Simulating Time With Square-Root Space



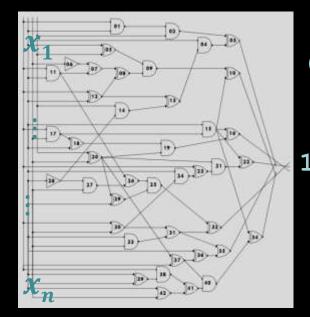
image courtesy of DALL-E

Ryan Williams, MIT and IAS (Princeton)

How space-efficiently can one simulate time-efficient computations?

Every T(n)-time program will use no more than (about) T(n) space. Given any T(n)-time program M, is there always a way to reimplement M, so it uses $\ll T(n)$ space?

Canonical Problem: Circuit Evaluation / Circuit Value Problem (CVP)



Given C, x compute the output

On circuits of size s:

- about s time to solve CVP
- needs $\Omega(s)$ space, to store intermediate gate values?

[PV'76, Borodin'77]

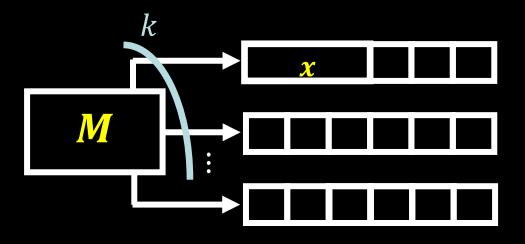
CVP is in $O(s/\log s)$ space

[HPV'75, PR'81, HLMW'86]

 $\mathsf{TIME}[\mathsf{t}] \subseteq \mathsf{SPACE}[t/\log t]$

"Pebbling approach" with an $\Omega(t/\log t)$ lower bound [LT'79] (more later on this)

Model of Computation: Multitape Turing Machine



- read/write k cells in each step
- the k tape heads can move left/right, in each step

TIME[T] := problems solvable in O(T(n)) time on a MTM [HS'65]

Old model, but <u>very</u> robust!

Examples: CVP, Sorting, FFT are in TIME[$n \cdot polylog(n)$], $n^{3-\varepsilon}$ -time matrix mult algorithms are in TIME[$n^{3-\varepsilon} \cdot polylog(n)$], etc. (in fact, <u>two tapes</u> suffice [HS'66])

Open Problem: find any problem solvable in O(n)-time on RAMs with no $O(n \cdot polylog(n))$ -time MTM

Theorem: For all $T: \mathbb{N} \to \mathbb{N}$ with $T(n) \ge n$, $\mathsf{TIME}[T] \subseteq \mathsf{SPACE}[\sqrt{T \log T}]$

Every MTM running in time T has an equivalent MTM using $O(\sqrt{T \log T})$ space (!!)

(Now False) Conjecture: For all $\varepsilon > 0$, TIME[T] $\not\subseteq$ SPACE[$T^{1-\varepsilon}$]

[Sipser'86] Conjecture + Explicit Expanders \Rightarrow P = RP

(nowadays, we know [NW'94,IW'97,...] that we "only" need <u>circuit lower bounds</u> on time in order to achieve derandomization; we don't need <u>space lower bounds</u> on time)

Corollary: CVP \in SPACE[$\sqrt{n} \cdot polylog(n)$]

By diagonalization, we can conclude new lower bounds (towards $P \neq PSPACE$):

Corollary: For all "nice" $s(n) \ge n$, SPACE[s] \nsubseteq TIME[$s^2 / \log^2(s)$]

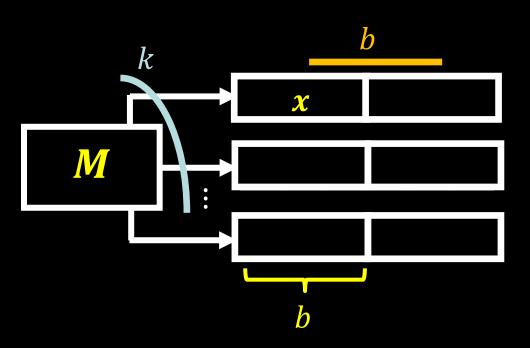
Corollary: There is an explicit $\Pi \in SPACE[n]$ not in $TIME[n^2/\log^2 n]$

Can the Theorem be improved?

