

String Consensus Problems with Swaps and Substitutions

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Outline

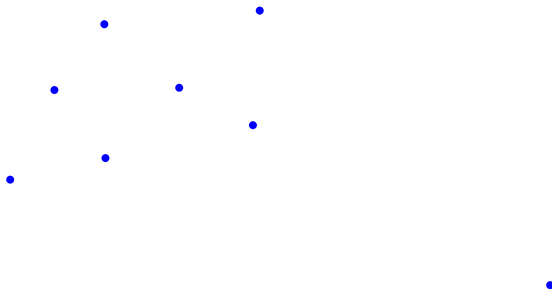
Problem definition

Closest string under Hamming distance

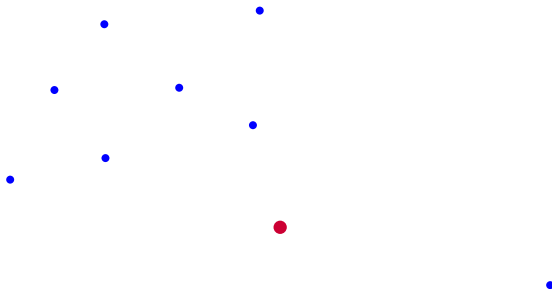
Algorithms for the swap distance

Algorithms for the SH distance

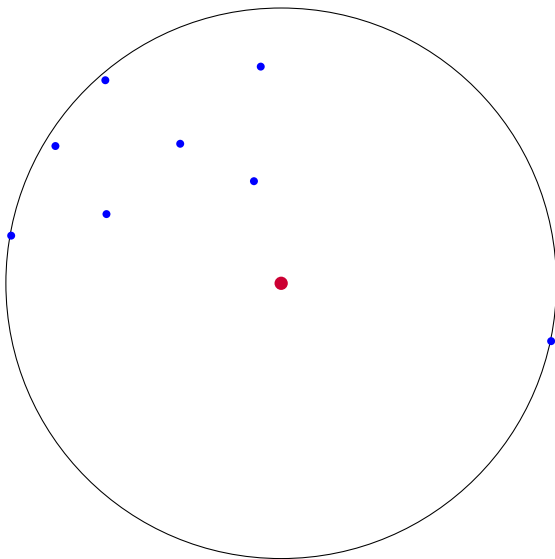
Smallest enclosing circle, Geometric median



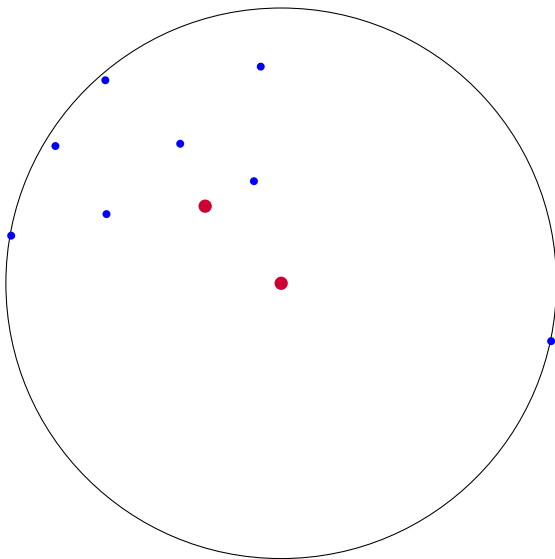
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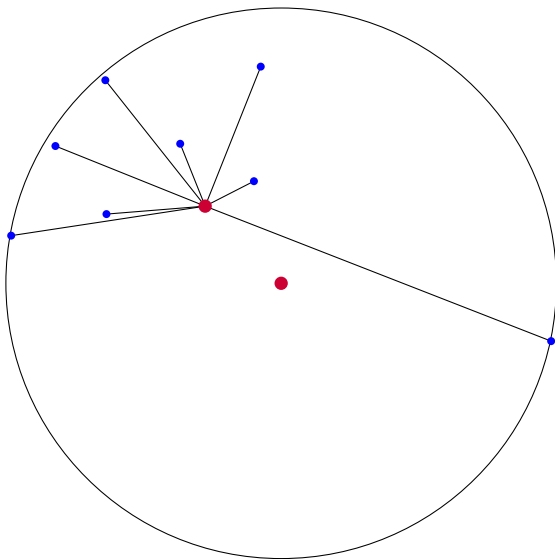
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Consensus String: Problem definition

Let us fix a distance ∂ on strings.

