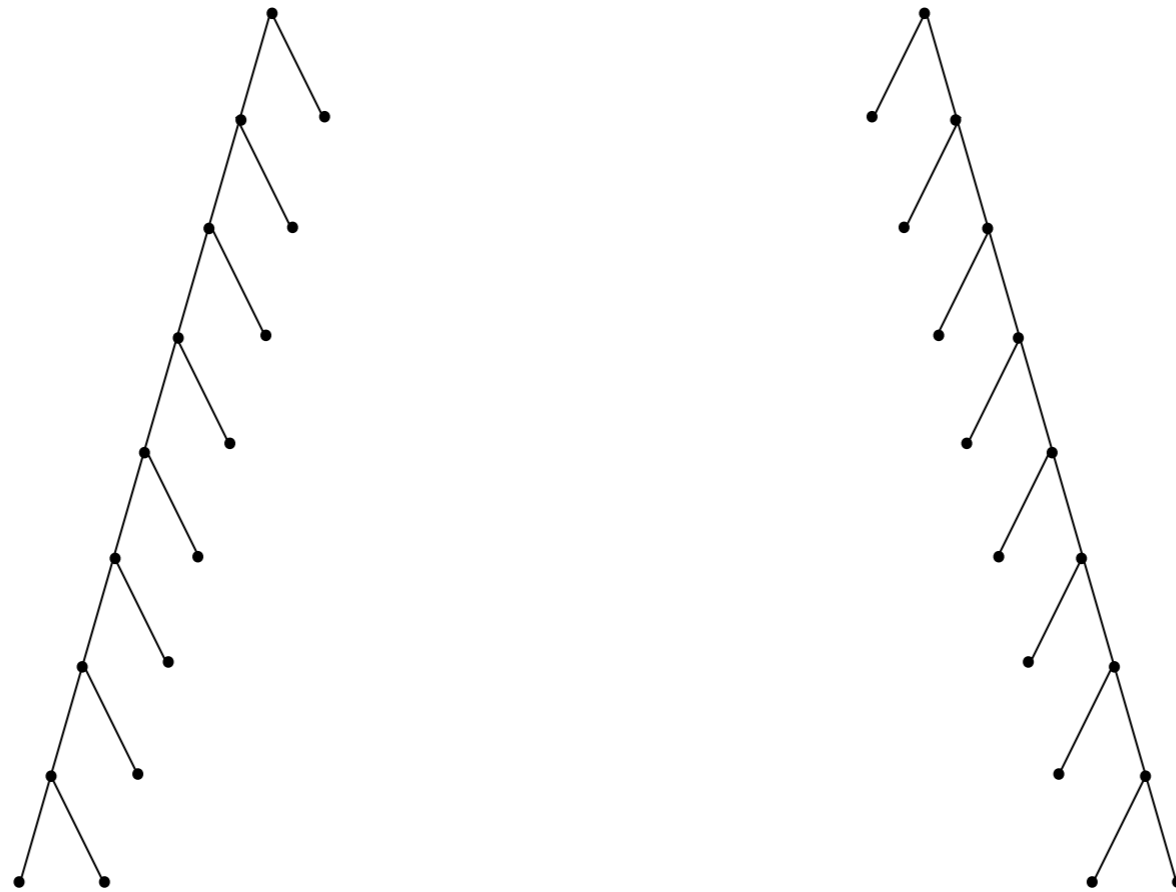
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Equivalent to negative triangle detection [Vassilevska-Williams, Williams 2010]



