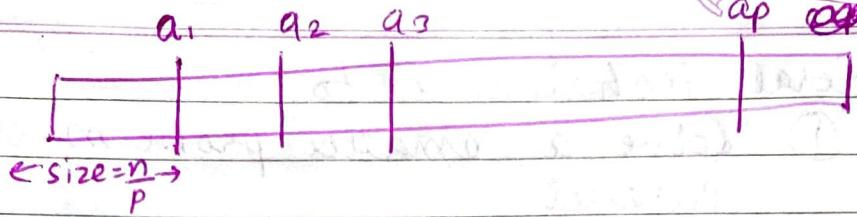


Parallel Search

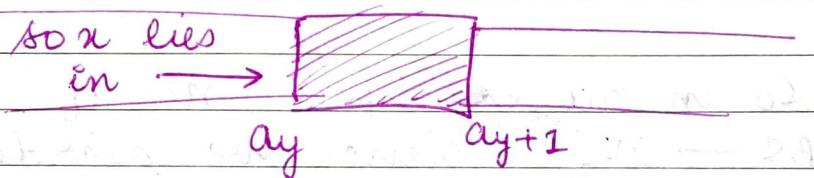
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Search 'x'

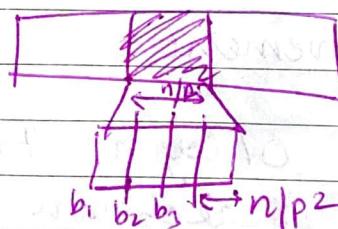
- ① Check $x \in a_1, a_2, \dots, a_p$ in parallel using p processors.
- ② So we will know which subproblem to solve as we'll get -

$$x < a_y \quad \& \quad x \geq a_{y+1}$$



So, in BS - $p=2$

- ③ So size of subproblem = $\frac{n}{p}$
- ④ So $\frac{n}{p}$ elements \times p processors
we further divide into p^2 subproblems



Again,

we check $x \in b_1, b_2, \dots, b_p$

Still making ' p ' comparisons

④ Continue recursively,
eventually subproblems will have
size ϵp^m at which point
we can look at each element
in parallel & give answer.

Time taken by parallel search:

size $\Rightarrow n, \frac{n}{p}, \dots p$
, subpr

$$T_m = \alpha r^{m-1}$$

$$p = n \times \left(\frac{1}{r}\right)^{m-1}$$

$$p^m = n$$

$$m = \frac{\log n}{\log p} = \log_p n$$

So, p comparisons ^{in parallel} in each subproblem
 $\star \log_p n$ subproblems

$$T(n) = T\left(\frac{n}{p}\right) + O(1)$$

$$\boxed{T(n) = O(\log_p n)}$$

Work Complexity

$$W(n) = W\left(\frac{n}{p}\right) + p = \boxed{O(p \log_p n)}$$

So, time is decreasing logarithmically in p but work is increasing linearly in p .

So what 'p' to use?

$$\left| \begin{array}{l} W(n) = O(p \log_p n) \\ \text{if } p = \sqrt{n} : W(n) = O(\sqrt{n}) \end{array} \right| \quad T(n) = O(\log_p n) \quad T(n) = O(1)$$

So if $p = \sqrt{n}$, we're spending $O(\sqrt{n})$ per search, which is a lot.

This is overkill in no. of processors.

$$\left| \begin{array}{l} p=1 : W(n) = O(\log n) \\ \text{↳ Same as binary search} \end{array} \right| \quad T(n) = O(\log n)$$

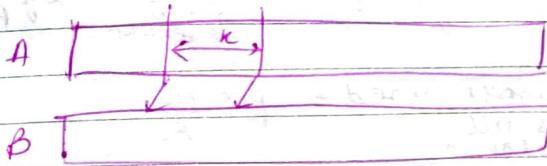
$$p = \log n : \left| \begin{array}{l} W(n) = O\left(\frac{\log^2 n}{\log \log n}\right) \\ T(n) = \frac{\log n}{\log \log n} \end{array} \right|$$

