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# 5

# Parallel String Matching

7 March 2022

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# **Learning Outcomes**

- **1.** Know and apply *parallelization strategies* for embarrassingly parallel problems.
- 2. Identify limits of parallel speedups.
- **3.** Understand *string matching by duels*, both sequential and parallel (excluding preprocessing).

Unit 5: Parallel String Matching



#### **Outline**

# **5** Parallel String Matching

- 5.1 Elementary Tricks
- 5.2 Periodicity
- 5.3 String Matching by Duels

# Parallelizing string matching

- ▶ We have seen a plethora of string matching methods
- But all efficient methods seem inherently sequential Indeed, they became efficient only after building on knowledge from previous steps!

Sounds like the *opposite* of parallel!

- → This unit:
  - ► How well can we parallelize string matching?
  - ► What new ideas can help?

```
Here: string matching = find all occurrences of P in T (more natural problem for parallel) always assume m \le n
```



# **Embarrassingly Parallel**

- ► A problem is called "embarrassingly parallel" if it can immediately be split into many, small subtasks that can be solved completely independently of each other
- ► Typical example: sum of two large matrices (all entries independent)
- → best case for parallel computation (simply assign each processor one subtask)
- Sorting is not embarrassingly parallel
  - ▶ no obvious way to define many *small* (=efficiently solvable) subproblems
  - but: some subtasks of our algorithms are, e.g., comparing all elements with pivot

# **Clicker Question**

Is the string-matching problem "embarrassingly parallel"?



- A) Yes
- B No
- C Only for  $n \gg m$
- **D** Only for  $n \approx m$

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# Elementary parallel string matching

#### Subproblems in string matching:

- ▶ string matching = check all guesses i = 0, ..., n m 1
- ▶ checking one guess is a subtask!

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#### Approach 1:

Check all guesses in parallel

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→ Time: Θ(m) using sequential checks Θ(\log m) on CREW-PRAM (\leadsto see tutorials) Θ(1) on CRCW-PRAM (\leadsto see tutorials) \leadsto Work: Θ((n-m)m) \leadsto not great . . .
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- ▶ string matching = check all guesses i = 0, ..., n m 1
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#### Approach 1:

- ► Check all guesses in parallel
- $\rightsquigarrow$  **Time**:  $\Theta(m)$  using sequential checks
  - $\Theta(\log m)$  on CREW-PRAM ( $\leadsto$  see tutorials)
  - $\Theta(1)$  on CRCW-PRAM ( $\rightsquigarrow$  see tutorials)
- $\rightsquigarrow$  **Work**:  $\Theta((n-m)m) \rightsquigarrow$  not great . . .

#### Approach 2:

- ▶ Divide T into **overlapping** blocks of 2m characters: T[0..2m), T[m..3m), T[2m..4m), T[3m..5m)...
- ▶ Find matches inside blocks in parallel, using efficient sequential method
  - $\rightarrow$   $\Theta(2m+m) = \Theta(m)$  each

- O(n+m) = O(n)
- $\rightsquigarrow$  **Time**:  $\Theta(m)$  **Work**:  $\Theta(\frac{n}{m} \cdot m) = \Theta(n)$



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A  $\frac{\text{Yes}}{\text{B}}$ B  $\frac{\text{Ne}}{\text{C}}$ C Only for  $n \gg m$ 

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# **Elementary parallel matching – Discussion**

- very simple methods
- $\triangle$  could even run distributed with access to part of T
- $\bigcap$  parallel speedup only for  $m \ll n$

#### Goal:

- work-efficient methods with better parallel time?
- → must genuinely parallelize the matching process!
- → need new ideas

→ higher speedup

(and the preprocessing of the pattern)

# 5.2 Periodicity

# **Periodicity of Strings**

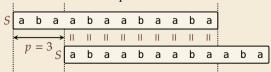
- ► S = S[0..n 1] has period p iff  $\forall i \in [0..n p) : S[i] = S[i + p]$
- ▶ p = 0 and any  $p \ge n$  are trivial periods but these are not very interesting . . .