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(\mathbf{r}, ∂) -CONSENSUS

Input: A set \mathcal{S} of fixed length strings, integer d .

Output:

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Let us fix a distance ∂ on strings.

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Consensus String: Problem definition

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Input: A set \mathcal{S} of fixed length strings, integer d .

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Input: A set \mathcal{S} of fixed length strings, integer D .

Output: Is there a string s^* such that $\sum_{s \in \mathcal{S}} \partial(s, s^*) \leq D$?

Hamming distance

Definition (Hamming distance)

We write d_{Ham} for the Hamming distance, counting mismatches.

Hamming distance

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Example

`s = "Natural"`

`t = "Neutral"`

Hamming distance

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Example

$s = \text{"Natural"}$

$t = \text{"Neutral"}$

$$d_H(s, t) = 3$$

Example

$s_1 = \text{"adcda"}$

$s_2 = \text{"abcda"}$

$s_3 = \text{"adabb"}$

$s_4 = \text{"cdcda"}$

$s_5 = \text{"fffff"}$

Example

$s_1 = \text{"adcda"}$

$s_2 = \text{"a**b**cda"}$

$s_3 = \text{"ad**abb**"}$

$s_4 = \text{"**c**dcda"}$

$s_5 = \text{"**ffffff**"}$

$s^* = \text{"adcda"} \quad d = 5 \quad D = 11$

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In general, (s, ∂) -CONSENSUS is *easier* than (r, ∂) -CONSENSUS. For example, $(r, \partial_{\text{Ham}})$ -CONSENSUS is NP-hard, while $(s, \partial_{\text{Ham}})$ -CONSENSUS can be solved in linear time (majority string).

Outline

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Closest string under Hamming distance

Algorithms for the swap distance

Algorithms for the SH distance

NP-hardness

Theorem (Frances and Litman, 1997)

The problem $(\mathfrak{r}, \partial_{\text{Ham}})$ – CONSENSUS is NP-hard under the Hamming distance

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The problem $(\mathfrak{x}, \partial_{\text{Ham}})$ – CONSENSUS is NP-hard under the Hamming distance

Definition

We say that a problem is *FPT* for a parameter k if an instance of size n can be solved in $O(f(k) \cdot p(n, k))$ time, where f is some computable function and p is a polynomial.

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Theorem (Gramm et al., 2003)

$(\mathbf{r}, \partial_{\text{Ham}})$ -CONSENSUS is FPT with respect to the maximal distance

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Swap distance: definition

The *swap distance* $\partial_s(s, t)$ between two strings s, t having the same length is the number of adjacent letter exchanges to obtain t from s . Each position can be swapped at most once.

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Note that not every pair of strings is comparable. If two strings are comparable, we say that they are *matching*.

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Example

$s = \text{"ababc"}$

$t = \text{"babac"}$

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Example

$s = \text{"ababc"}$

$t = \text{"babac"}$

$\partial_s(s, t) = 2$

Swap distance: strings not matching

Even with the same letter frequencies, some pairs of strings might not match.

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Example

`s = "abc"`

`t = "bca"`

Known results on (r, ∂_s) – CONSENSUS

Theorem (Amir et al., 2013)

(r, ∂_s) -CONSENSUS *is NP hard*.