★ Tradeoff b/w $W(n)$ & $T(n)$

$$\text{if } p = n^\epsilon \quad \left| \begin{array}{l} T(n) = O(1) \\ W(n) = O(n^\epsilon) \end{array} \right.$$

Lecture 16: 9th March

From parallel search to merge



using parallel search, $\approx \sqrt{n}$ processors

- ① Rank \sqrt{n} elements of A into B using scratch
i.e. $k = \sqrt{n}$

- ② for every search use \sqrt{n} processors.

Time: ~~0(1)~~ $\log_2 n = O(1)$

~~Work~~ ~~O(1)~~ ~~O(n)~~ ~~O(n)~~ ~~O(n)~~

Work: for complete step = no. of processors used =

i.e. for all searches $\sqrt{n} \times \sqrt{n}$ \leftarrow searches ~~O(1)~~ ~~O(1)~~
processors in one search

∴ # processor = n

∴ Work = $O(1) \times n = O(n)$

for all searches

So, generally, using II search

Rank $\frac{n}{k}$ elements of A into B

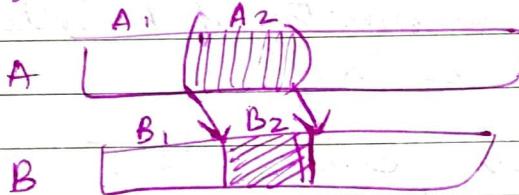
$$\text{Work} = \frac{n \times p}{k} \quad \text{Time} = \log_p n$$

across all searches across all searches

$$\text{processors used} = p \times \frac{n}{R}$$

across all searches

② Merge in sequential manner



$$\text{Time} = \begin{cases} O(1) & \text{for step 1} \\ O(|A_1| + |B_1|) \\ = O(\sqrt{n} + ?) \approx O(\sqrt{n}) & \text{step 2} \end{cases}$$

So, if we reduce no. of searches, no. of elements to merge go up and vice versa.

So, how to fix this?

Reduce time from $O(\sqrt{n})$ in merging

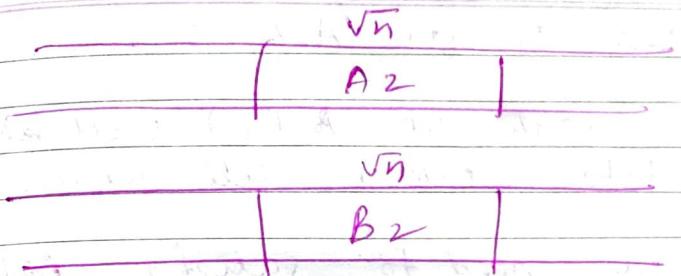
(Size of B can be reduced from \sqrt{n} to $\frac{\sqrt{n}}{2}$ as done in beg. of Lec 5)

~~Goal~~ Goal = Merge time $\downarrow \downarrow$ length $|A_2| / |B_2|$

depends on

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if we again divide $A \times B$. —

Choosing size of subproblem:

So, we rank the elements of A_2 in B_2
 $\approx \sqrt{n}$ processors

so,

$$\text{time} = O(1) \text{ per search}$$

$$\# \text{ processors per search} = \frac{\sqrt{n}}{t}$$

$$\rightarrow \boxed{\text{time}} = O(\log_p n)$$

$$= O\left(\log \frac{\sqrt{n}}{t}\right)$$

$$= O\left(\frac{\log \sqrt{n}}{\log \sqrt{n} - \log t}\right)$$

2. we want

$$O\left(\frac{\log \sqrt{n}}{\log \sqrt{n} - \log t}\right) = O(1) \quad \text{eq (i)}$$

$$\rightarrow \boxed{\text{work:}} = O(t \log_p n) \text{ per search}$$

$$= O(\cancel{\frac{\sqrt{n}}{t}} \cancel{\log} \cancel{\frac{\sqrt{n}}{t}} \cancel{O(\cancel{\log} \cancel{\frac{\sqrt{n}}{t}})})$$

$$\text{Total work} = \frac{\sqrt{n}}{t} \times t = \sqrt{n}$$

~~so, total work is still same~~

So ~~total~~ work for A_2B_2 is \sqrt{n}

Now,

total work (A_1A_2, A_2B_2) will be $\Theta(n)$

So, total work is still same.