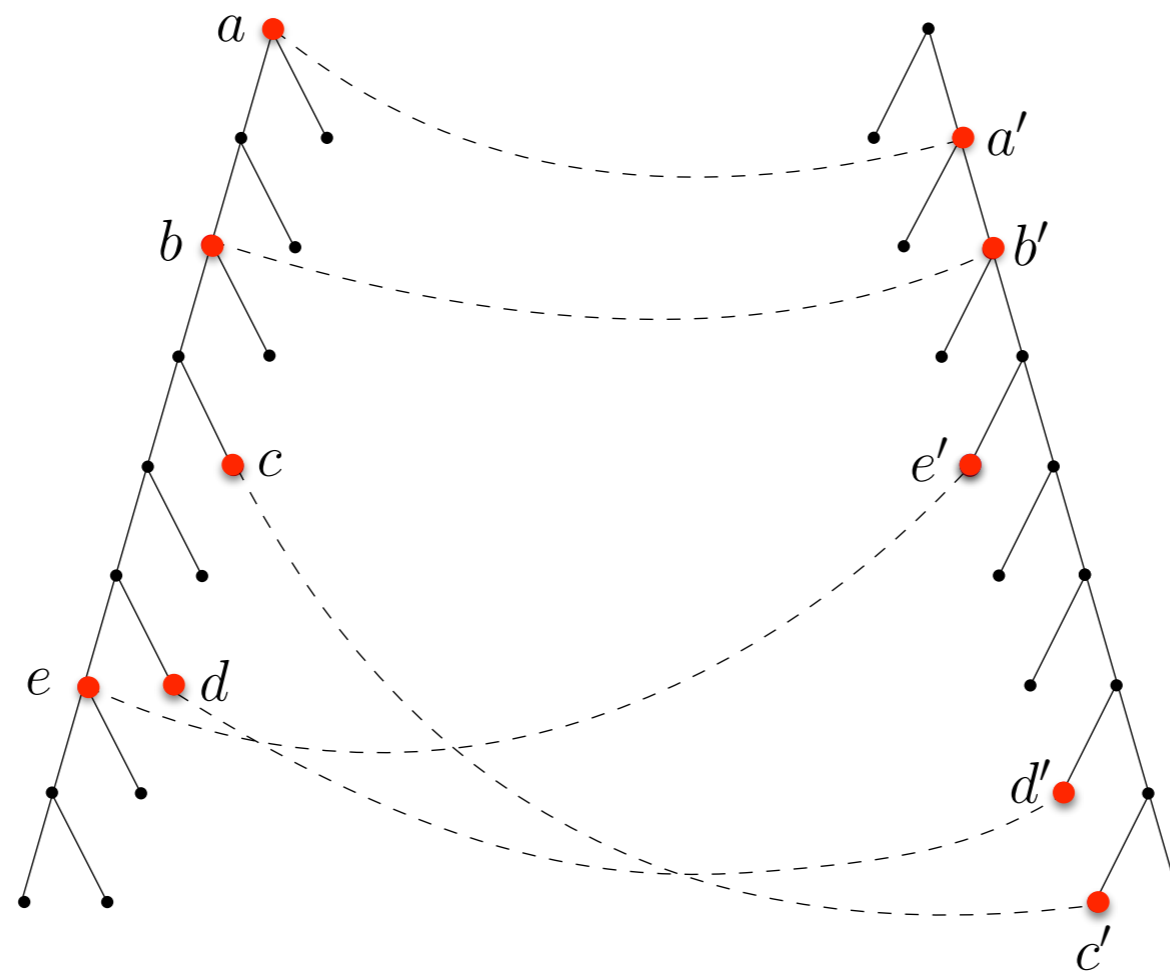
$$w(i,j)+w(j,k)+w(k,i) < 0$$

The Hard Instance of TED



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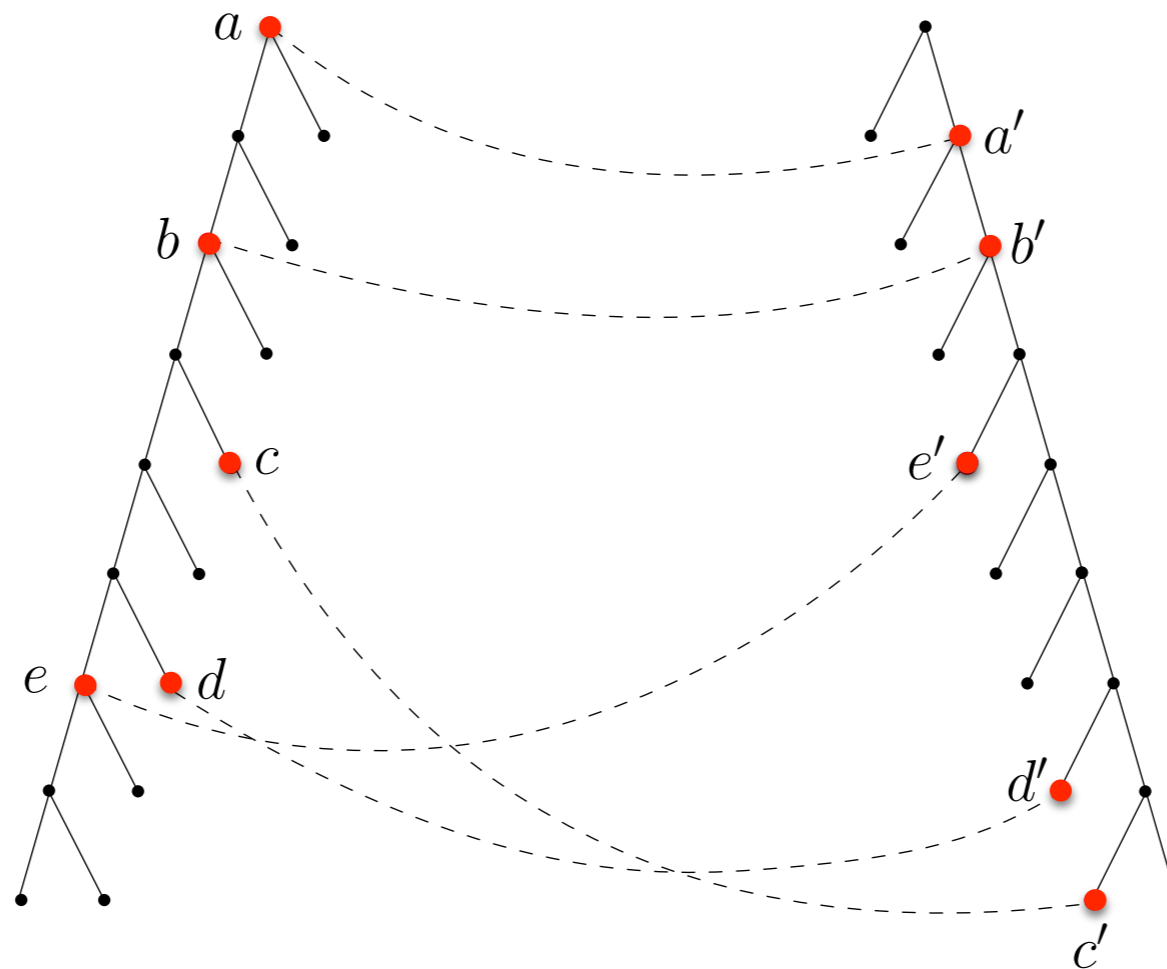
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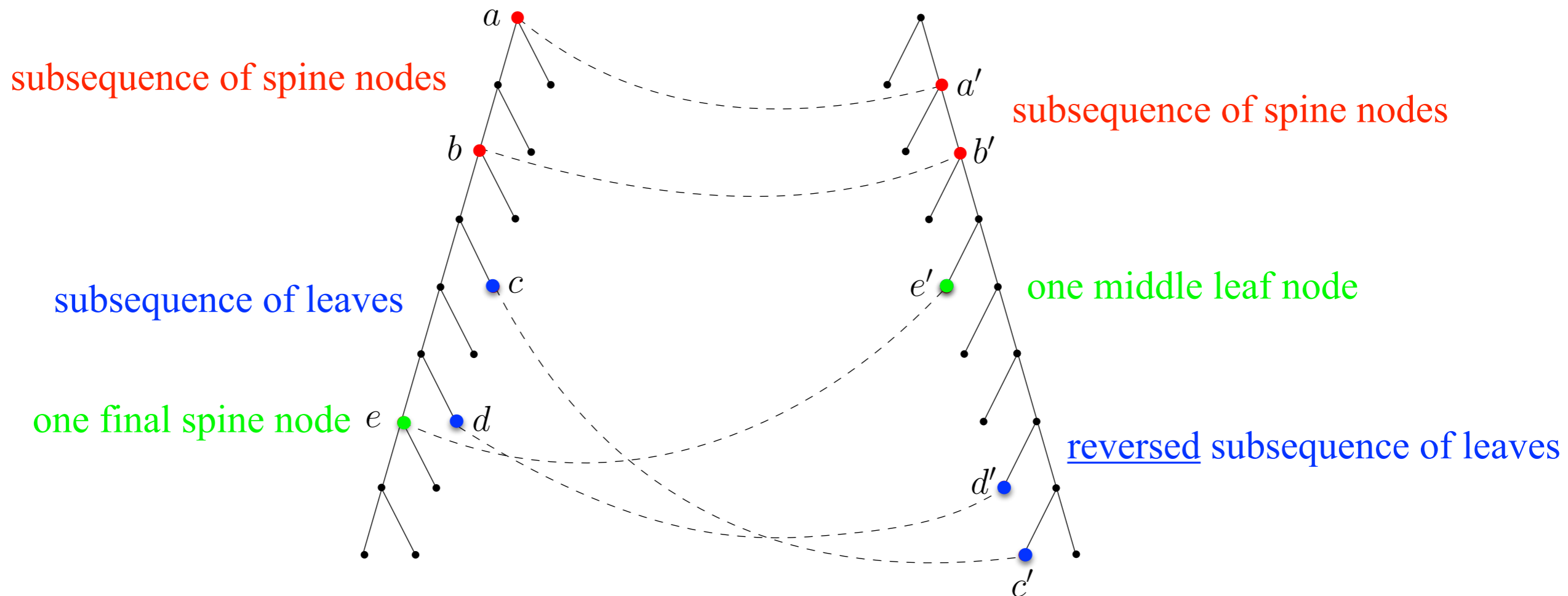
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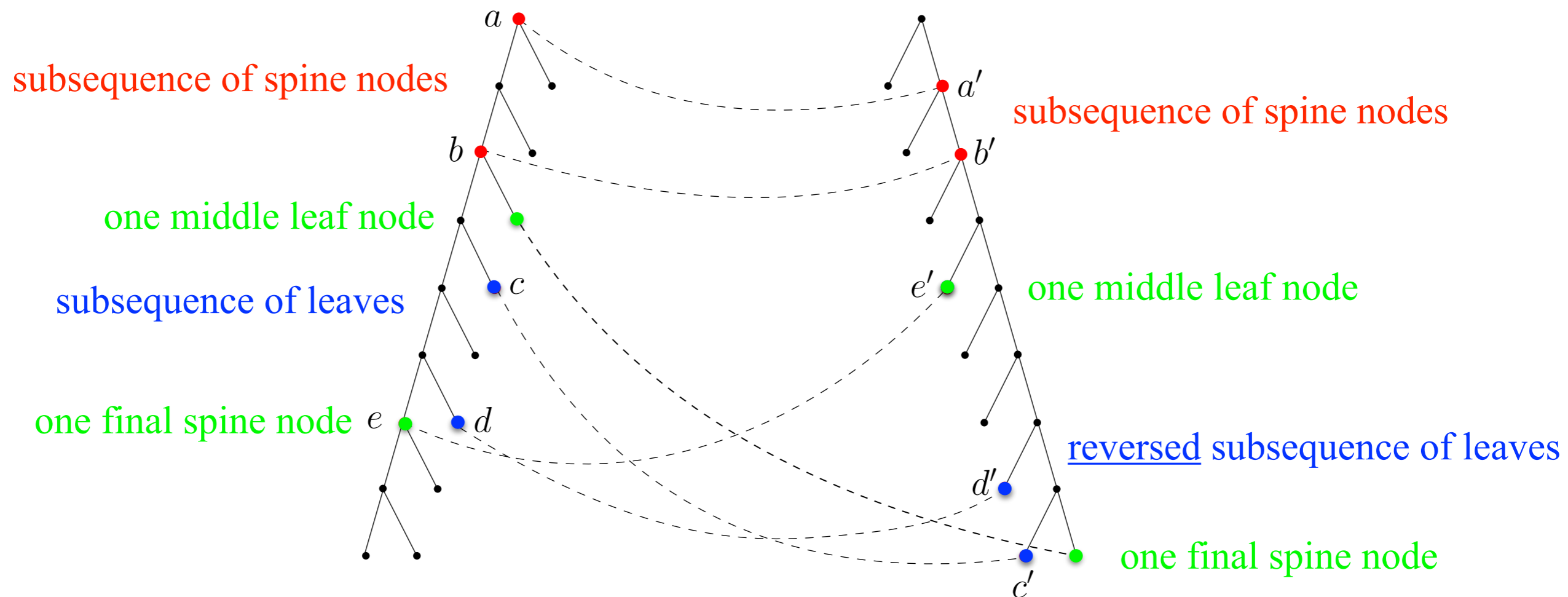
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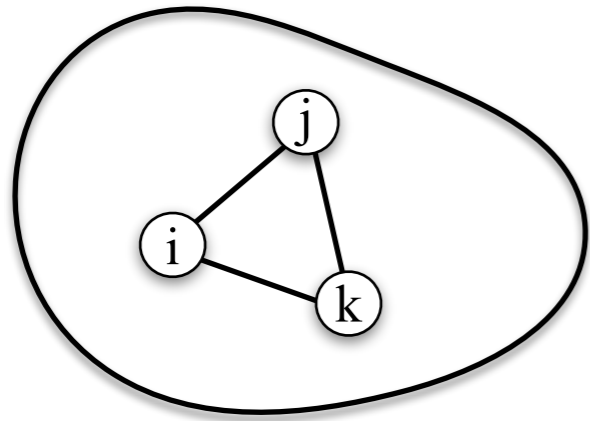