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Problem

1. Is (r, ∂_s) -CONSENSUS FPT for d ?
2. Is (s, ∂_s) -CONSENSUS linear? or at least polynomial ?

First case: strings are pairwise matching

 $s_1 = \text{abgacbahidabedfed}$ $s_2 = \text{bagacbaihdabedfdea}$ $s_3 = \text{bagacbaihdbaedfed}$

First case: strings are pairwise matching

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$s_3 = \text{bagacbaihdbaedfed}$

First case: strings are pairwise matching

$h_1 = 000000000000000000.$

$s_2 = \text{bagacbaihdabedfdea}$

$s_3 = \text{bagacbaihdbaedfedea}$

First case: strings are pairwise matching

$$h_1 = 000000000000000000.$$
$$h_2 = 10000001000000010.$$
$$s_3 = \text{bagacbaihd} \text{baedfed}$$

First case: strings are pairwise matching

$$h_1 = 000000000000000000.$$
$$h_2 = 10000001000000010.$$
$$h_3 = 10000001001000000.$$

First case: strings are pairwise matching

$$h_1 = 000000000000000000.$$

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$$h^* = 10000001000000000.$$

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First case: strings are pairwise matching

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 $s^* = \text{bagacbaihdabedfed}$

Second case: Strings are not pairwise matching

Strings do not need to be pairwise matching to admit a consensus

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Example

$s_1 = \text{bac}$

$s_2 = \text{acb}$

$s^* = \text{abc}$

Second case: Strings are not pairwise matching

Strings do not need to be pairwise matching to admit a consensus

Example

$s_1 = \text{bac}$

$s_2 = \text{acb}$

$s^* = \text{abc}$

However, if the strings are not pairwise matching, the consensus must match each of them. This provides us with some information about a potential solution.

Second case: Strings are not pairwise matching (2)

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Main idea: Necessary swaps can be deduced from the structure of \mathcal{S} . After doing all those necessary swaps, we obtain a set \mathcal{S}' whose strings are pairwise compatible.

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Main idea: Necessary swaps can be deduced from the structure of \mathcal{S} . After doing all those necessary swaps, we obtain a set \mathcal{S}' whose strings are pairwise compatible. We then use the previous reduction to the Hamming case.

Disentanglement: example

$$s^* = ??????????$$
$$s_1 = \text{abgabcahi}$$
$$s_2 = \text{agbcaabih}$$
$$s_3 = \text{abgcabaih}$$

Disentanglement: example

$s^* = \text{????????}$

$s_1 = \text{abgabc} \text{ahi}$

$s_2 = \text{agbcaabih}$

$s_3 = \text{abgcabaih}$

Disentanglement: example

$s^* = a????????$

$s_1 = abgabcahi$

$s_2 = agbcaabih$

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$s_1 = abgabcahi$

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Disentanglement: example

$s^* = a????????$

$s_1 = abgabc ahi$

$s_2 = agbcaabih$

$s_3 = abgca baih$

Disentanglement: example

$$s^* = a????????$$

$$s_1 = abgabcahi$$

$$s_2 = agbcaabih$$

$$s_3 = abgcabaih$$

Disentanglement: example

$$s^* = a????????$$

$$s_1 = abga**b**cahi$$

$$s_2 = agbcaabih$$

$$s_3 = abgcabaih$$

Disentanglement: example

$s^* = a??\boxed{???}???$
 $s_1 = abga\textcolor{red}{b}cahi$
 $s_2 = agbcaabih$
 $s_3 = abgcabaih$

Disentanglement: example

$s^* = a??\boxed{???}???$
 $s_1 = abga\textcolor{red}{b}cahi$
 $s_2 = agbcaabih$
 $s_3 = abgcabaih$

Disentanglement: example

$s^* = a??\boxed{???}???$
 $s_1 = abga\textcolor{red}{b}cahi$
 $s_2 = agbcaabih$
 $s_3 = abgcabaih$

Disentanglement: example

$s^* = a??\boxed{???}???$
 $s_1 = abga\textcolor{red}{b}cahi$
 $s_2 = agbcaabih$
 $s_3 = abgcabaih$

Disentanglement: example

$s^* = a??? \textcolor{red}{cb} ???$
 $s'_1 = abga \textcolor{red}{cb} ahi$
 $s_2 = agbcaabih$
 $s_3 = abgcabaih$

