## Cross-Document Pattern Matching

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## Pattern Matching Problem

Given a text T and a pattern P, count all occurrences of P in T.



O(|P|) time, O(|T|) space

# Cross-Document Pattern Matching Problem

Given a set of documents  $T_1, T_2, \ldots, T_m$  and a pattern  $P = T_k[i..j]$ , count all occurrences of P in  $T_{\ell}$ .

#### Example

documents: genomic sequences pattern: a fragment of one of the sequences

# Cross-Document Pattern Matching Problem

Given a set of documents  $T_1, T_2, \ldots, T_m$  and a pattern  $P = T_k[i..j]$ , count all occurrences of P in  $T_{\ell}$ .



Standard solution: O(|P|) time,  $O(|T_{\ell}|)$  space

Faster solution? Yes.

## Variants

- Counting
- Reporting
- Document counting and reporting
- Dynamic counting and reporting

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# Counting

Given a set of documents  $T_1, T_2, \ldots, T_m$  and a pattern  $P = T_k[i..j]$ , count all occurrences of P in  $T_\ell$ .

- 1) identify a position p of some occurrence of P in  $T_{\ell}$
- 2) find the locus of  $T_{\ell}[p..p+|P|-1]$  in  $ST(T_{\ell})$ , and retrieve the number of leaves in its subtree



1) identify a position p of some occurrence of P in  $T_{\ell}$ 



 $p_1, p_2$ : starting positions of the closest to  $\mathcal{T}_k[i..]$  suffixes of  $\mathcal{T}_\ell$ 

- $r_1 = select(\ell, rank(D[1..r-1], \ell))$
- $r_2 = select(\ell, rank(D[1..r-1], \ell) + 1)$

[Golynski et al. 2006] Rank and select queries on D can be supported in O(1) and  $O(\log \log m)$  time respectively.

1) identify a position p of some occurrence of P in  $T_{\ell}$ 



 $\Rightarrow$  Positions  $p_1$  and  $p_2$  can be computed in  $O(\log \log m)$  time.

- P occurs at  $p_1 \Leftrightarrow lcp(T_\ell[p_1..], T_k[i..]) \ge |P|$ .
- Step 1 takes  $O(\log \log m)$  time.

2) find the locus of  $T_{\ell}[p..p+|P|-1]$  in  $ST(T_{\ell})$ , and retrieve the number of leaves in its subtree



weight(w): string depth of a node w w = wla(v, q): the ancestor of v of minimal depth s.t. weight(w)  $\geq q$ u = wla(v, |P|)

## Weighted Level Ancestor Problem

[Farach et al. 1996, Amir et al. 2007] w = wla(v, q) can be found in  $O(\log \log W)$  time and linear space, where W is the maximal weight of a node in the tree.

#### Theorem

w = wla(v, q) can be found in  $O(\min\{\sqrt{\log n_w} / \log \log n_w, \log \log q\})$  time and linear space.



2) find the locus of  $T_{\ell}[p..p+|P|-1]$  in  $ST(T_{\ell})$ , and retrieve the number of leaves in its subtree



 $u = wla(v, |P|), n_u = occ$ 

 $\Rightarrow$  *u* can be found in min{ $\sqrt{\log occ/\log \log occ}$ ,  $\log \log |P|$ } time.

2) find the locus of  $T_{\ell}[p..p+|P|-1]$  in  $ST(T_{\ell})$ , and retrieve the number of leaves in its subtree



#### Theorem

Counting takes  $O(t + \log \log m)$  time and O(n) space, where  $t = \min\{\sqrt{\log occ} / \log \log occ, \log \log |P|\}.$ 

## Variants

- Counting
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# Reporting

Given a set of documents  $T_1, T_2, ..., T_m$  and a pattern  $P = T_k[i..j]$ , report all occurrences of P in  $T_\ell$ .