APSP



TED

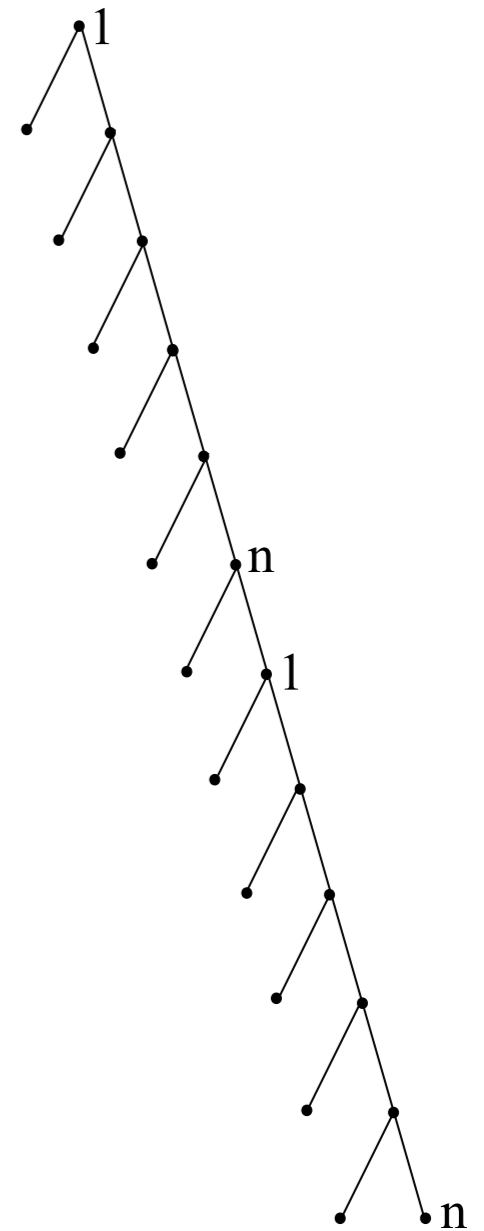
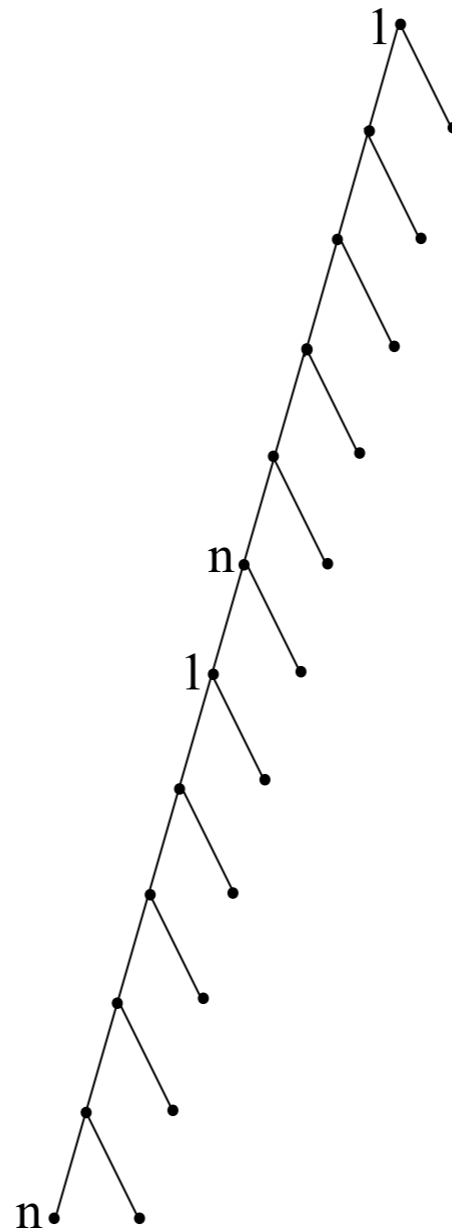
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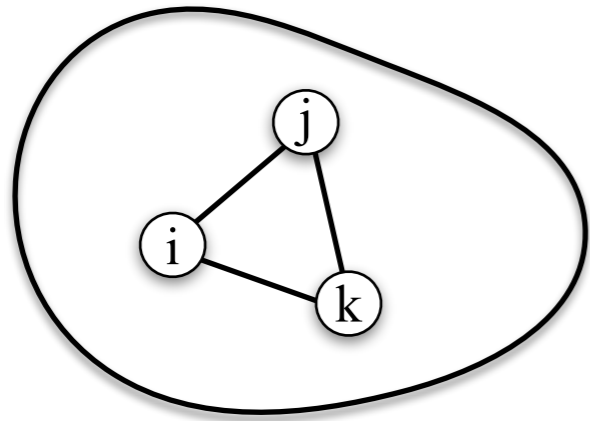
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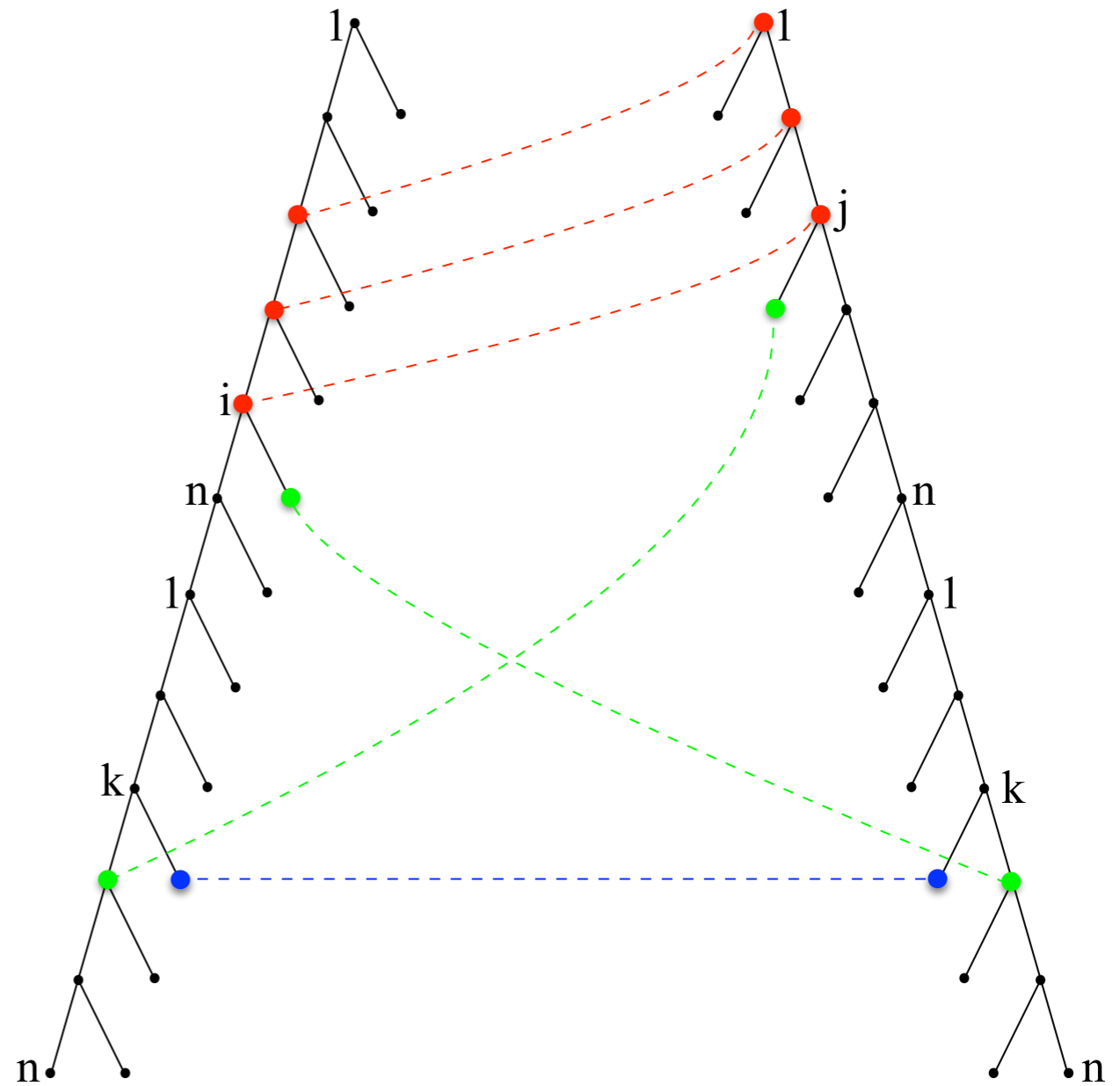
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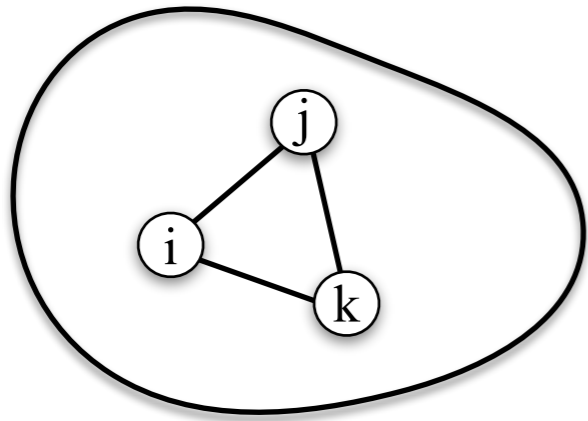
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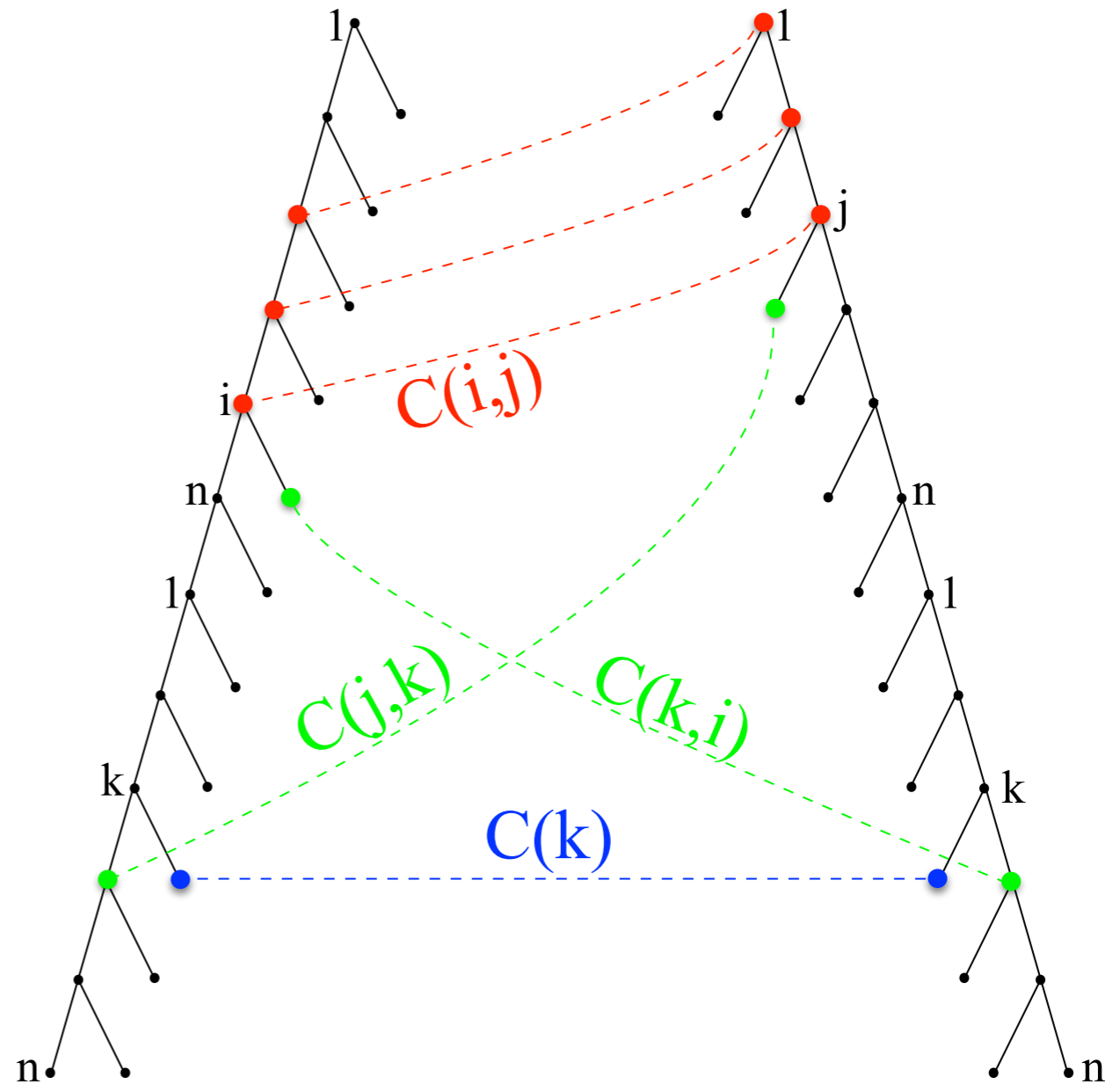
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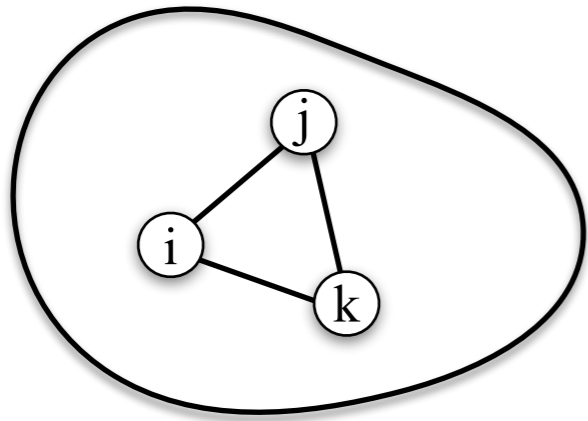
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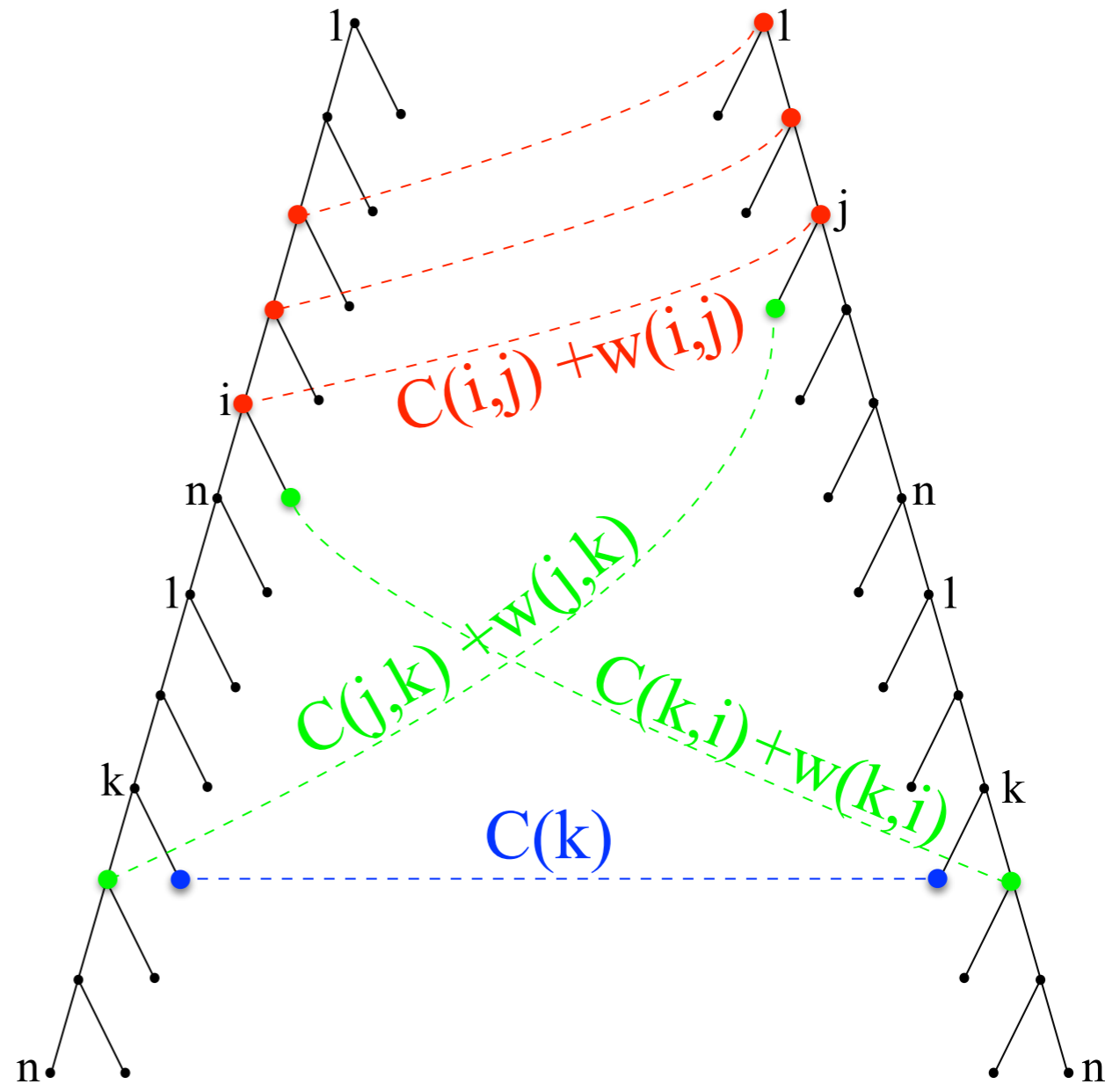
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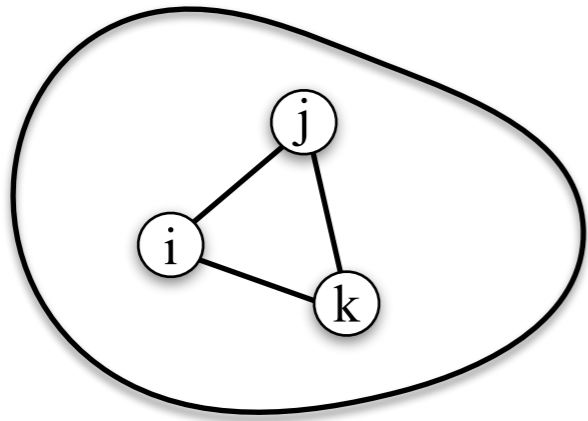
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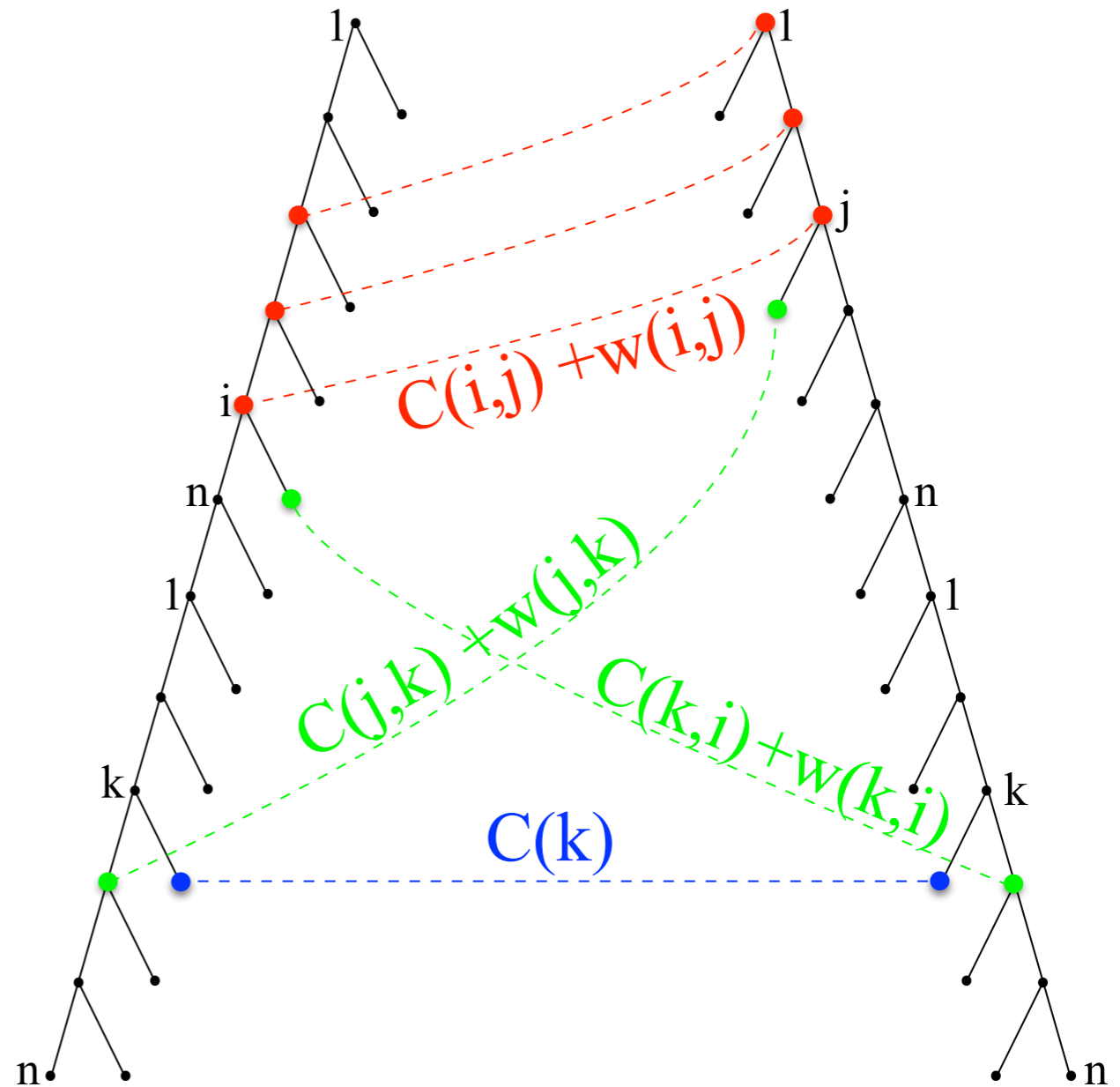