Disentanglement: example

$$s^* = a???c b???$$
$$s'_1 = abgacba hi$$
$$s_2 = agbca abih$$
$$s_3 = abgca baihi$$

Disentanglement: example

$$s^* = a??acb????$$
$$s'_1 = abgacbahih$$
$$s'_2 = agbacabih$$
$$s'_3 = abgacbaih$$

Disentanglement: example

$$s^* = a??ac\textcolor{red}{b}???$$
$$s'_1 = abgacbah\textcolor{red}{i}$$
$$s'_2 = agbac\textcolor{red}{a}bih$$
$$s'_3 = abgacbaih$$

Disentanglement: example

$$s^* = a??acba??$$
$$s'_1 = abgacbah i$$
$$s''_2 = agbacb a i h$$
$$s'_3 = abgacba i h$$

Disentanglement: example

 $s^* = a??acba??$ $s'_1 = abgacba$  $s''_2 = agbacba$ $s'_3 = abgacba$

Disentanglement: example

$s'_1 = \text{abgacbah}i$ 1 swap

$s''_2 = \text{agbacbai}h$ 2 swap

$s'_3 = \text{abgacbai}h$ 1 swap

Disentanglement: example

$h_1 = 00000000$ 1 swap

$h_2 = 01000001$ 2 swap

$h_3 = 00000001$ 1 swap

Disentanglement: example

$$h^* = 01000001$$

$$h_1 = 00000000$$

3 swap

$$h_2 = 01000001$$

2 swap

$$h_3 = 00000001$$

2 swap

Disentanglement: example

$$h^* = 01000001$$

$$h_1 = 00000000$$

3 swap

$$h_2 = 01000001$$

2 swap

$$h_3 = 00000001$$

2 swap

Swap: Main theorem

Theorem

We have the following:

- ▶ (s, ∂_s) -CONSENSUS *can be solved in $\mathcal{O}(kn)$ time.*
- ▶ $(r, \partial_s) - \text{CONSENSUS}(d) \in \text{FPT}.$

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Problem definition

Closest string under Hamming distance

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SH distance

Definition

Let s, t be two strings having the same length. The SH (Swap-Hamming) distance $\partial_{SH}(s, t)$ between s and t is defined as following :

$$\partial_{SH}(s, t) = \min_{\sigma \in \mathcal{S}} (\partial_S(s, \sigma s) + \partial_{Ham}(\sigma s, t))$$

Where \mathcal{S} is the set of swap transformations starting from s .

Proposition

$\partial_{SH}(s, t)$ can be computed greedily, from left to right.

SH distance

Proposition

$\partial_{\text{SH}}(s, t)$ can be computed greedily, from left to right.

Example

$s_1 = \text{"natural"}$

$s_2 = \text{"neutral"}$

$\partial_{\text{SH}}(s_1, s_2) =$

SH distance

Proposition

$\partial_{\text{SH}}(s, t)$ can be computed greedily, from left to right.

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$s_1 = \text{"natural"}$

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$\partial_{\text{SH}}(s_1, s_2) =$

SH distance

Proposition

$\partial_{\text{SH}}(s, t)$ can be computed greedily, from left to right.

Example

$s_1 = \text{"natural"}$

$s_2 = \text{"neutral"}$

$$\partial_{\text{SH}}(s_1, s_2) = 1$$

SH distance

Proposition

$\partial_{\text{SH}}(s, t)$ can be computed greedily, from left to right.

Example

$s_1 = \text{"natural"}$

$s_2 = \text{"neutral"}$

$$\partial_{\text{SH}}(s_1, s_2) = 2$$

SH distance

Proposition

$\partial_{\text{SH}}(s, t)$ can be computed greedily, from left to right.

Example

$s_1 = \text{"natural"}$

$s_2 = \text{"neutral"}$

$$\partial_{\text{SH}}(s_1, s_2) = 2$$

Problem

Is $(r, \partial_{\text{SH}})$ -CONSENSUS FPT for d ?

