## Tree Algorithms



## Euler Circuits

Every node $v$ fixes an arbitrary ordering among its adjacent nodes:

$$
u_{0}, u_{1}, \ldots, u_{d-1}
$$

We obtain an Euler tour by setting

$$
\operatorname{succ}\left(\left(u_{i}, v\right)\right)=\left(v, u_{(i+1)} \bmod d\right)
$$

## Euler Circuits

## Lemma 1

An Euler circuit can be computed in constant time $\mathcal{O}(1)$ with $\mathcal{O}(n)$ operations.

## Euler Circuits - Applications

## Rooting a tree

- split the Euler tour at node $r$
- this gives a list on the set of directed edges (Euler path)
- assign $x[e]=1$ for every edge;
- perform parallel prefix; let $s[\cdot]$ be the result array
- if $s[(u, v)]<s[(v, u)]$ then $u$ is parent of $v$;


## Euler Circuits - Applications

## Postorder Numbering

- split the Euler tour at node $r$
- this gives a list on the set of directed edges (Euler path)
- assign $x[e]=1$ for every edge $(v, \operatorname{parent}(v))$
- assign $x[e]=0$ for every edge $(\operatorname{parent}(v), v)$
- perform parallel prefix
- $\operatorname{post}(v)=s[(v, \operatorname{parent}(v))] ; \operatorname{post}(r)=n$


## Euler Circuits - Applications

## Level of nodes

- split the Euler tour at node $r$
- this gives a list on the set of directed edges (Euler path)
- assign $x[e]=-1$ for every edge $(v$, parent $(v))$
- assign $x[e]=1$ for every edge $(\operatorname{parent}(v), v)$
- perform parallel prefix
- level $(v)=s[(\operatorname{parent}(v), v)] ; \operatorname{level}(r)=0$


## Euler Circuits - Applications

## Number of descendants

- split the Euler tour at node $r$
- this gives a list on the set of directed edges (Euler path)
- assign $x[e]=0$ for every edge $(\operatorname{parent}(v), v)$
- assign $x[e]=1$ for every edge $(v, \operatorname{parent}(v)), v \neq r$
- perform parallel prefix
- $\operatorname{size}(v)=s[(v, \operatorname{parent}(v))]-s[(\operatorname{parent}(v), v)]$


## Rake Operation

Given a binary tree $T$.
Given a leaf $u \in T$ with $p(u) \neq r$ the rake-operation does the following

- remove $u$ and $p(u)$
- attach sibling of $u$ to $p(p(u))$



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By choosing leaves carefully we ensure that none of the above cases occurs

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- A=even leaves


## Observations

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- two leaves that are siblings do not perform a rake operation in the same round because one is even and one odd at the start of the round
- two leaves that have adjacent parents either have different parity (even/odd) or they differ in the type of child (left/right)

Cases, when the left edge btw. $p(u)$ and $p(v)$ is a left-child edge.


## Example



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- the intial parallel prefix also requires time $\mathcal{O}(\log n)$ and work $\mathcal{O}(n)$


## Evaluating Expressions

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## Invariant:

Let $u$ be internal node with children $v$ and $w$. Then

$$
\operatorname{val}(u)=\left(a_{v} \cdot \operatorname{val}(v)+b_{v}\right) \otimes\left(a_{w} \cdot \operatorname{val}(w)+b_{w}\right)
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where $\otimes \in\{*,+\}$ is the operation at node $u$.

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Initially, we can choose $a_{v}=1$ and $b_{v}=0$ for every node.

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a_{u} \cdot[ & \left.x_{1}+\left(a_{w} \cdot \operatorname{val}(w)+b_{w}\right)\right]+b_{u} \\
& =\underbrace{a_{u} a_{w}}_{a_{w}^{\prime}} \cdot \operatorname{val}(w)+\underbrace{a_{u} x_{1}+a_{u} b_{w}+b_{u}}_{b_{w}^{\prime}}
\end{aligned}
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If we change the $a$ and $b$-values during a rake-operation according to the previous slide we can calculate the value of the root in the end.

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## Lemma 2

We can evaluate an arithmetic expression tree in time $\mathcal{O}(\log n)$ and work $\mathcal{O}(n)$ regardless of the height or depth of the tree.