<u>Proposition:</u> If TIME[T] \subseteq SPACE[T^{ε}] for all $\varepsilon > 0$, then $P \neq PSPACE$

Prior Work: TIME[T] \subseteq SPACE[T/ log T]

Given MTM M, input x of length nPartition the k tapes of M into **blocks** of b cells



For simplicity: $T(n) \ge n^2$, $b \approx \sqrt{T(n)}$

Define a computation graph $G_{M,x}$:

nodes: $\{0,1,...,T(n)/b\}$

each node represents a **time interval**: b steps of time

edges: for i < j, edge (i, j) if "info computed in interval i is needed to compute info in interval j"

 $\forall i, (i-1,i)$ is an edge

need the last state from interval i-1, to start interval i

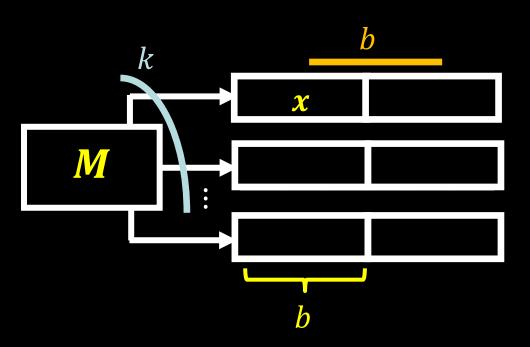
for i < j, edge (i, j) if some block is visited in intervals i and j but is not visited in intervals i + 1, ..., j - 1

Obs: during an interval, each tape has ≤ 2 blocks accessed

$$\forall i$$
, indeg(i) $\leq 2k + 1$ from from blocks state

Prior Work: TIME[T] \subseteq SPACE[T/ log T]

Given MTM M, input x of length nPartition the k tapes of M into **blocks** of b cells



For simplicity: $T(n) \ge n^2$, $b \approx \sqrt{T(n)}$

computation graph $G_{M,x} = (V, E)$ $V = \{0,1,...,T(n)/b\}$ for i < j, $(i,j) \in E$ iff "info computed in interval i is needed to compute info in interval j" $\forall i, \text{ indeg}(i) \leq 2k+1$ Define strings with the info computed in each interval:

content(0): initial configuration of M on x [O(n) bits] content(i): info computed during interval i [O(b) bits] [state + head positions at end, tape blocks accessed]

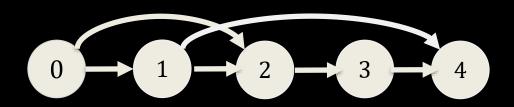
Obs: given content(i) for all i with $(i,j) \in E$, can compute content(j) in O(b) time

Goal: Determine content(T(n)/b)

[contains accept/reject state!]

Prior Work: TIME[T] \subseteq SPACE[T/ log T]

Now we have a problem on DAGs:



Pebble Game: played on *v*-node graph

- 1. Can put pebble on source
- 2. Given pebbles on all i with $(i, j) \in E$, can put pebble on j
- 3. Can remove pebbles at any time How many pebbles needed to put a pebble on the last node? [HPV'75,LT'79] $\Theta(v/\log v)$ for DAGs of O(1) indegree Store only $O(T/b)/\log(T/b)$ content strings at a time $\Rightarrow O(T/\log(T/b))$ space

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computation graph G_{M,x} = (V, E)
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 $V = \{0,1,...,T(n)/b\}$

for i < j, $(i, j) \in E$ iff "info computed in interval i is needed to compute info in interval j"

 $\forall i$, indeg $(i) \leq 2k+1$

Define strings with the info computed in each interval:

content(0): initial configuration of M on x [O(n) bits]

content(i): info computed during interval i [O(b) bits]

[state + head positions at end, tape blocks accessed]

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Towards Low Space: The Tree Evaluation Problem (TEP)

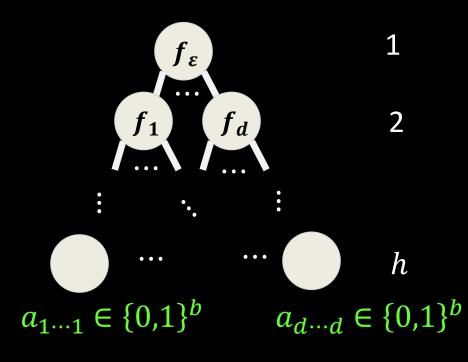
[Braverman-Cook-McKenzie-Santhanam-Wehr'09]

Parameters d, b, h > 0. Given: d-ary tree of height h Each inner node u is labeled by $f_u : \{0,1\}^{d \cdot b} \to \{0,1\}^b$ [each f_u is given as a table of length $2^{d \cdot b}$] Each leaf ℓ is labeled by a value $a_{\ell} \in \{0,1\}^b$ [d^h values] For an inner node u, if $a_{u \mid 1}, \dots, a_{u \mid d}$ are the values of the children of u, then value of u is $a_u := f_u(a_{u \mid 1}, \dots, a_{u \mid d})$

Goal: Find value of the root: $a_{\varepsilon} \in \{0,1\}^b$

Simple recursive algorithm:

 $\begin{aligned} \text{TE}(v) \colon &\text{If } v \text{ is a leaf, return } a_v \\ &\text{For } i = 1, \dots, d \text{, compute } A_i = \text{TE}(v_i) \\ &\text{Return } f_v(A_1, \dots, A_d) \text{ and erase } A_1, \dots, A_d \end{aligned}$ $\text{Takes } O(h \cdot d \cdot b) \text{ space } \rightarrow O(\log^2 N) \text{ for input length } N$



How much space?