Sketch of the proof from Gramm et al., 2003

$$s_1 = \boxed{\phantom{\text{expression}}}$$

$$\vdots$$

$$s_i = \boxed{\phantom{\text{expression}}}$$

$$\vdots$$

$$s_k = \boxed{\phantom{\text{expression}}}$$

Sketch of the proof from Gramm et al., 2003

$$s_1 = \boxed{\phantom{\text{expression}}}$$

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Sketch of the proof from Gramm et al., 2003

$$\begin{array}{c}
 s_1 = \boxed{\times \times \times \times \quad \times \times \quad \times \quad \times \times} \\
 \vdots \\
 s_i = \boxed{\times \times \times \times \quad \times \times \quad \times \quad \times \times} \\
 \vdots \\
 s_k = \boxed{}
 \end{array}$$

Sketch of the proof from Gramm et al., 2003

$$\begin{array}{c}
 \begin{array}{c} \overbrace{\hspace{1.5cm}}^{d+1} \\ s_1 = \boxed{\begin{array}{cccccccccc} \times & \times & \times & \times & \times & \times & \times & & \times & \times & \times \end{array}} \end{array} \\
 \vdots \\
 s_i = \boxed{\begin{array}{cccccccccc} \times & \times & \times & \times & \times & \times & \times & & \times & \times & \times \end{array}} \\
 \vdots \\
 s_k = \boxed{\hspace{10cm}}
 \end{array}$$

Sketch of the proof from Gramm et al., 2003

$$\begin{array}{c}
 \begin{array}{c} \overbrace{\hspace{1.5cm}}^{d+1} \\ \mathbf{s}_1 = \boxed{\times \times \times \times \times \times \times} \end{array} \\
 \vdots \\
 \mathbf{s}_i = \boxed{\times \times \times \times \times \times \times} \\
 \mathbf{s}^* = \boxed{\times \times \times \times \times \times \times}
 \end{array}$$

Sketch of the proof from Gramm et al., 2003

$$\begin{array}{l}
 s_1 = \overbrace{\begin{array}{|c|c|c|c|c|c|c|} \hline \times & \times & \times & \times & \times & \times & \times \\ \hline \end{array}}^{d+1} \\
 \vdots \\
 \left. \begin{array}{l}
 s_i = \begin{array}{|c|c|c|c|c|c|c|} \hline \times & \times & \times & \times & \times & \times & \times \\ \hline \end{array} \\
 s^* = \begin{array}{|c|c|c|c|c|c|c|} \hline \times & \times & \times & \times & \times & \times & \times \\ \hline \end{array}
 \end{array} \right\} \partial_S(s_i, s^*) \geq d+1
 \end{array}$$

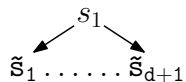
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 s_i = \begin{array}{|c|c|c|c|c|c|c|} \hline \times & \times & \times & \times & \times & \times & \times \\ \hline \end{array} \\
 s^* = \begin{array}{|c|c|c|c|c|c|c|} \hline \times & \times & \times & \times & \times & \times & \times \\ \hline \end{array}
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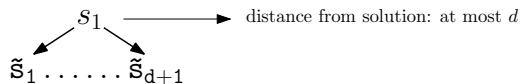
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 s_1