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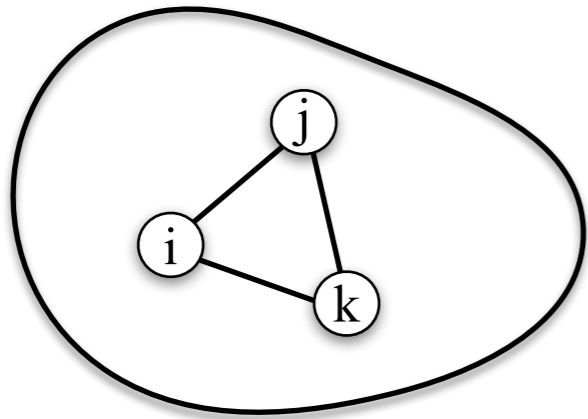


TED

Large alphabet: $|\Sigma| = \Theta(n)$



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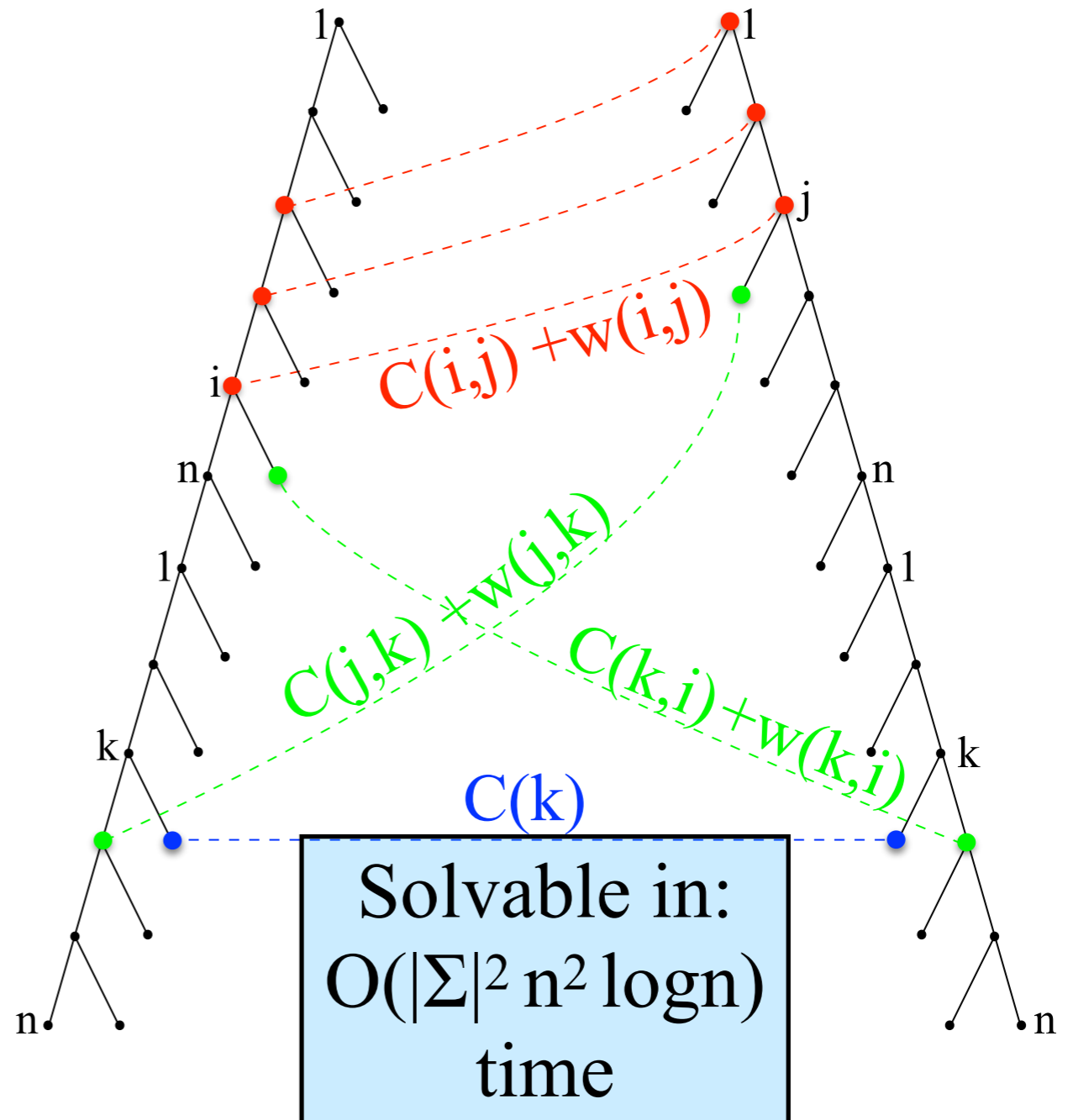


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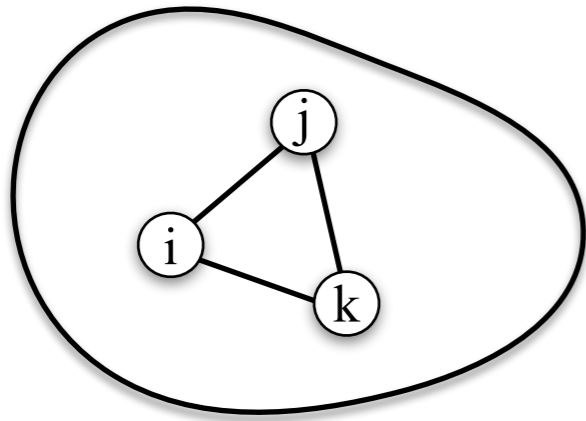


APSP



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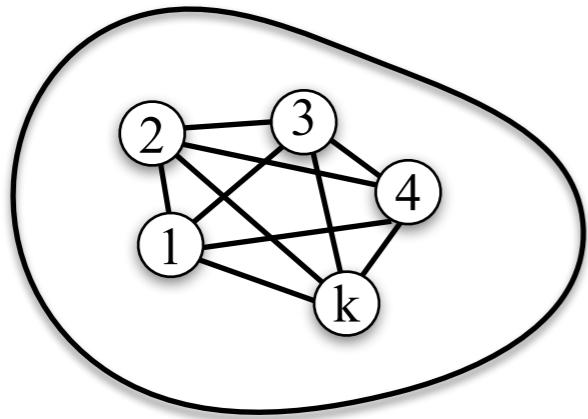
Small alphabet: $|\Sigma| = O(1)$



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Max-weight k-Clique → TED

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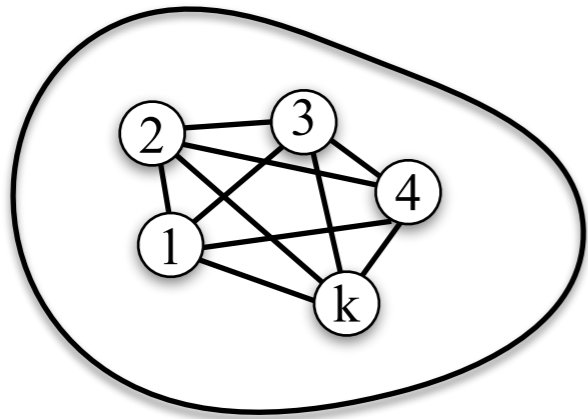


Conjecture (Max-weight k-Clique):

For any $\varepsilon > 0$ there exists $c > 0$, such that for any $k \geq 3$ finding a maximum weight k-Clique in graphs with edge weights in $\{1, \dots, n^{ck}\}$ cannot be solved in $O(n^{k(1-\varepsilon)})$ time.