But, we need to satisfy eq(i)

So, which t to pick?

$$\frac{\log \sqrt{n}}{\log \sqrt{n} - \log t} = O(1)$$

$$\log \sqrt{n} - \log t$$

$$\log \sqrt{n} = \log \text{for } \log t$$

$$\log t = 0$$

or $t = 1$

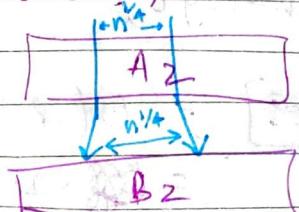
$$\frac{\log \sqrt{n}}{\log \sqrt{n} - \log t} = 2$$

$$\log \sqrt{n} = 2 \log t$$

$$t^2 = \sqrt{n}$$

$$t = \sqrt[4]{n} = n^{\frac{1}{4}}$$

But even here, $\approx t = n^{\frac{1}{4}}$



Merge time only went down from $n^{\frac{1}{2}}$ to $n^{\frac{1}{4}}$

So, again divide?

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$$n \rightarrow \sqrt{n} \rightarrow \sqrt{\sqrt{n}} \rightarrow n^{\frac{1}{8}} \rightarrow n^{\frac{1}{16}} \Rightarrow O(1)$$

Now

steps $\approx i$ where

$$n^{\frac{1}{2^i}} = O(1)$$

$$n^{\frac{1}{2^i}} = 2$$

$$\frac{1}{2^i} \log n = \log 2$$

$$\log n = 2^i$$

$$\boxed{\log \log n = i}$$

\Rightarrow # steps $= O(\log \log n)$

So, we do this recursively for $O(\log \log n)$ stages. At the end of these stages,



So, Total time \rightarrow

t searches done in parallel, each $\in O(1)$ time
 $\Rightarrow O(1)$ time in each stage

\Rightarrow So, $O(\log \log n)$ time ~~per search~~
totally.
~~(\log)~~

Total work for each search:

work per stage =

no. of searches in stage 1 = \sqrt{n}

~~work in each~~ ~~search~~ = \sqrt{n}

so, work in stage 1 = ~~$O(n)$~~ $O(n)$

searches in stage 2 = $n^{\frac{1}{4}} = t$

work in each search = $\frac{\sqrt{n}}{t} = n^{\frac{1}{4}}$

so, work in stage 2 = ~~$O(n)$~~ $O(n)$

so,

$\log \log n$ stages, each $\in O(n)$
work

$\Rightarrow O(n \log \log n)$ work.

if we do not have n processes but p , to simulate
 n processes $= p$, time will blow up by a factor of n/p

Is this optimal? No.

$O(n) \rightarrow$ seq.

$O(n \log \log n) \rightarrow$ parallel

Home - Work



POWER OF CRCW - Minima

Q Find minima of n elements.

Seq. algo $\rightarrow O(n)$

Parallel = use upward traversal,

Time = $O(\log n)$

Work = $O(n)$

★ We can do better = CRCW :

- ① \rightarrow First start with $O(n^2)$ work & $O(1)$ time
- ② \rightarrow Then sacrifice some time to gain optimality

① $O(1)$ time algo

a. Build a matrix $(n \times n)$ \rightarrow at every cell there is a processor.
 $\therefore n^2$ processors

b. each processor compare at i, j
compare $A[i] = A[j]$
if $A[i] > A[j]$ put 1 in cell
else put 0 in cell.