#### **Examples:**

 $\triangleright$  *S* = baaababaaab has period 6:



 $\triangleright$  *S* = abaabaabaaba has period 3:



# Periodicity and KMP

#### **Lemma 5.1 (Periodicity = Longest Overlap)**

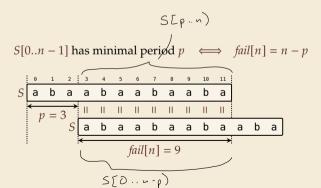
```
p \in [1..n] is the shortest period in S = S[0..n - 1] iff S[0..n - p) is the longest prefix that is also a suffix of S[p..n).
```

⋖.

# f391040009648444a80ed5484188e834

#### **Lemma 5.1 (Periodicity = Longest Overlap)**

 $p \in [1..n]$  is the *shortest* period in S = S[0..n - 1] iff S[0..n - p) is the longest prefix that is also a suffix of S[p..n).



# **Periodicity Lemma**

#### **Lemma 5.2 (Periodicity Lemma)**

If string S = S[0..n-1] has periods p and q with  $p+q \le n$ , then it has also period  $\gcd(p,q)$ .

#### Proof:



# **Periodic strings**

- ▶ What does the smallest period p tell us about a string S[0..n)?
- ► Two distinct regimes:

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**1.** S is periodic:  $p \leq \frac{n}{2}$ 

More precisely: S is totally determined by a string F = F[0..p) = S[0..p)S keeps repeating F until n characters are filled

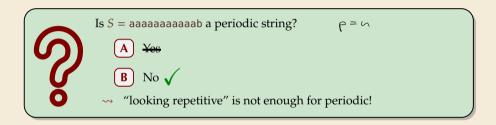
- $\rightarrow$  S is highly repetitive!
- 2. *S* is *aperiodic* (also *non-periodic*):  $p > \frac{n}{2}$  *S* cannot be written as  $S = F^k \cdot Y$  with  $k \ge 2$  and Y a prefix of F

# **Clicker Question**



- A Yes
- B No

# **Clicker Question**



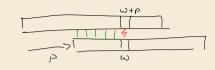
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5.3 String Matching by Duels

# **Periods and Matching**

#### Witnesses for non-periodicity:

- ightharpoonup Assume, P[0..m) does **not** have period p
- $\rightarrow$   $\exists$  witness against periodicity: position  $\omega \in [0..m p) : P[\omega] \neq P[\omega + p]$



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#### **Dueling via witnesses:**

▶ If P[0..m) does **not** have period p, then at most one of positions i and i + p can be (the first position of) an occurrence of P.

*Proof:* Cannot have 
$$T[(i+p)+\omega] = P[\omega] \neq P[\omega+p] = T[i+(\omega+p)].$$

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#### **Dueling via witnesses:**

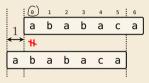
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*Proof:* Cannot have 
$$T[(i+p) + \omega] = P[\omega] \neq P[\omega + p] = T[i + (\omega + p)].$$

▶ **Duel** between guess i and i + p: compare text character overlapped with witness  $\omega$ 



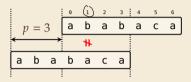
Paperiodic



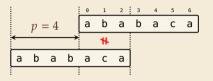
p	1	
$\omega[p]$	0	



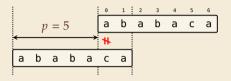
р	1	2	
$\omega[p]$	0	3	



1	2	3	
0	3	1	
			1 2 3 0 3 1



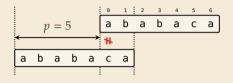
p	1	2	3	4	
$\omega[p]$	0	3	1	1	



_	р	1	2	3	4	5
	$\omega[p]$	0	3	1	1	0

**1.** Compute witnesses against periodicity for P = ababaca

p=6 smallest period



p	1	2	3	4	5
$\omega[p]$	0	3	1	1	0

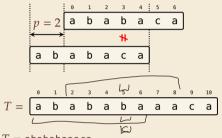
**2.** Duel! T = abababaaaca



p	1	2	3	4	5
$\omega[p]$	0	3	1	1	0

$$T = \begin{bmatrix} 0 & 1 & 2 & 3 & 4 & 5 & 6 & 7 & 8 & 9 & 10 \\ a & b & a & b & a & b & a & a & a & c & a \end{bmatrix}$$

- **2.** Duel! T = abababaaaca
  - ▶ **0 vs. 1** p = 1,  $\omega = 0$   $\longrightarrow$   $T[1] = b \neq P[\omega]$   $\longrightarrow$  No occurrence at 1!



