

# Hardness of Tree Edit Distance and Friends

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# (String) Edit Distance

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**Output:** Cheapest transformation of  $S_1$  into  $S_2$  using deletion, insertions and substitutions.

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abcef  $\longrightarrow$  abc~~x~~ef

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“Unweighted” (String) Edit Distance: all costs are one

# (String) Edit Distance Algorithms

References	Time	Remarks
Vin68, NW70, Sel74, WF74	$\mathcal{O}(n^2)$	textbook algorithm
MP80	$\mathcal{O}(n^2 / \log^2 n)$	small alphabets and integer weights only
BF05	$\mathcal{O}(n^2 \log \log n / \log^2 n)$	small integer weights only
Bl18	$\Omega(n^{2-o(1)})$	under SETH, already for unweighted

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Strings undergo updates (insertion/deletions and substitutions), and we need to maintain their edit distance.

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References	Update Time	Remarks
CKM20	$\tilde{O}(n)$	unweighted
CKM20	$\tilde{O}(n \cdot \min(\sqrt{n}, W))$	uniform weights, $W$ is maximum weight
GK25	$\tilde{O}(nW)$	arbitrary weights
CKW23	$\Omega(n^{1.5-o(1)})$	under APSP, large $W$

**This Paper:**  
**Generalization of (String) Edit Distance**  
**in the Dynamic Setting**

# Tree Edit Distance

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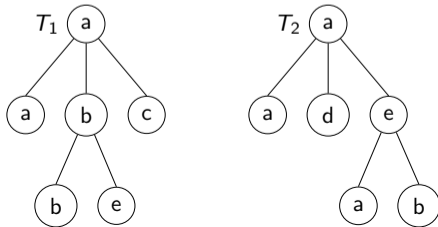
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⇓ Generalization on Trees

## Tree Edit Distance Problem (TED)

**Input:** Two **rooted, labeled, left-to-right-ordered trees**  $T_1, T_2$  and a cost function  $\delta$ .

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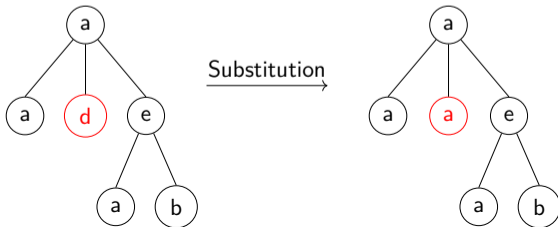
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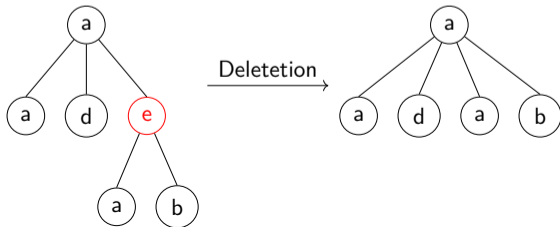
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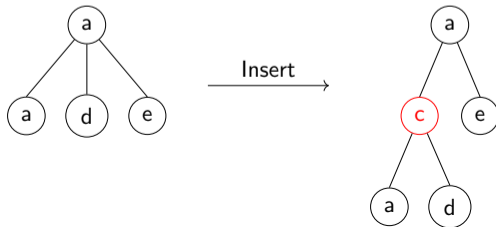
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# Algorithms for Tree Edit Distance

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Tai79	$\mathcal{O}(n^6)$	weighted
SZ89	$\mathcal{O}(n^4)$	weighted
Klein98	$\mathcal{O}(n^3 \log n)$	weighted
DMRW10	$\mathcal{O}(n^3)$	weighted
BGMW20	no $\mathcal{O}(n^{3-\varepsilon})$ algo under APSP	weighted
<b>NPSVWXY25</b>	$n^3 / 2^{\Omega(\sqrt{\log n})}$	weighted
Mao22	$\mathcal{O}(n^{2.9546})$	unweighted
Dürr23	$\mathcal{O}(n^{2.9148})$	unweighted
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⇓ About Balanced Sequence of Parenthesis

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$$S = ((\{) ] \longrightarrow S' = (\{ \})$$

$$\text{distance} = 3$$

# RNA Folding

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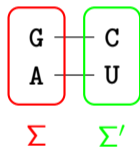
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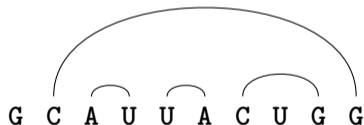
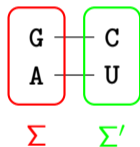
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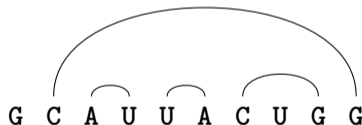
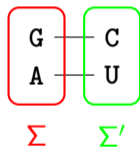


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**Relation with edit distance:** we can embed edit distance in RNA folding.

# Algorithms for Dyck Edit Distance and RNA Folding

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**Question 3: How about *Dynamic* Dyck Edit Distance and RNA Folding?**

**Our Results: Bad News...**

**Question 1: How about *Dynamic* Tree Edit Distance?**

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### Theorem

For any  $\varepsilon > 0$ , there are no dynamic algorithms:

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**Thanks!**