Max-weight k-Clique → TED

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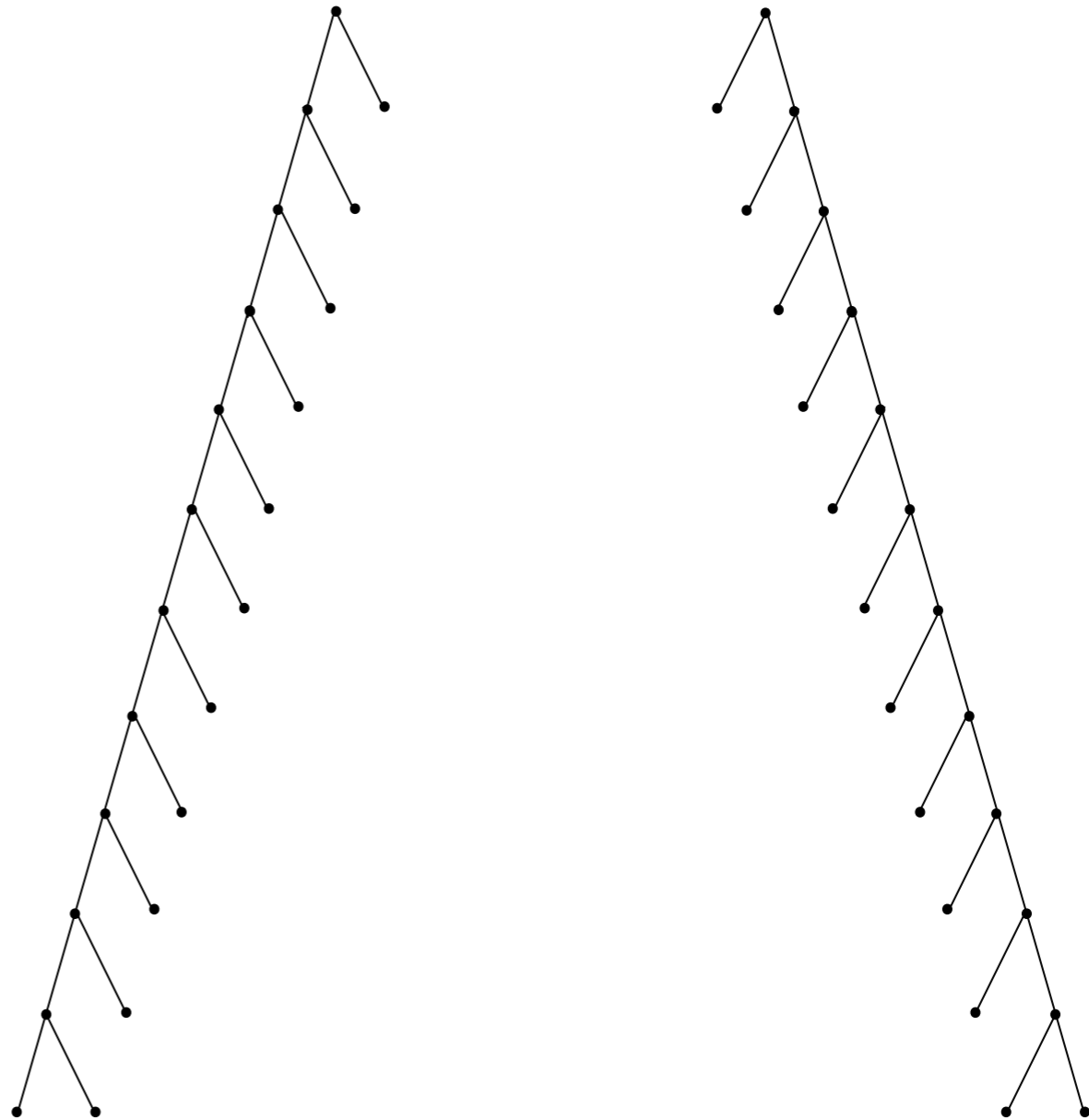
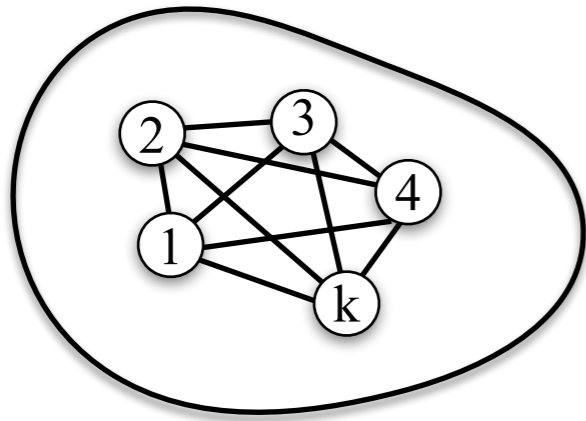
For any $\varepsilon > 0$ there exists $c > 0$, such that for any $k \geq 3$ finding a maximum weight k-Clique in graphs with edge weights in $\{1, \dots, n^{ck}\}$ cannot be solved in $O(n^{k(1-\varepsilon)})$ time.

Max-weight k-Clique



TED

Small alphabet: $|\Sigma| = O(1)$

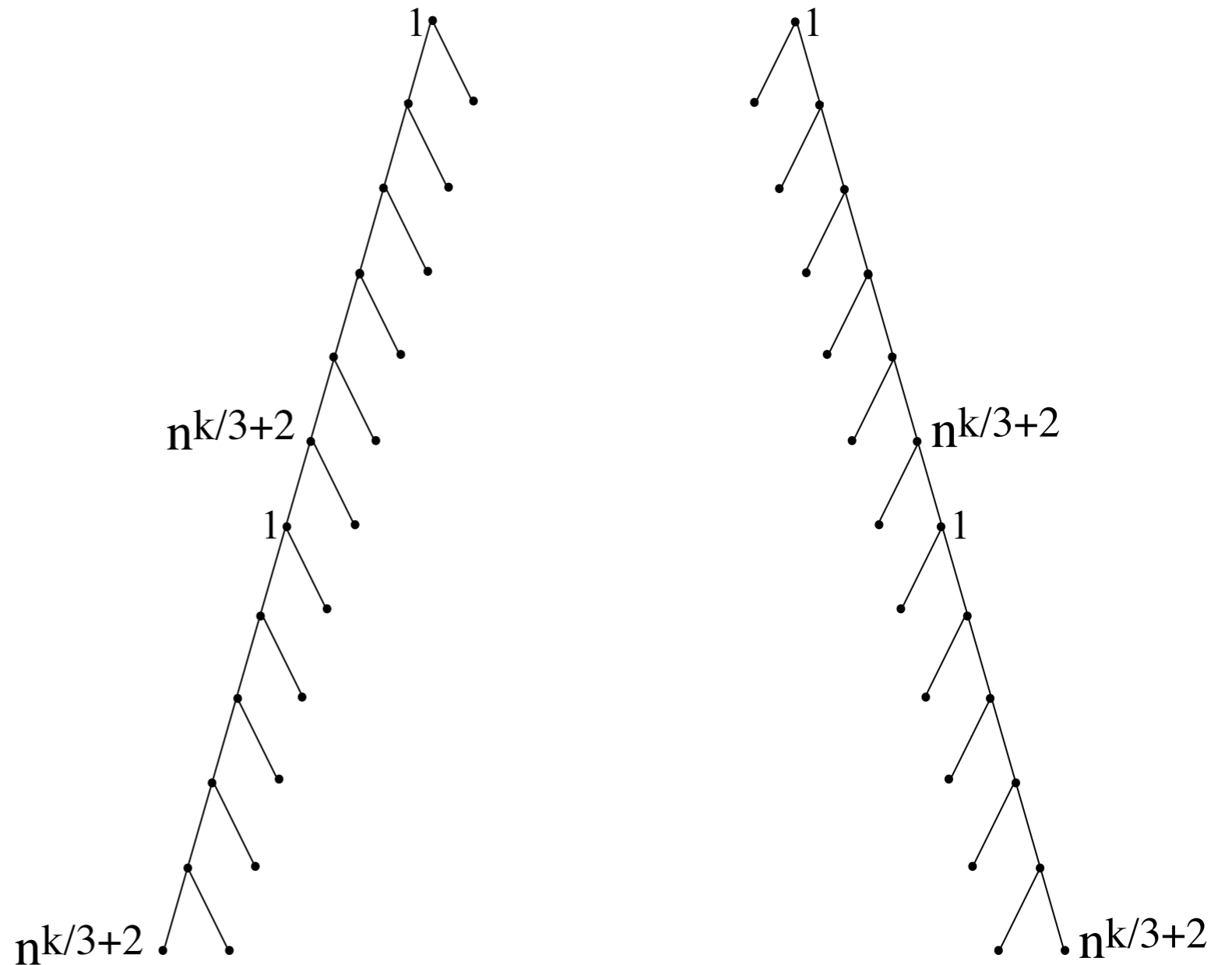
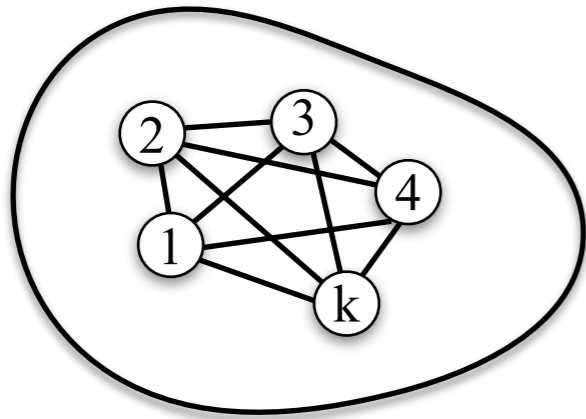


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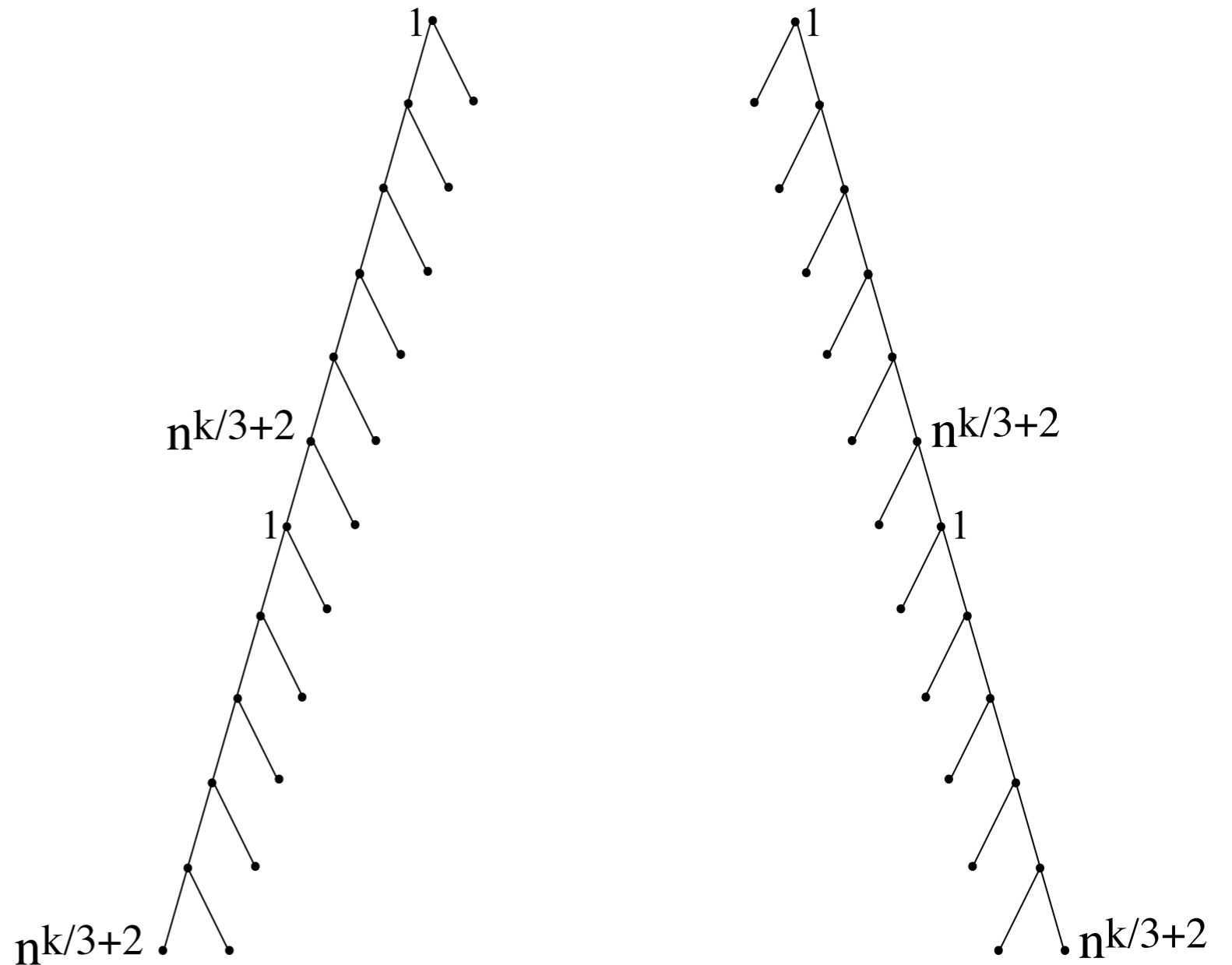
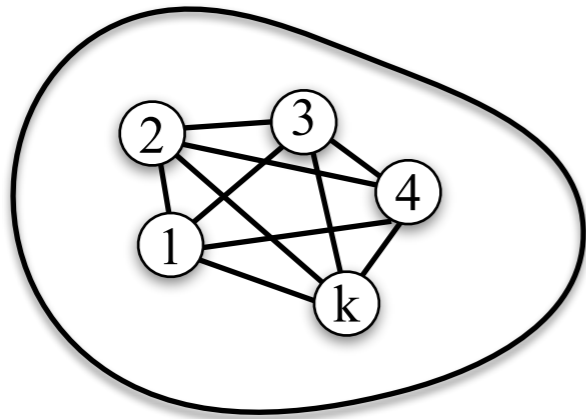