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## Lemma 2

We can evaluate an arithmetic expression tree in time $\mathcal{O}(\log n)$ and work $\mathcal{O}(n)$ regardless of the height or depth of the tree.

By performing the rake-operation in the reverse order we can also compute the value at each node in the tree.

## Lemma 3

We compute tree functions for arbitrary trees in time $\mathcal{O}(\log n)$ and a linear number of operations. proof on board...

In the LCA (least common ancestor) problem we are given a tree and the goal is to design a data-structure that answers LCA-queries in constant time.

## Least Common Ancestor

LCAs on complete binary trees (inorder numbering):


The least common ancestor of $u$ and $v$ is

$$
z_{1} z_{2} \ldots z_{i} 10 \ldots 0
$$

where $z_{i+1}$ is the first bit-position in which $u$ and $v$ differ.

## Least Common Ancestor



nodes | 1 | 2 | 3 | 2 | 4 | 5 | 4 | 6 | 4 | 7 | 4 | 2 | 1 | 8 | 1 | 9 | 1 |
| :--- | :--- | :--- | :--- | :--- | :--- | :--- | :--- | :--- | :--- | :--- | :--- | :--- | :--- | :--- | :--- | :--- |

levels | 0 | 1 | 2 | 1 | 2 | 3 | 2 | 3 | 2 | 3 | 2 | 1 | 0 | 1 | 0 | 1 | 0 |
| :--- | :--- | :--- | :--- | :--- | :--- | :--- | :--- | :--- | :--- | :--- | :--- | :--- | :--- | :--- | :--- | :--- |

$\ell(v)$ is index of first appearance of $v$ in node-sequence.
$r(v)$ is index of last appearance of $v$ in node-squence.
$\ell(v)$ and $r(v)$ can be computed in constant time, given the node- and level-sequence.

## Least Common Ancestor

## Lemma 4

1. $u$ is ancestor of $v$ iff $\ell(u)<\ell(v)<r(u)$
2. $u$ and $v$ are not related iff either $r(u)<\ell(v)$ or $\ell(u)<r(v)$
3. suppose $r(u)<\ell(v)$ then $\operatorname{LCA}(u, v)$ is vertex with minimum level over interval $[r(u), \ell(v)]$.

## Range Minima Problem

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The goal in the range minima problem is to preprocess the array such that range minima queries can be answered quickly (constant time).

## Observation

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For solving the LCA-problem it is sufficient to solve the where two successive elements in the array just differ by +1 or -1

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Given an algorithm for solving the range minima problem in time $T(n)$ and work $W(n)$ we can obtain an algorithm that solves the LCA-problem in time $\mathcal{O}(T(n)+\log n)$ and work $\mathcal{O}(n+W(n))$.

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## Remark

In the sequential setting the LCA-problem and the range minima problem are equivalent. This is not necessarily true in the parallel setting.

For solving the LCA-problem it is sufficient to solve the restricted range minima problem where two successive elements in the array just differ by +1 or -1 .

## Prefix and Suffix Minima

Tree with prefix-minima and suffix-minima:


- Suppose we have an array $A$ of length $n=2^{k}$
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Given the tree $T$ we can answer a range minimum query $(\ell, r)$ in constant time.

- we can determine the LCA $x$ of $\ell$ and $r$ in constant time since $T$ is a complete binary tree
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- The minimum of these two values is the result.


## Lemma 5

We can solve the range minima problem in time $\mathcal{O}(\log n)$ and work $\mathcal{O}(n \log n)$.

## Reducing the Work

Partition $A$ into blocks $B_{i}$ of length $\log n$

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Preprocess each $B_{i}$ block separately by a sequential algorithm so that range-minima queries within the block can be answered in constant time. (how?)

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Use the previous algorithm on the array $\left(x_{1}, \ldots, x_{n / \log n}\right)$.

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- if $\ell$ and $r$ are from the same block the data-structure for this block gives us the result in constant time

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- if $\ell$ and $r$ are from the same block the data-structure for this block gives us the result in constant time
- if $\ell$ and $r$ are from different blocks the result is a minimum of three elements:
- the suffix minmum of entry $\ell$ in $\ell$ 's block
- the minimum among $x_{\ell+1}, \ldots, x_{r-1}$
- the prefix minimum of entry $r$ in $r$ 's block