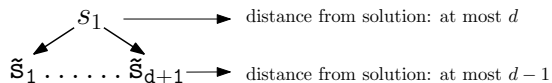
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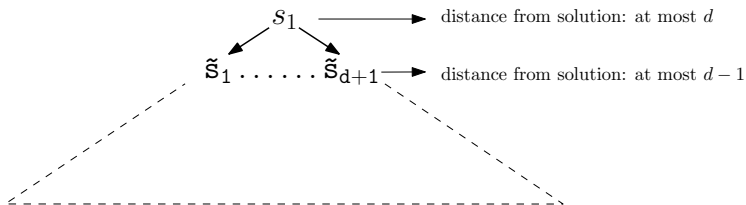
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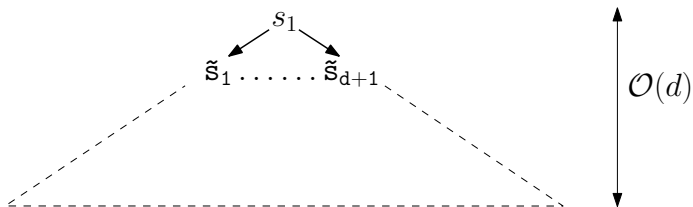
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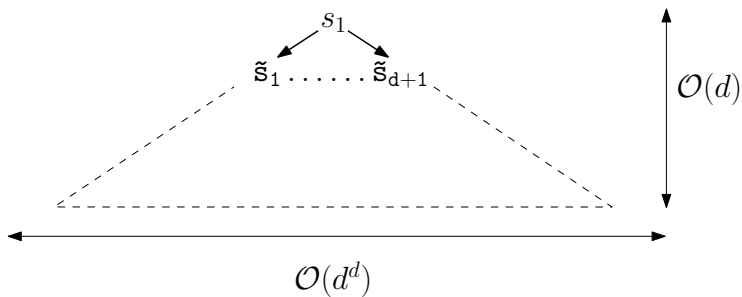
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$(r, \partial_{\text{SH}})$ -CONSENSUS

Theorem

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$(r, \partial_{\text{SH}})$ -CONSENSUS

Theorem

$(r, \partial_{\text{SH}}) - \text{CONSENSUS}(d) \in \text{FPT}$.

Proof.

Same as for Hamming in [Frances and Litman, 1997], but we also try some candidates obtained by swapping positions. \square

$(\mathbf{s}, \partial_{\text{SH}})$ -CONSENSUS

Problem

Is $(\mathbf{s}, \partial_{\text{SH}})$ -CONSENSUS linear? or at least polynomial ?

$(\mathbf{s}, \partial_{\text{SH}})$ -CONSENSUS

$$s_1 = \text{baba}$$

$$s_2 = \text{cab c}$$

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(s, ∂_{SH}) -CONSENSUS $s_1 = \text{baba}$ $s_2 = \text{cabc}$ $s_3 = \text{baca}$ $s^* = \text{abab}$

(s, ∂_{SH}) -CONSENSUS

$$s_1 = \text{baba}$$

$$s_2 = \text{cabc}$$

$$s_3 = \text{baca}$$

$$s^* = \text{abab}$$

$$\sum \partial_{SH}(s_i, s^*) = 6$$

(s, ∂_{SH}) -CONSENSUS

$$s_1 = ab$$

$$s_2 = ab$$

$$s_3 = ac$$

$$s^* = ba$$

(s, ∂_{SH}) -CONSENSUS

$$s_1 = \text{bab}$$

$$s_2 = \text{cab}$$

$$s_3 = \text{ac}$$

$$s^* = \text{ba}$$

(s, ∂_{SH}) -CONSENSUS

 $s_1 = \dots cabababab$ $s_2 = \dots ccbababab$ $s_3 = \dots cccababab$

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Reachable sets

Definition

We say that a set of indices $W \subseteq \{1, \dots, k\}$ is *reachable* at position i if there exists a string s^* such that $s_j \in \mathcal{S}$ and s^* have a swap at position i if and only $j \in W$.

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At each position i , there are at most k_i reachable sets.

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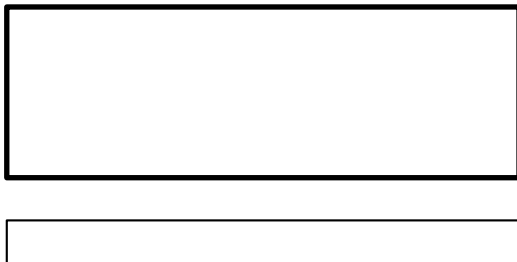
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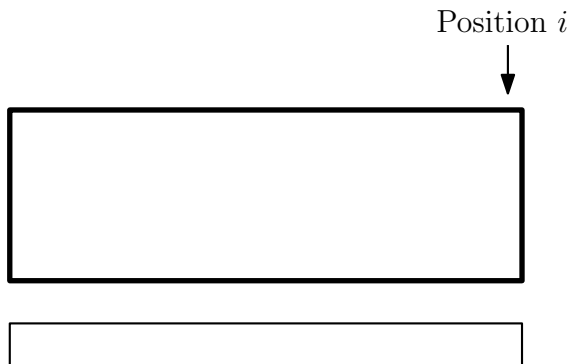
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Hence, we can do dynamic programming, computing the best solution for each reachable set at each position.

