The Fine-Grained Complexity of Episode Matching

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 - The minimal substrings of *S* which contain *P* as a subsequence are shown in blue: *S*[6,16] and *S*[39,44]
 - We consider a version of the problem where the goal is to find the *length* of the shortest substring of *S* containing *P* as a subsequence

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- This work: no $O(nm^{1-\epsilon})$ or $O(n^{1-\epsilon}m)$ algorithm assuming OVH

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	space	time	
[AA02]	<i>O</i> (<i>n</i>)	$O(\sum_{i=1}^{m} dist_{-}occ(P_i) \cdot i)$	
This work	$O(n + \left(\frac{n}{\tau}\right)^k)$	$O(k \cdot \tau \cdot \log \log n)$	m = k fixed
This work	$\Omega(n^{k-k\delta-o(1)})$	$O(n^{\delta})$	m = k fixed

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- Conditional lower bound based on hardness of k-Set Disjointness

• This work: Faster preprocessing for decision version using min-plus matrix multiplication

- Two sets *A*,*B* of *d*-dimensional, binary vectors, each set has size *n*
- Problem: Decide if there is a vector in A that is orthogonal to a vector in B
- OVH: There is no algorithm running in time $O(n^{2-\epsilon} \operatorname{poly}(d))$

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- *b*₁ and *a* are orthogonal
- 0x1x0 is a subsequence of 00x01x01
- *b*₂ and *a* are not orthogonal
- 1x1x0 is not a subsequence of 00x01x01

а	a s(a)		p(b)
010	01x00x01	010	0x1x0

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 $s(a_1)ys(z)ys(a_2)ys(z)y\dots s(a_n)ys(z)ys(a_1)ys(z)y\dots s(n)$

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- $|P||S|^{1-\epsilon} = O(n^{2-\epsilon}d^{2-\epsilon})$ $|P|^{1-\epsilon}|S| = O(n^{2-\epsilon}d^{2-\epsilon})$

а	s(a)	b	p(b)	z	s(z)
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No orthogonal vectors:

а	s(a)	b	p(b)	z	s(z)
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a_i, *b_j* orthogonal:

$S = s(a_1)ys(z)ys(a_2)ys(z)y\dots s(a_n)ys(z)ys(a_1)ys(z)y\dots s(a_n)$

- $a_i \perp b_j$
- j < i: "overflow" to the right
- j > i: "overflow" to the left

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• replace x and y by binary gadgets

- |P| = k fixed at preprocessing
- Upper bound: Space: $O(n + (\frac{n}{\tau})^k)$, Time: $O(k \cdot \tau \cdot \log \log n)$ m = k
- Conditional lower bound: Space: $\Omega(n^{k-k\delta-o(1)})$, Time: $O(n^{\delta})$

Definition (*k*-**Set Disjointness Problem)** Preprocess *m* sets S_1, S_2, \ldots, S_m of total size $\sum_{i=1}^m |S_i| = N$ drawn from a universe *U* such that given (i_1, i_2, \ldots, i_k) we can quickly decide whether $\bigcap_{j=1}^k S_{i_j} = \emptyset$.

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Conjecture (Strong *k*-Set Disjointness Conjecture)

Any data structure for the k-Set Disjointness Problem that answers queries in time T must use $\tilde{\Omega}(N^k/T^k)$ space.

$$\begin{array}{ll} S_1 = \{1,3,4\} & \alpha_1 \\ S_2 = \{2\} & \alpha_2 \\ S_3 = \{1,2,3,4\} & \alpha_3 \\ S_4 = \{2,4\} & \alpha_4 \\ S_5 = \{1,3\} & \alpha_5 \end{array}$$

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$$P_1 = \alpha_1 \alpha_4$$
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Thank you!



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References

- Alberto Apostolico and Mikhail J. Atallah.
 Compact recognizers of episode sequences. Inf. Comput., 174(2):180–192, 2002.
- Philip Bille, Inge Li Gørtz, Max Rishøj Pedersen, and Teresa Anna Steiner.

Gapped indexing for consecutive occurrences. In *Proc. 32nd CPM*, pages 10:1–10:19, 2021.

Gautam Das, Rudolf Fleischer, Leszek Gasieniec, Dimitrios Gunopulos, and Juha Kärkkäinen.

Episode matching.

In Proc. 8th CPM, pages 12-27, 1997.

Massimo Equi, Veli Mäkinen, and Alexandru I. Tomescu. Graphs cannot be indexed in polynomial time for sub-quadratic time string matching, unless SETH fails.

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