[Braverman et al] showed LBs in restricted settings, conjectured TEP ∉ NL

Towards Low Space: The Tree Evaluation Problem (TEP)

[Braverman-Cook-McKenzie-Santhanam-Wehr'09]

Parameters d, b, h > 0. Given: d-ary tree of height h

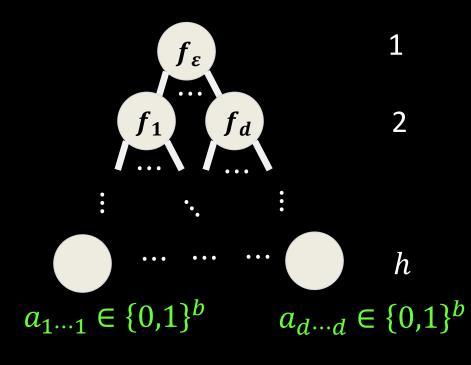
Each leaf ℓ is labeled by a value $a_{\ell} \in \{0,1\}^b$

Each inner node u is labeled by $f_u: \{0,1\}^{d \cdot b} \to \{0,1\}^b$

Goal: Find value of the root: $a_{\varepsilon} \in \{0,1\}^b$

Simple algorithm takes O(hdb) space \rightarrow stack of height h

[Cook-Mertz'24] TEP in $O(h \log(db) + db)$ space! Stack of height h, with only $O(\log(db))$ bits on each level



Key Idea: The simple algorithm allocates fresh space for each value computed at each level

Instead, XOR values into existing space! Algorithm XORs the value of u into existing space, assuming an oracle that can XOR the values of u's children into existing space.

Theorem: For $T: \mathbb{N} \to \mathbb{N}$ with $T(n) \ge n^2$, TIME[T] \subseteq SPACE[$\sqrt{T} \cdot \log(T)$]

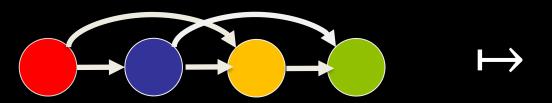
Idea: Given time-T MTM M and input x, reduce to (exp-sized) TEP instance

Assume we know $G_{M,x}$ [either it's stored in memory, or we can compute its edges efficiently]

Set d := 2k + 1, h := 1 + T(n)/b, and set b so that for all i, |content(i)| $\leq b$

Extend Cook-Mertz for trees with $\leq d$ children at each node, and max height h

[Folklore] Boolean circuits of depth $h \mapsto Boolean$ formulas of depth h



This transformation works just as well for circuits and formulas with b-bit values on the wires

Computing content in $G_{M,x}$ is evaluating a circuit over b-bit values

TEP \equiv Evaluating a formula over b-bit values of depth h and fan-in d

← Each gate is indexed by a path from a gate in the circuit to the output gate

Theorem: For $T: \mathbb{N} \to \mathbb{N}$ with $T(n) \ge n^2$, TIME $[T] \subseteq SPACE[\sqrt{T} \cdot \log(T)]$

Idea: Given time-T MTM M and input x, reduce to (exp-sized) TEP instance

Assume we know $G_{M,x}$ [either it's stored in memory, or we can compute its edges efficiently]

Set d := 2k + 1, h := 1 + T(n)/b, and set b so that for all i, $|content(i)| \le b$ We can evaluate content(T(n)/b) of $G_{M,x}$ using the Cook-Mertz procedure!

Space of Cook-Mertz: $O(d \cdot b + h \cdot \log(d \cdot b)) \le O(b + (T \log b)/b)$ set b to minimize $\to O(\sqrt{T \log T})$ space

BUT! We don't know $G_{M,x}$...

Easiest fix: Program M so that we can calculate all head positions quickly (in advance) Def. M is oblivious if $\forall n$ and x of length n, head movements of M on x only depend on n Thm [HS'66,PF'79] For all MTM M in T(n) time, there's an **equivalent** two-tape oblivious M' that runs in $O(T(n) \log T(n))$ time. Given n, i in binary, head positions of M' at step i can be computed in $poly(\log T(n))$ time. \rightarrow Can calculate $G_{M',x}$! (But we lose a little)

Open Problems

- Extend to RAMs? (Show $TIME_{RAM}(T) \subseteq SPACE(T^{1-\varepsilon})$?)
- Extend to Parallel Machines? (Show $TIME(T) \subseteq ATIME(T^{1-\varepsilon})$?) Would imply super-linear time lower bounds for problems like Quantified Boolean Formulas!
- $TIME(T) \subseteq SPACE(T^{0.5-\varepsilon})$? This would resolve the first two! Improve this bound for single-tape Turing machines!
- Barrier?

I'm very lucky that I found this reduction after Cook-Mertz, or I would have definitely declared the reduction to be a "barrier"...

"You can't solve Tree Eval in much less space, or you'd improve HPV...
...which we know you can't do"

