



Faster Approximate Pattern Matching: A Unified Approach

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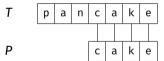
UC Berkeley

Philip Wellnitz

MPII, SIC

Pattern Matching

Given a text T and a pattern P, identify the occurrences of P as a substring of T.

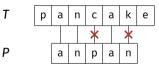


Finding cake



Pattern Matching with Mismatches

Given a text T, a pattern P, and an integer k, identify the length-|P| substrings of T with **Hamming distance** at most k to P.



Finding anpan, k = 2





Pattern Matching with Errors

Given a text T, a pattern P, and an integer k, identify the (starting positions of) substrings of T that are at **edit distance** of at most k to P.

T p a n c a k e

P p l a n c k

Finding planck, k = 2





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Grammar Compression

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For a string T, a grammar compression of T is a context-free grammar G_T that generates $\{T\}$. The grammar G_T is wlog, a straight-line program or SLP.





Known Results

| Problem | uncompressed text and pattern | SLP text and pattern $n = \Omega(\log N), m = \Omega(\log M)$ | |
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| Pattern Matching | O(N + M) [KMP'77] | Õ(n + m) [Jeż'15] | |
| PM with <i>k</i> Mismatches | $\tilde{O}(N + k^2 \cdot N/M), \tilde{O}(N + kN/\sqrt{M})$ [CFPSS'16] [GU'18] | Õ(nk ⁴ + Mk) [BK W ′19] | |
| PM with <i>k</i> Errors | <i>O</i> (<i>N</i> + <i>k</i> ⁴ · <i>N</i> / <i>M</i>) [CH'02] | O(nm poly(k)) [BLRSSW'15] | |

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k: number of mismatches/errors

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Improvements obtained via improved/new structural insight in solution structure.





Known Structural Results for PM with Mismatches

Theorem [BKW'19]

Given a pattern P of length M, a text T of length $N \le \frac{3}{2}M$, and a threshold $k \le M$, at least one of the following holds:

- The number of k-mismatch occurrences of P in T is at most $O(k^2)$.
- The pattern P is almost periodic (at $HD \le 6k$ to a string Q with period O(M/k)).





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Additional insights into the almost periodic case





Structural Results for PM with Mismatches

Main Structural Theorem (HD)

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Are these bounds optimal?





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Are these bounds optimal?—Yes, see long version.







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Main Structural Theorem (ED)

Given a pattern P of length M, a text T of length $N \le \frac{3}{2}M$, and a threshold $k \le M$, at least one of the following holds:

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Given a pattern P of length M, a text T of length $N \le \frac{3}{2}M$, and a threshold $k \le M$, at least one of the following holds:

- The starting positions of all *k*-error occurrences of *P* in *T* lie in *O*(*k*) intervals of length *O*(*k*) each.
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| In this talk, Hamming distance only. | |
|--------------------------------------|--|

Proofs for edit distance work similarly.

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Key Lemma (Analyze)

For each string *P* of length *M*, at least one of the following holds:

- P contains 2k disjoint breaks; each break has length M/8k and period > M/128k.
- P contains disjoint repetitive regions R_i with total length $\geq 3/8 \cdot M$; each region has length $\geq M/8k$ and is almost periodic with HD exactly $8k/M \cdot |R_i|$.
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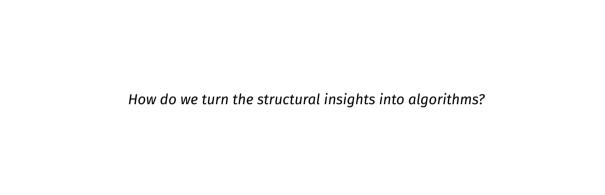
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Long version:

- Key Lemma ⇒ Main Structural Theorem
- Proof idea for Key Lemma



Obtaining Faster Algorithms

- All of our algorithms rely on a small set of essential operations:
 - LCP(S, T): Compute the length of the longest common prefix of S and T.
 - $LCP^{R}(S, T)$: Compute the length of the longest common suffix of S and T.
 - IPM(P, T): Compute all exact matches of P in T.
 - Length(S): Compute the length |S| of S.
 - Access(S, i): Retrieve the character S[i].
 - Extract(S, ℓ , r): Extract the fragment (or substring) $S[\ell..r)$ from S.