Max-weight k-Clique



TED

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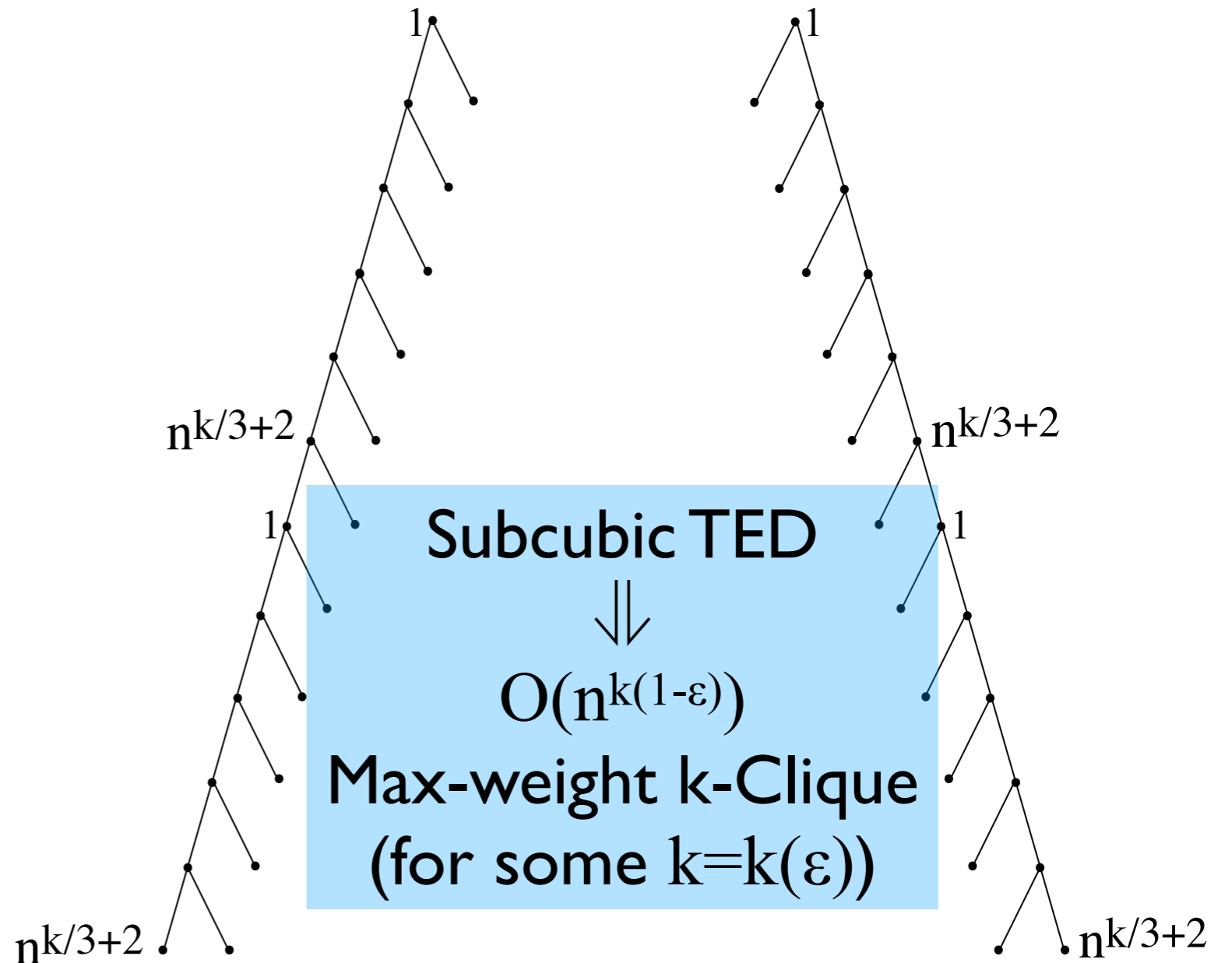
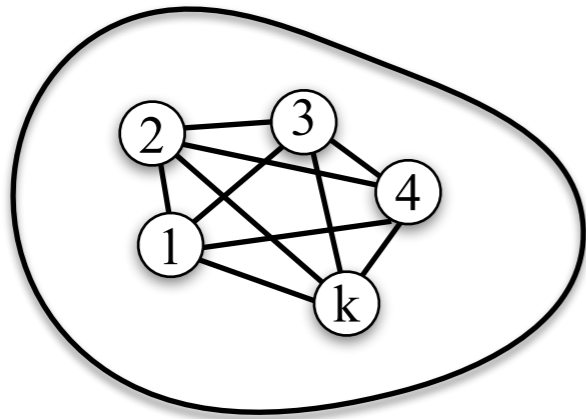


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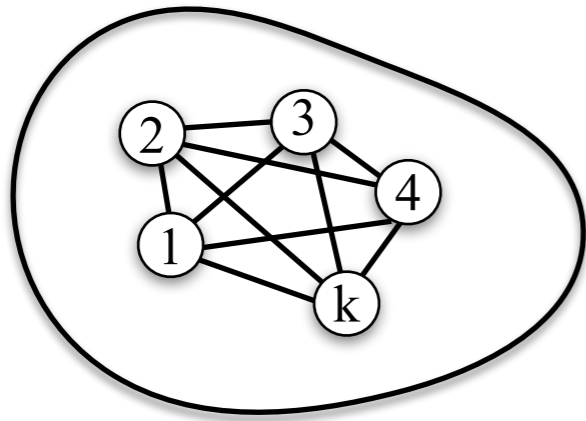


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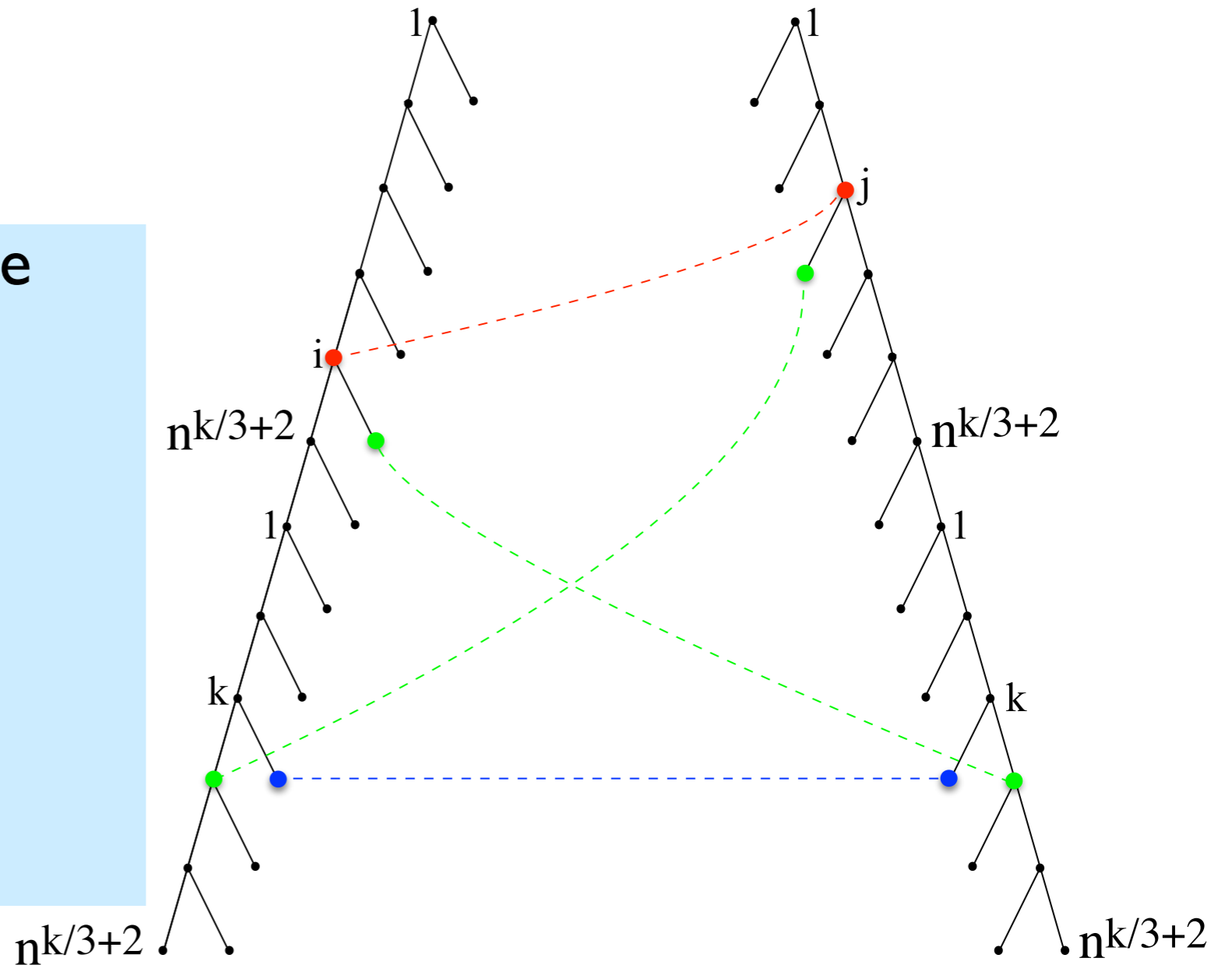