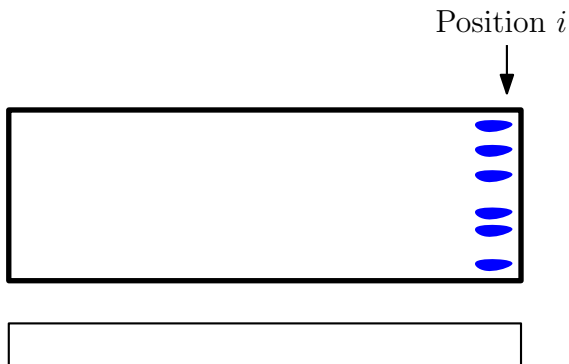
Dynamic programming



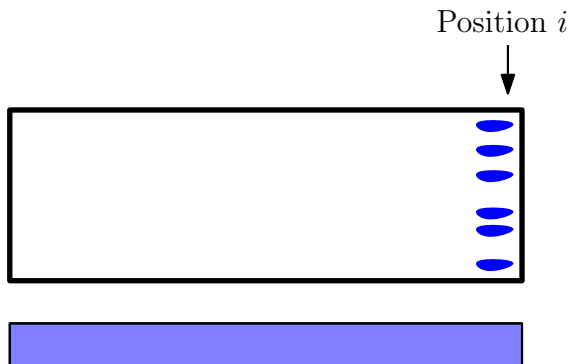
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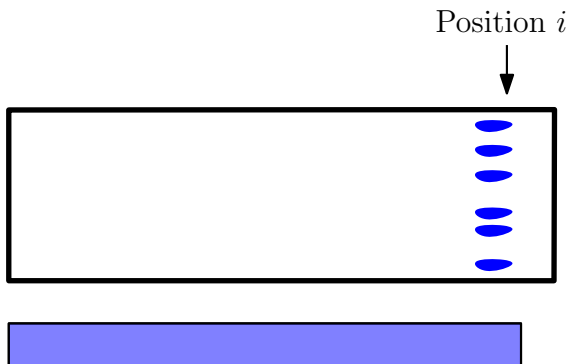
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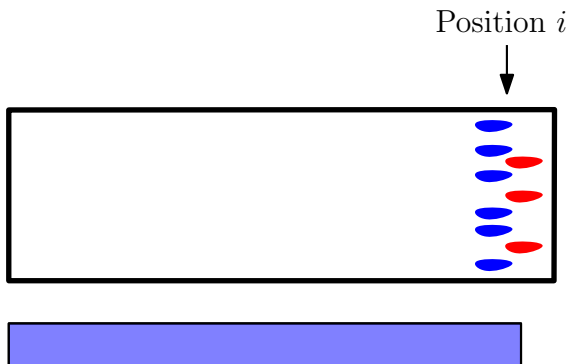
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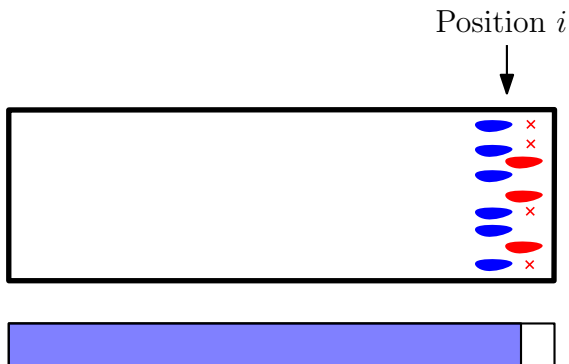
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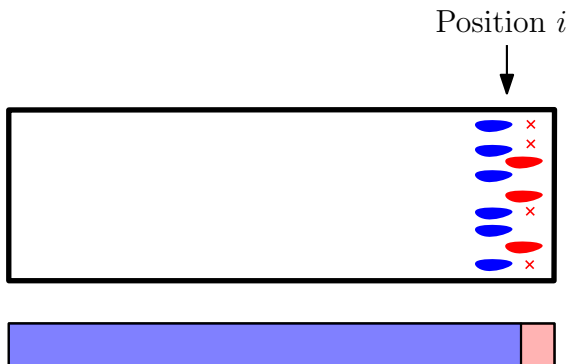
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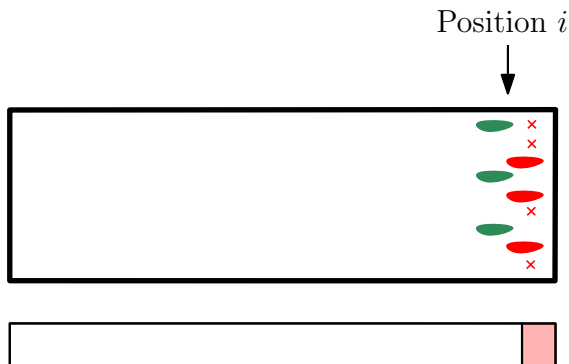
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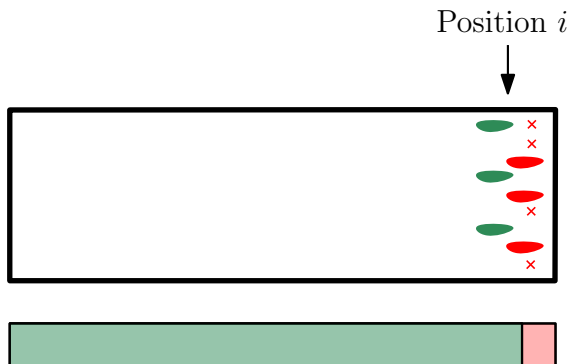
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Dynamic programming