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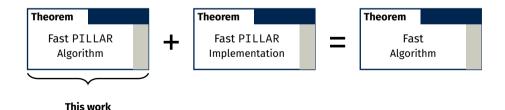
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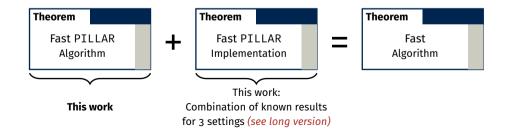
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Obtaining Fast Algorithms: The Fully-Compressed Setting

The PILLAR operations: LCP, LCP^R, IPM, Length, Access, Extract SLPs: $G_{\rm R}$ of size m generating pattern P, $G_{\rm T}$ of size n generating text T.





Obtaining Fast Algorithms: The Fully-Compressed Setting

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(After $O((n + m) \log(|P| + |T|))$) preprocessing.)





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For any positive threshold $k \le |P|$, we can compute the number of all k-mismatch occ's of P in T in time $O(m \log(|P| + |T|) + nk^2 \log^3(|P| + |T|))$.

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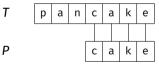


Thank You!

Full paper: arxiv.org/abs/2004.08350

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Matching (conditional) lower bound (for combinatorial algorithms) [GU'18]





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Not in this talk: How to shrink the gap.





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What if the text and the pattern are given in a compressed representation?

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Straight-Line Program (SLP)

An SLP G_T is a set of non-terminals $\{T_1, ..., T_n\}$ and productions of the form $T_i \to a, a \in \Sigma$ or $T_i \to T_p T_r$, where $\ell, r < i$. The starting symbol is T_n .





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$$T_1$$
 T_2 T_3

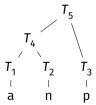


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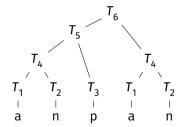
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$$T_6 \rightarrow T_5 T_4$$





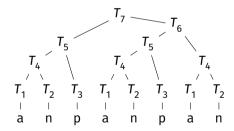
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$$T_6 \rightarrow T_5 T_4; \qquad T_7 \rightarrow T_5 T_6$$





Fact (Folklore)





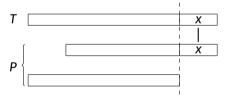
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| Τ | Р |
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| | |
| Ρ | P |





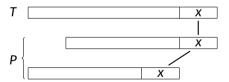
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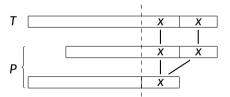
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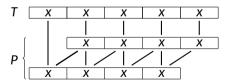
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- The pattern P is almost periodic (at HD $\leq 6k < 2k$ to a string Q with period O(M/k)).





Main Structural Theorem (HD)

Given a pattern P of length M, a text T of length $N \le \frac{3}{2}M$, and a threshold $k \le M$, at least one of the following holds:

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Are these bounds optimal?





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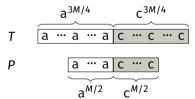




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■ Both P and T far from periodic, but there are 2k + 1k-mismatch occurrences of P in T.

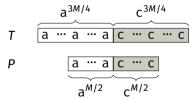




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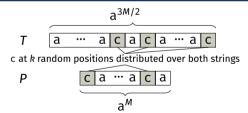




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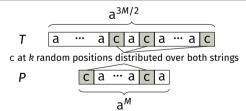




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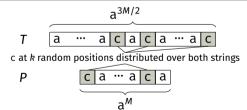




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If P has HD $\geq 2k$ and < 8k to a string w/period O(M/k), there are O(k) k-mism. occ's of P in T.

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Process P from left to right, M/8k new characters at a time.





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■ If a fragment has a period > M/128k, add it to the found breaks.





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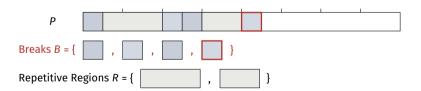




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■ If we found 2k breaks, return the breaks.