TED

Small alphabet: $|\Sigma| = O(k)$



Each $k/3$ clique is a spine node

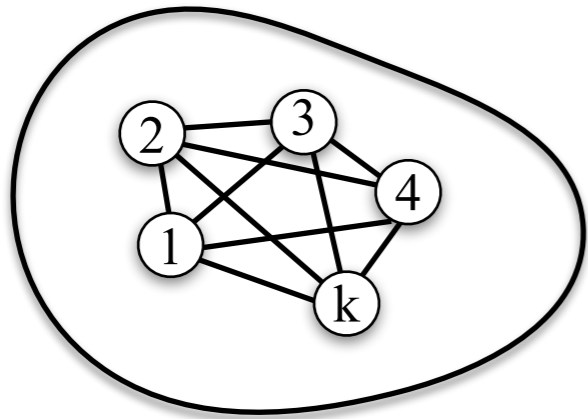


Max-weight k-Clique



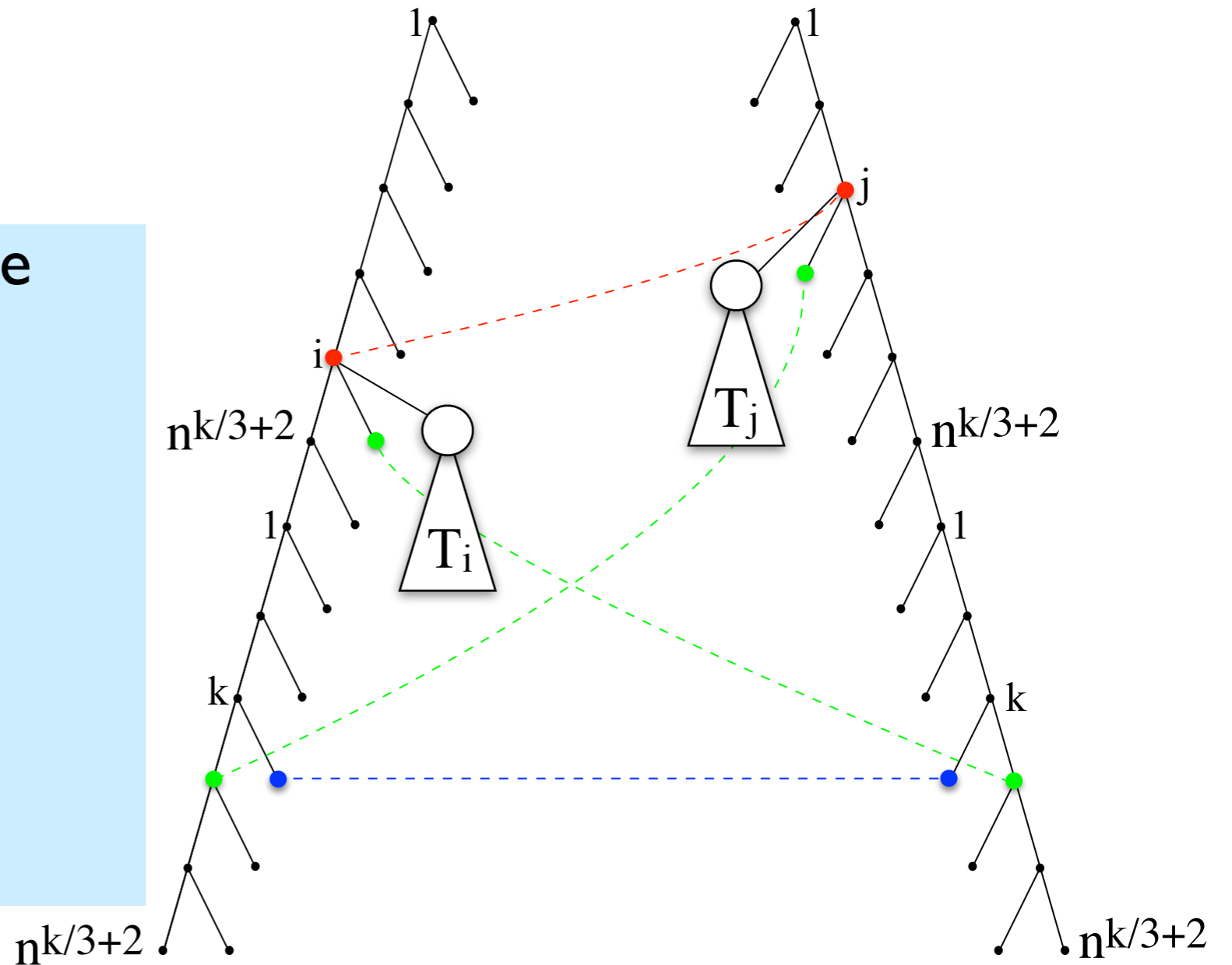
TED

Small alphabet: $|\Sigma| = O(k)$



Each $k/3$ clique is a spine node

Simulate matching costs with small (n^2 size) gadgets T_i .

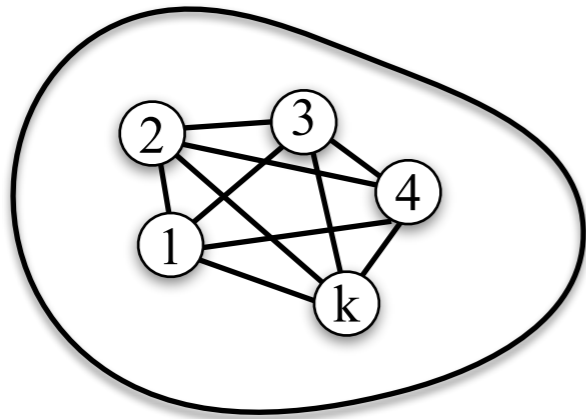


Max-weight k-Clique



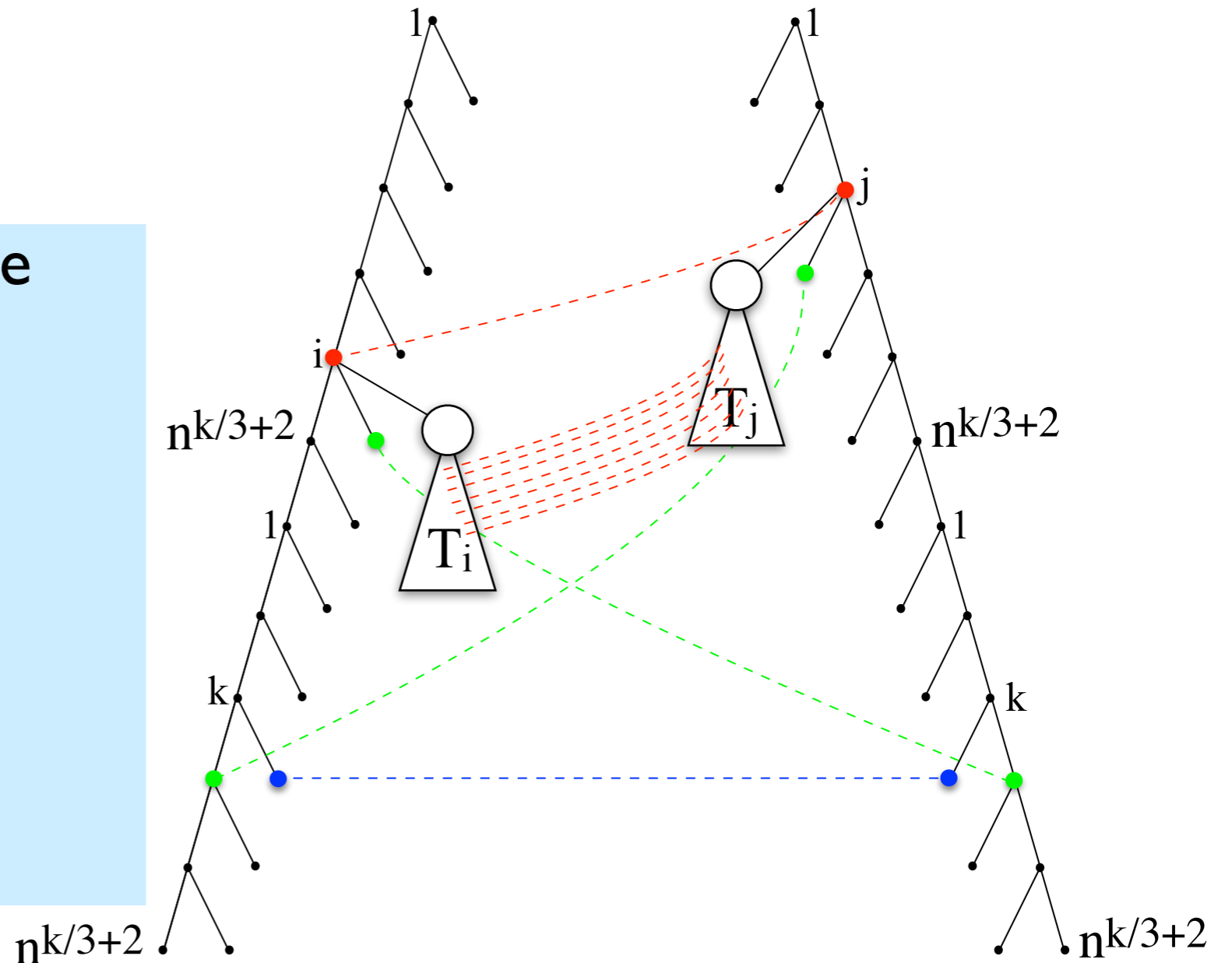
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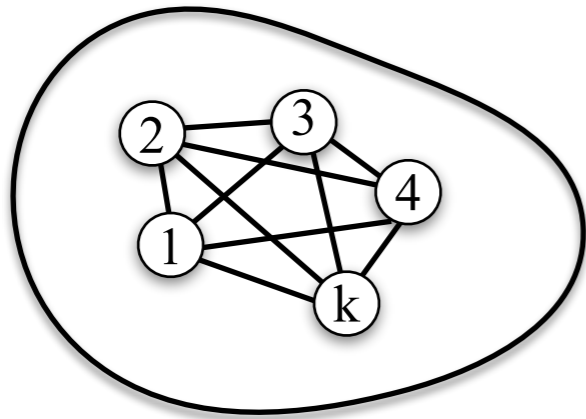


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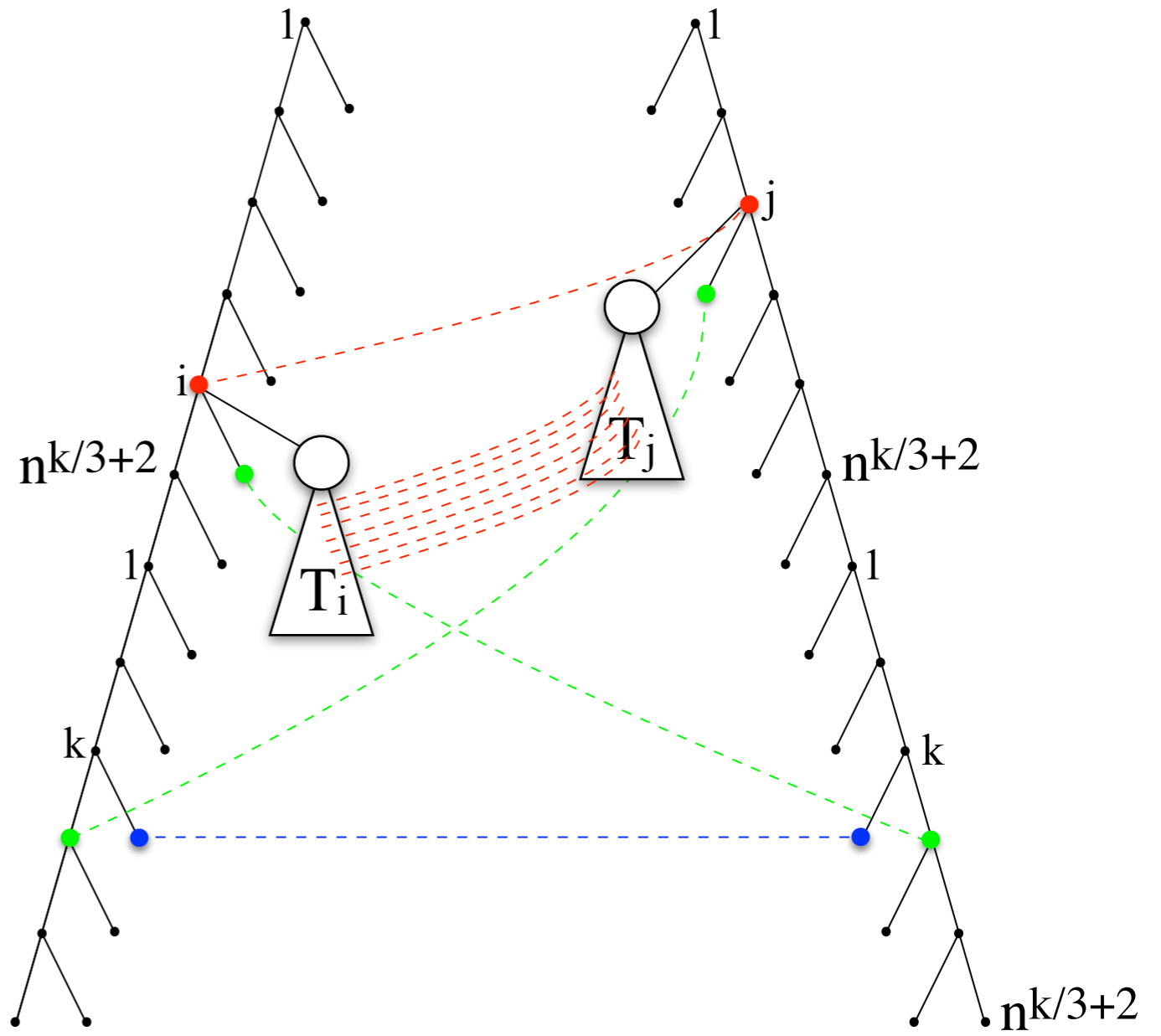


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Challenging:

- T_i needs to “prepare” for any possible T_j
- we need to control which T_i can be matched to which (in APSP by height)
- constant $O(k)$ size alphabet