- **2.** Duel! T = abababaaaca
  - ▶ **0 vs. 1**  $p = 1, \omega = 0 \implies T[1] = b \neq P[\omega] \implies \text{No occurrence at } 1!$
  - ▶ 0 vs. 2 p = 2,  $\omega = 3 \rightarrow T[5] = b \neq c = P[\omega + p] \rightarrow No$  occurrence at 0!



p	,	1	2	3	4	5
ω[	<i>p</i> ]	0	3	1	1	0

$$T = \begin{bmatrix} a & b & a & b & a & b & a & a & a & c & a \\ a & b & a & b & a & b & a & a & a & c & a \end{bmatrix}$$

- **2.** Duel! T = abababaaaca
  - ▶ 0 vs. 1  $p = 1, \omega = 0 \implies T[1] = b \neq P[\omega] \implies \text{No occurrence at } 1!$
  - ▶ 0 vs. 2 p = 2,  $\omega = 3 \implies T[5] = b \neq c = P[\omega + p] \implies$  No occurrence at 0!
  - ▶ 2 vs. 3 p = 1,  $\omega = 0 \implies T[3] = b \neq a = P[\omega] \implies$  No occurrence at 3!

# String Matching by Duels – Sequential

Assume that pattern P is *aperiodic*.

(can deal with periodic case separately; details omitted)

#### Algorithm:

- **1.** Set  $\mu := \lfloor \frac{m}{2} \rfloor$
- **2.** Compute witnesses  $\omega[1..\mu]$  against periodicity for all  $p \leq \frac{m}{2}$ .
- 3. For each block of  $\mu$  consecutive indices  $[0..\mu)$ ,  $[\mu..2\mu)$ ,  $[2\mu..3\mu)$ , . . . run  $\mu-1$  duels to eliminate all but one guess in the block
- **4.** check remaining  $\lceil \frac{n}{\mu} \rceil = O(n/m)$  guesses naively

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 $\rightarrow$  another worst-case O(n + m) string matching method!

#### **Analysis:**

- **1.** O(1)
- 2.  $O(m) \rightsquigarrow later$
- 3.  $O(\frac{n}{m})$  blocks O(m) duels each
- 4.  $O(\frac{n}{m})$ ,  $\leq m$  cmps each

# **String Matching by Duels – Parallel**

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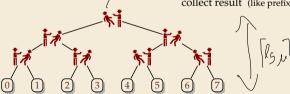
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#### How to parallelize:

- 1. —
- 2.  $O(\log^2(m)) \rightsquigarrow \text{later}$
- 3. blocks in parallel (indep.), tournament of  $\lceil \lg \mu \rceil$  rounds
- **4.** check in parallel collect result (like prefix sum)

#### Tournament of duals:

- each dual eliminates one guess
- → declare other guess winner
- conceptually like (prefix) sum!



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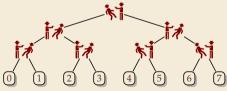
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 $\longrightarrow$  Matching part can be done in  $O(\log m)$  parallel time and O(n) work!

# **Computing witnesses**

It remains to find the witnesses  $\omega[1..\mu]$ .

#### sequentially:

- ▶ an elementary procedure is similar in spirit to KMP failure array
- ightharpoonup can be computed in  $\Theta(m)$  time

#### parallel:

- ► much more complicated → beyond scope of the module
  - first  $O(\log^2(m))$  time on CREW-RAM
  - ▶ later  $O(\log m)$  time and O(m) work using *pseudoperiod method*

# Parallel Matching – State of the art

- $ightharpoonup O(\log m)$  time & work-efficient parallel string matching
- ▶ this is optimal for CKEW-1 RGM.

   on CRCW-PRAM: matching part even in O(1) time (  $\leadsto$  tutorials)

   but preprocessing requires  $\Theta(\log\log m)$  time