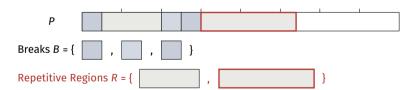




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If the total length of the repetitive regions is $> 3/8 \cdot M$, return the repetitive regions.





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If we reach the end of P, try to find a single repetitive region starting from the end.





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```
P
Breaks B = { }
Repetitive Regions R = { }
```

■ If we again don't obtain a repetitive region, *P* is almost periodic.





Key Lemma (Analyze) 🗸

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Obtaining Fast Algorithms: Fast PILLAR Algorithms

The PILLAR operations: LCP, LCPR, IPM, Length, Access, Extract

Theorem (PILLAR Alg. for PM w/ Mism.)

Given a pattern P of length m, a text T of length n, and a positive threshold $k \le m$, we can compute (a representation of) all k-mismatch occurrences of P in T using $O(n/m \cdot k^2 \log \log k)$ time plus $O(n/m \cdot k^2)$ PILLAR operations.





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Improved Structural Insights

Theorem (PILLAR Alg. for PM w/ Errors)

Given a pattern P of length m, a text T of length n, and a positive threshold $k \le m$, we can compute (a representation of) all k-error occurrences of P in T using $O(n/m \cdot k^4)$ PILLAR operations.





Obtaining Fast Algorithms: The Standard Setting

The PILLAR operations: LCP, LCP^R, IPM, Length, Access, Extract Uncompressed strings: pattern *P* of length *M*, text *T* of length *N*.





Obtaining Fast Algorithms: The Standard Setting

The PILLAR operations: LCP, LCP R , IPM, Length, Access, Extract Uncompressed strings: pattern P of length M, text T of length N. We can implement each operation in O(1) time. (After O(N+M) preprocessing.)





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For any positive threshold $k \le M$, we can compute all k-mismatch occ's of P in T in time $O(N + N/M \cdot k^2 \log \log k)$.

Theorem (Algorithm for PM w/ Errors)

For any positive threshold $k \le M$, we can compute (starting positions of) all k-error occ's of P in T in time $O(N + N/M \cdot k^4)$.





Obtaining Fast Algorithms: The Fully-Compressed Setting

The PILLAR operations: LCP, LCP^R, IPM, Length, Access, Extract SLPs: $G_{\rm R}$ of size m generating pattern P, $G_{\rm T}$ of size n generating text T.





(After $O((n + m) \log(|P| + |T|))$) preprocessing.)

Obtaining Fast Algorithms: The Fully-Compressed Setting

The PILLAR operations: LCP, LCP^R, IPM, Length, Access, Extract SLPs: G_P of size m generating pattern P, G_T of size n generating text T. Using Recompression [Jeż'15], we can implement each operation in $O(\log^3(|P| + |T|))$ time.





Obtaining Fast Algorithms: The Fully-Compressed Setting

(Reporting of all occ's takes time linear in the number of occ's.)

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Theorem (Algorithm for PM w/ Mism.)

For any positive threshold $k \le |P|$, we can compute the number of all k-mismatch occ's of P in T in time $O(m \log(|P| + |T|) + nk^2 \log^3(|P| + |T|))$.

Theorem (Algorithm for PM w/ Errors)

For any positive threshold $k \le |P|$, we can compute the number of all k-error occ's of P in T in time $O(m \log(|P| + |T|) + nk^4 \log^3(|P| + |T|))$. (Reporting of all occ's takes time linear in the number of occ's.)





Obtaining Fast Algorithms: The Dynamic Setting

The PILLAR operations: LCP, LCP^R, IPM, Length, Access, Extract Dynamic maintenance of a collection of (non-empty persistent) strings *X* of total length *N*; supporting makestring, concat, split.





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Dynamic maintenance of a collection of (non-empty persistent) strings X of total length N; supporting makestring, concat, split.

Using Optimal Dynamic Strings [Gawrychowski et al.'18], we can implement each PILLAR operation in $(w.h.p) O(log^2 N)$ time.





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For any two strings $P,T \in X$ and any threshold k, we support the additional operation "Find all k-mismatch occ's of P in T" in (w.h.p) $O(|T|/|P| \cdot k^2 \log^2 N)$ time.

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Navigation