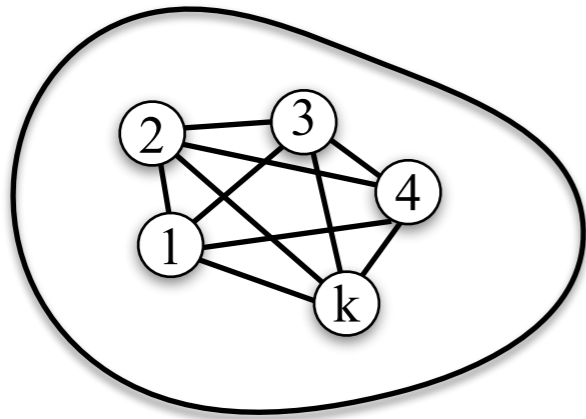


Max-weight k-Clique



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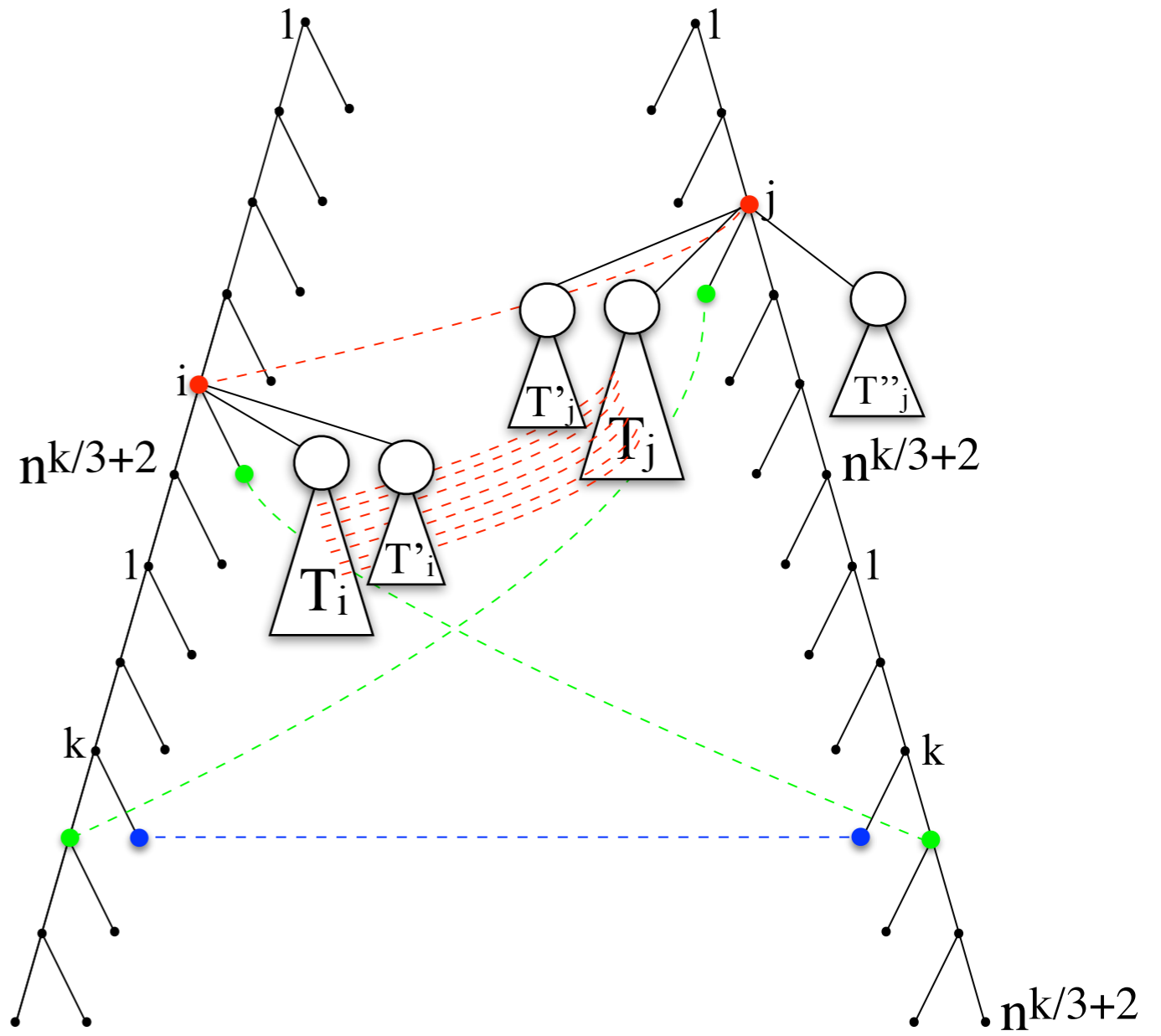


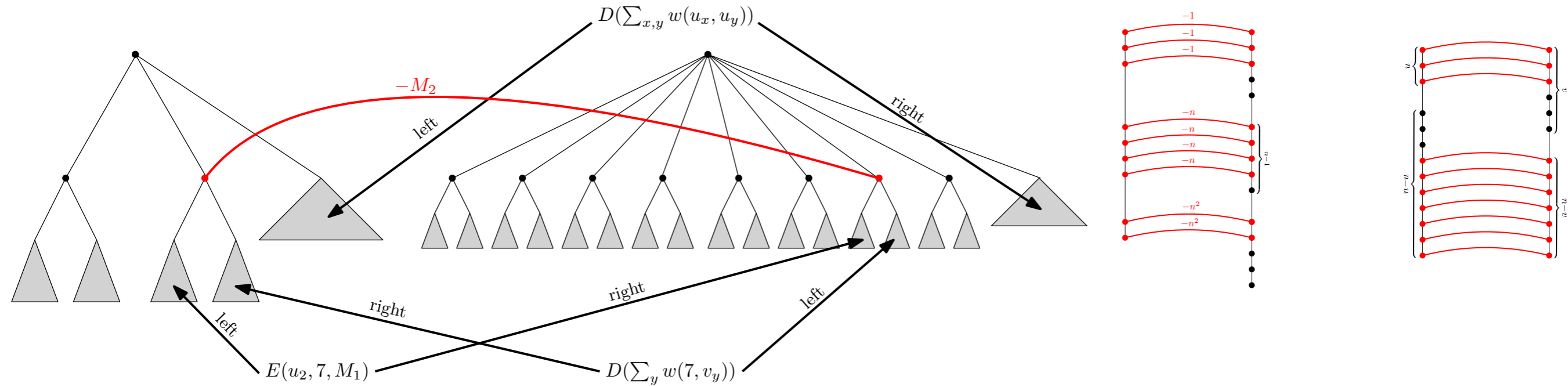
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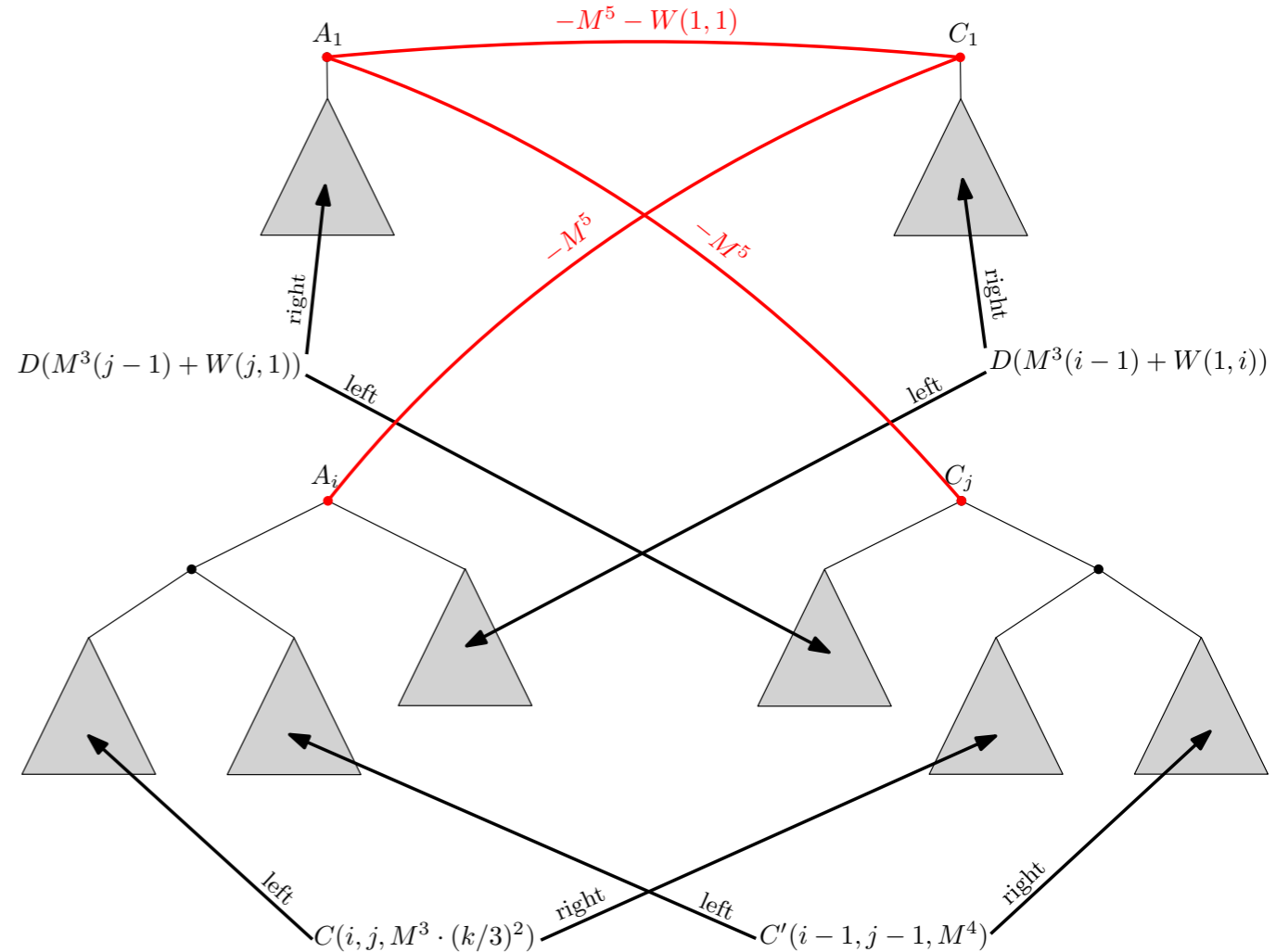
1. $c_{\text{match}}(A'_i, D_{z'}) = -M^6 - M^3(N - i) - W(i, z')$ for every $i = 1, 2, \dots, N$ and $z' = 1, 2, \dots, N$,
2. $c_{\text{match}}(B_z, C'_j) = -M^6 - M^3(N - j) - W(z, j)$ for every $z = 1, 2, \dots, N$ and $j = 1, 2, \dots, N$.
3. $c_{\text{match}}(A_i, C_j) = -M^2 - W(j, i) + W(j - 1, i - 1)$ for every $i = 2, 3, \dots, N$ and $j = 2, 3, \dots, N$.
4. $c_{\text{match}}(A_i, C_1) = -M^5 - M^3(i - 1) - W(1, i)$ for every $i = 1, 2, \dots, N$,
5. $c_{\text{match}}(A_1, C_j) = -M^5 - M^3(j - 1) - W(j, 1)$ for every $j = 1, 2, \dots, N$.

Lemma 5. For sufficiently large M , the total cost of an optimal matching is

$$-M^8 \cdot 2 - M^7 \cdot 2(N - 1) - M^6 \cdot 2 - M^5 - M^3 \cdot 2N + M^2 - \max_{i,j,z} \{W(i, z) + W(z, j) + W(j, i)\}.$$

Proof. Consider i, j, z maximizing $W(i, z) + W(z, j) + W(j, i)$. We may assume that $i \geq j$. Then, it is possible to choose the following matching:

1. b_k to c'_j with cost $-M^8$,
2. some nodes from the copy of I being the left child of c'_j to some spine nodes below b_z with total cost $-M^7(N - z)$,
3. a'_i to d_k with cost $-M^8$,
4. some nodes from the copy of I being the right child of a'_i to some spine nodes below d_z with total cost $-M^7(N - z)$,
5. b'_1 to d'_{z-1} , b'_2 to d'_{z-2} , \dots , b'_{z-1} to d'_1 with cost $-M^7 \cdot 2$ each,
6. a_i to c_j , a_{i-1} to c_{j-1} , \dots , a_{i-j+1} to c_1 with cost $-M^3 \cdot 2 + M^2$ each,
7. A'_i to D_z with cost $-M^6 - M^3(N - i) - W(i, z)$,
8. B_z to C'_j with cost $-M^6 - M^3(N - j) - W(z, j)$,
9. A_i to C_j , A_{i-1} to C_{j-1} , \dots , A_{i-j+2} to C_2 with costs $-M^2 - W(j, i) + W(j - 1, i - 1)$, $-M^2 - W(j - 1, i - 1) + W(j - 2, i - 2)$, \dots , $-M^2 - W(2, i - j + 2) + W(1, i - j + 1)$.
10. A_{i-j+1} to C_1 with cost $-M^5 - M^3(i - j) - W(1, i - j + 1)$.



Open Problems

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- *Largest common subforest:* unlabeled trees ($|\Sigma| = 1$)

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- log shaves?

Thank You!