c. There will be some row = all zero ~~- diagonal~~
so, that $A[0][0]$ will be minima
to find such row with all zeroes:

① sum of row is $\neq 0$
 OR ② Bitwise OR → result = $\neq 0$

So,

| | | | | | | | |
|---|---|---|---|---|---|---|------------|
| 1 | 0 | 1 | 0 | 0 | 1 | 1 | Bitwise OR |
| 2 | 1 | 0 | 1 | 0 | 1 | 0 | Bitwise OR |
| 3 | 0 | 0 | 0 | 0 | 0 | 0 | |
| 4 | 1 | 1 | 1 | 1 | 1 | 1 | |
| 5 | 0 | 1 | 1 | 1 | 0 | 1 | |

Bitwise OR:

For this we put $S = 0$ initially

if $\text{any } B[i] = 1$ write $S = 1$

so, we will have one S for each row

use
CRCW
 $O(1)$
time

Total work = $O(n^2)$

Lecture 17: 12th March 2021

So, to reduce work we find a algo with:

$$W \rightarrow O(n^2) \rightarrow O(n \log \log n) \leftarrow \text{non optimal}$$

$$T \rightarrow O(1) \rightarrow O(\log \log n)$$

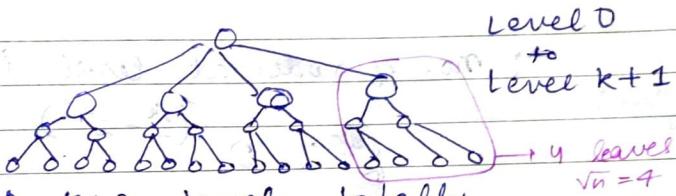
start w smaller problem size
optimal

Doubly Logarithmic Tree

$n = \text{size of array} = \text{no. of elements}$

lets assume $n = 2^k$ ($k \in \mathbb{Z}$) integer

so \rightarrow in our tree we have n leaves
and root is at level zero



\rightarrow ~~root~~ $k+2$ levels totally.

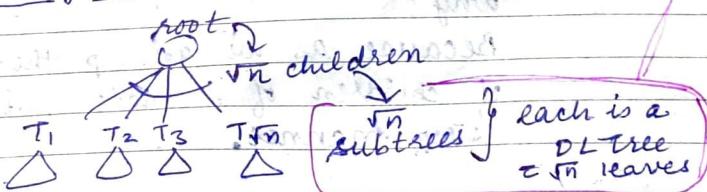
\rightarrow Root has \sqrt{n} children

$$\sqrt{n} = \sqrt{2^{2^k}} = 2^{2^{k-1}} \text{ children.}$$

\rightarrow so in general, at level i , $2^{2^{k-i-1}}$ children
for $0 \leq i \leq k-1$

and each node at level k will have two leaf nodes as children.

Another way to think about this



so \sqrt{n} subtrees & \sqrt{n} leaves
so, n leaf nodes.

Some claims :

→ nodes at k^{th} level is $n/2$

level above
leaf nodes

→ no. of nodes at level i is

$$\text{Ans. } 2^i (2^k - 2^{k-i})$$

→ depth of DLT of n_{leaf} nodes is
 $k+1 = \log \log n + 1$

~~so $n = 16$ leaves~~
proof : ~~$n = 2^{2^k}$~~

$$\log n = 2^k \log 2$$

$$\lceil \log \log n \rceil = k$$

COMPUTING MINIMA

- Each ~~node~~ internal node performs min operation does not suffice.
Why?

Because as we go up the tree the no. of children of a node increase in a steep manner.

\sqrt{n} degree at root

$n^{1/4}$ degree

$n^{1/8}$ degree

and any node with a large no. of children will not be able to find minima of its children in $O(1)$ time.

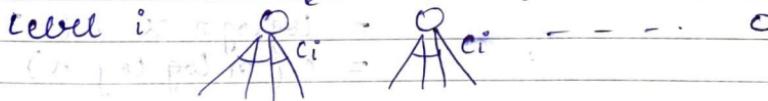
→ DLT has $\log \log n$ levels. So to get $O(\log \log n)$ time we need to spend only $O(1)$ time at each level.