- 1) identify a position p of  $T_{\ell}$  at which P occurs Step 1 of Counting, takes  $O(\log \log m)$  time
- 2) report all s:  $lcp(T_{\ell}[p..], T_{\ell}[s..]) \ge |P|$



$$\Leftrightarrow \mathit{lcp}(\mathit{T}_{\ell}[p..], \mathit{T}_{\ell}[s..]) \geq |\mathsf{P}|$$

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# Reporting: step 2

2) report all s: 
$$lcp(T_{\ell}[p..], T_{\ell}[s..]) \ge |P|$$

$$SA(T_{\ell}) \longleftrightarrow T_{\ell}[p..] \mapsto$$

while  $lcp(T_{\ell}[s..], T_{\ell}[p..]) \ge |P|$ , report s

#### Theorem

Reporting takes  $O(\log \log m + occ)$  time and O(n) space.

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## Document counting and reporting

Given a set of documents  $T_1, T_2, \ldots, T_m$  and a pattern  $P = T_k[i..j]$ , count or report all documents in which P occurs.

- 1) find u = locus(P) in the generalized suffix tree **Reduction to the WLA Problem**  $O(\min\{\sqrt{\log docc} / \log \log docc, \log \log |P|\})$  time
- 2) report or count distinct documents in the subtree of u



## Document counting and reporting

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 find u = locus(P) in the generalized suffix tree Reduction to the WLA Problem O(min{√log docc/log log docc, log log |P|}) time
 report or count distinct documents in the subtree of u



# Document counting and reporting: step 2

2) report or count distinct documents in the subtree of  $u \Leftrightarrow$  report or count distinct documents in the corresponding segment of the document array D

[Muthukrishnan 2002] Reporting of distinct documents in a segment of D takes O(ndocs) time and O(n) space.

#### Theorem

Document reporting takes O(t + ndocs) time and O(n) space, where  $t = \min\{\sqrt{\log docc} / \log \log docc, \log \log |P|\}$ .

[Bozanis et al. 1995] Counting of distinct documents in a segment of D takes  $O(\log n)$  time and O(n) space.

#### Theorem

Document counting takes  $O(\log n)$  time and O(n) space.

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## Dynamic counting and reporting

Given a set of documents  $T_1, T_2, \ldots, T_m$  and a pattern  $P = T_k[i..j]$ , count all occurrences of P in  $T_\ell$ . Dynamic operation: adding a document.

- 1) find a position p of some occurrence of P in  $T_\ell$
- 2) find the locus of  $T_{\ell}[p..p+|P|-1]$  in  $ST(T_{\ell})$ , and retrieve the number of leaves in its subtree

## Dynamic counting and reporting

Given a set of documents  $T_1, T_2, \ldots, T_m$  and a pattern  $P = T_k[i..j]$ , count all occurrences of P in  $T_\ell$ . Dynamic operation: adding a document.

1) find a position p of some occurrence of P in  $T_{\ell} - O(\log n)$  time

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[Dietz et al. 1987] to compare ranks of any two leaves in O(1) time Suffix array of  $\mathcal{T}_\ell$ 

## Summary of the results

m, n: the number of the documents and their total length resp.

- Counting:  $O(\log \log m + \min\{\sqrt{\log occ}, \log \log |P|\})$  time
- Reporting:  $O(\log \log m + occ)$  time
- Document counting: O(log n) time
- ► Document reporting:  $O(\min{\{\sqrt{\log docc / \log \log docc}, \log \log |P|\}} + ndocs)$  time
- Dynamic counting: O(log n) time
- Dynamic reporting: O(log n + occ) time (update: O(log n) time per letter)

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- Counting:  $O(\log \log m + \min\{\sqrt{\log occ} / \log \log occ, \log \log |P|\})$  time
- Reporting:  $O(\log \log m + occ)$  time
- Document counting: O(log n) time
- ► Document reporting:  $O(\min{\{\sqrt{\log docc / \log \log docc}, \log \log |P|\}} + ndocs)$  time
- Dynamic counting: O(log n) time
- Dynamic reporting: O(log n + occ) time
  (update: O(log n) time per letter)
- Succinct data structures for counting, reporting and document reporting