(s, ∂_{SH}) -CONSENSUS: Wrapping up

- ▶ At most kn reachable sets per position

$(\mathbf{s}, \partial_{\text{SH}})$ -CONSENSUS: Wrapping up

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- ▶ Each of them can be extended in at most $\mathcal{O}(k)$ or $\mathcal{O}(|\Sigma|)$ ways

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Theorem

One can solve (s, ∂_{SH}) -CONSENSUS in $\mathcal{O}(k^3 n^2)$ or $\mathcal{O}(|\Sigma| k^2 n^2)$ time.

Results

We showed the following:

- ▶ The problems $(\mathbf{r}, \partial_S) - \text{CONSENSUS}$ and $(\mathbf{r}, \partial_{SH}) - \text{CONSENSUS}$ are FPT for d .
- ▶ The problem $(\mathbf{s}, \partial_S) - \text{CONSENSUS}$ can be solved in linear time.
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We also studied the bi-objective problem $(\mathbf{rs}, \partial_{\mathbf{S}}) - \text{CONSENSUS}$, and show that it can be reduced to $(\mathbf{rs}, \partial_{\text{Ham}}) - \text{CONSENSUS}$.

Future directions

We leave the following problems open:

- ▶ Is $(rs, \partial_{SH}) - \text{CONSENSUS}(d) \in \text{FPT}$?
- ▶ Can the algorithm for $(s, \partial_{SH}) - \text{CONSENSUS}$ be further optimized?
- ▶ Can our algorithms be generalized to allow deleting a certain number of outlier strings or columns in \mathcal{S} such that the resulting substrings admit a solution (cf. Bulteau and Schmid, 2020)?
- ▶ Can those problems be studied in a learning-augmented perspective?

Thank you! Questions ?