So, at each internal node at level i , if there are c_i children

c_i^2 processors

$O(1)$ time
at each level

parallelly



no. of nodes at level i = n_i

(so), total ~~processors~~ at each level $\Rightarrow n_i \times c_i^2$

$$= n_i \times c_i^2$$

$$= 2^{2^{k-2}^{k-i}} \times (2^{2^{k-i-1}})^2$$

$$= 2^{2^{k-2}^{k-i}} \times 2^{2^{k-i-1}} \times 2^{2^{k-i-1}}$$

$$= 2^{2^{k-2}^{k-i}} \times 2^{2^{k-i-1} + 2^{k-i-1}}$$

$$= 2^{2^{k-2}^{k-i}} \times 2^{2^{k-i}}$$

$$= 2^{2^k}$$

So, # processors at level $i = n$

$W(n) = 80$, work done at each level $i = O(n)$

$$\begin{aligned} \text{Total work} &= \text{levels} \times W \text{ at each level} \\ &= \log \log n \times O(n) \\ &= O(n \log \log n) \end{aligned}$$

$T(n) = \text{Time at each level} = O(1)$

$$\begin{aligned} \text{Total time} &= \text{level} \times T \text{ at each level} \\ &= O(\log \log n) \end{aligned}$$

$P = \text{Each level uses } n \text{ processors.}$

Still, not optimal.

Till now, 2 algos.

Algo 1 = Binary Tree (slow but optimal)

$$T = O(\log n) \quad W = O(n)$$

Algo 2 = DLT (fast but non-opt)

$$T = O(\log \log n) \quad W = O(n \log \log n)$$

So, to go from non-opt to opt -

starting w/ smaller problem size
doesn't work.

we are able to

① solve a smaller problem of
roughly $\frac{n}{\log \log n}$ elements but

we aren't able to -

② extend soln to entire problem

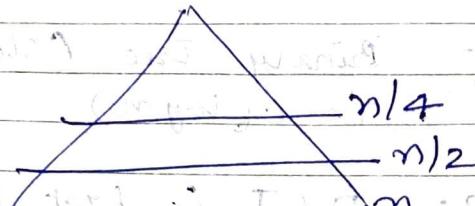
So, we use a new technique -

Accelerated Cascading

I combine 2 algo for same problem
and arrive at optimal

① → start w/ slow algo but opt. algo
till problem is small enough.

So, eg in binary tree as we go up problem size les



② Then, we switch over to fast but non-optimal algo.

algo

→ * Binary Tree algo - start w/ size n input

* In each level up, tree reduces size of input by 2

After $\log \log n$ levels,

size of input reduces to

$$\frac{n}{\log \log \log n} = \frac{n}{\log \log n}$$

We stop here, because our algo 2 is non-optimal by a factor of $\log \log n$.

so now we can use algo 2 when input is $\frac{n}{\log \log n}$ at this point

w reduces to $\Theta(n)$

As we switch to fast algo now,
we need n' processors -

$$\text{where } n' = \frac{n}{\log \log n}$$

$$\text{and } w(n') = \Theta(n' \log \log n')$$

$$\text{approx. value} = \Theta\left(\frac{n}{\log \log n} \cdot \frac{\log \log n}{\log n}\right)$$

$$= \Theta(n) \quad \log\left(\frac{\log n - \log \log n}{\log n}\right)$$

$$< \frac{1}{2} \log \log n$$

$$\text{Time : } \Theta(\cancel{\log \log \log n}) + \Theta(\cancel{\log \log n})$$

$$\rightarrow \underbrace{\Theta(\log \log \log n)}_{\text{BT algo 1}} + \underbrace{\Theta(\log \log n)}_{\text{DL algo 2}}$$

$$\text{so, time} = \Theta(\log \log n)$$