$$
\begin{aligned}
& \text { ALGORITHMICS WAPPLIED } \\
& \text { APPLIEDALGORITHMICS\$ } \\
& \text { CS \$ APPLIEDALGORITHMI } \\
& \text { D A LGORITHMICS \$ APPLIE } \\
& \text { EDALGORITHMICS\$APPLI } \\
& \text { GORITHMICS\$APPLIEDAL } \\
& \text { HMICS \$ APPLIEDALGORIT } \\
& 10 \text { March } 2021 \\
& \text { Sebastian Wild }
\end{aligned}
$$

## Outline

## 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!
$\rightsquigarrow$ This unit:

- How well can we parallelize string matching?
- What new ideas can help?

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

### 5.1 Elementary Tricks

## 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)
$\rightsquigarrow$ 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 $n \approx m$
sli.do/comp526

## Elementary parallel string matching

Subproblems in string matching:

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


## Elementary parallel string matching

Subproblems in string matching:

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

Approach 1:

- Check all guesses in parallel
$\rightsquigarrow$ Time: $\Theta(m)$
$\rightsquigarrow$ Work: $\Theta((n-m) m) \rightsquigarrow$ not great...


## Elementary parallel string matching

Subproblems in string matching:

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

Approach 1:

- Check all guesses in parallel
$\rightsquigarrow$ Time: $\Theta(m)$
$\rightsquigarrow$ Work: $\Theta((n-m) m) \rightsquigarrow$ not great...


## Approach 2:

- Divide $T$ into overlapping blocks of $2 m$ characters: $T[0 . .2 m), T[m . .3 m), T[2 m . .4 m), T[3 m . .5 m) . .$.
- Find matches inside blocks in parallel, using efficient sequential method $\rightsquigarrow \Theta(2 m+m)=\Theta(m)$ each
$\rightsquigarrow$ Time: $\Theta(m)$ Work: $\Theta\left(\frac{n}{m} \cdot m\right)=\Theta(n)$


## Clicker Question

Is the string-matching problem "embarrassingly parallel"?
(A) Yes
(B) No
(C) Only for $n \gg m$
(D) Only for $n \approx m$
sli.do/comp526

## Clicker Question

Is the string-matching problem "embarrassingly parallel"?

(A)
(B) N
(C) Only for $n \gg m \sqrt{ }$
(D)
sli.do/comp526

## Elementary parallel matching - Discussion

$\leftrightarrow$
very simple methods
0 could even run distributed with access to part of $T$
q parallel speedup only for $m \ll n$

## Goal:

- methods with better parallel time! $\rightsquigarrow$ higher speedup
$\rightsquigarrow$ must genuinely parallelize the matching process! (and the preprocessing of the pattern)
$\rightsquigarrow$ need new ideas


### 5.2 Periodicity

## Periodicity of Strings

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


## Examples:

- $S=$ baaababaaab has period 6:

- $S=$ 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 $S[p . . n)$.

## 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 $S[p . . n)$.
$S[0 . . n-1]$ has minimal period $p \Longleftrightarrow$ fail $[n]=n-p$


## Periodicity Lemma

## Lemma 5.2 (Periodicity Lemma)

If string $S=S[0 . . n-1]$ has periods $p$ and $q$ with $p+q \leq n$, then it has also period $\operatorname{gcd}(p, q)$.
greatest common divisor
Proof: see tutorials; hint: recall Euclid's algorithm

## Periodic strings

- What does the smallest period $p$ tell us about a string $S[0 . . n-1]$ ?
- Two distinct regimes:

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

More precisely: $S$ is totally determined by a string $F=F[0 . . p-1]=S[0 . . p-1]$
$S$ keeps repeating $F$ until $n$ characters are filled
$\rightsquigarrow S$ 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 $k \geq 2$ and $Y$ a prefix of $F$

## Clicker Question

Is $S=$ aaaaaaaaaaab a periodic string?
(A) Yes
(B) No
sli.do/comp526

## Clicker Question

Is $S=$ aaaaaaaaaaab a periodic string?
(A)
(B) No $\sqrt{ }$
$\rightsquigarrow$ "looking repetitive" is not enough for periodic!
sli.do/comp526

### 5.3 String Matching by Duels

## Periods and Matching

## Witnesses for non-periodicity:

- Assume, $P[0 . . m-1]$ does not have period $p$
$\rightsquigarrow \exists$ witness against periodicity: position $\omega \in[0 . . m-p): P[\omega] \neq P[\omega+p]$


## Periods and Matching

## Witnesses for non-periodicity:

- Assume, $P[0 . . m-1]$ does not have period $p$
$\rightsquigarrow \exists$ witness against periodicity: position $\omega \in[0 . . m-p): P[\omega] \neq P[\omega+p]$


## Dueling via witnesses:

- If $P[0 . . m-1]$ does not have period $p$, then at most one of positions $i$ and $i+p$ can be (the starting position of) an occurrence of $P$.

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

## Periods and Matching

## Witnesses for non-periodicity:

- Assume, $P[0 . . m-1]$ does not have period $p$
$\rightsquigarrow \exists$ witness against periodicity: position $\omega \in[0 . . m-p): P[\omega] \neq P[\omega+p]$


## Dueling via witnesses:

- If $P[0 . . m-1]$ does not have period $p$, then at most one of positions $i$ and $i+p$ can be (the starting position of) an occurrence of $P$.

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 $\omega$



## String Matching by Duels - Sequential

Assume that pattern $P$ is aperiodic.
(can deal with periodic case separately; details omitted)

## Algorithm:

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

## String Matching by Duels - Sequential

Assume that pattern $P$ is aperiodic.
(can deal with periodic case separately; details omitted)

## Algorithm:

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

## Analysis:

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

## String Matching by Duels - Parallel

Assume that pattern $P$ is aperiodic.
(can deal with periodic case separately; details omitted)

## Algorithm:

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

## String Matching by Duels - Parallel

Assume that pattern $P$ is aperiodic.
(can deal with periodic case separately; details omitted)

## Algorithm:

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

## How to parallelize:

1.     - 
2. $O\left(\log ^{2}(m)\right) \rightsquigarrow$ 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
$\rightsquigarrow$ declare other guess winner
- conceptually like prefix sum!



## String Matching by Duels - Parallel

Assume that pattern $P$ is aperiodic.
(can deal with periodic case separately; details omitted)

## Algorithm:

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

## How to parallelize:

1.     - 
2. $O\left(\log ^{2}(m)\right) \rightsquigarrow$ 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
$\rightsquigarrow$ declare other guess winner
- conceptually like prefix sum!

$\rightsquigarrow$ 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
- can be computed in $\Theta(m)$ time


## parallel:

- much more complicated $\rightsquigarrow$ beyond scope of the module
- first $O\left(\log ^{2}(m)\right)$ time on CREW-RAM
- later $O(\log m)$ time and $O(m)$ work using pseudoperiod method


## Parallel Matching - State of the art

- $O(\log m)$ time \& work-efficient parallel string matching
- this is optimal for CREW-PRAM
- on CRCW-PRAM: matching part even in $O(1)$ time(!) but preprocessing requires $\Theta(\log \log m)$ time

