Connectivity and Spanning Forest Problems in MPC

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- Recent developments in connectivity in sublinear MPC
- Techniques and challenges
- Lower bounds
- What about MST?
- Open problems

- *M* machines
- Each has ${\mathcal S}$ local storage
- Input initially distributed arbitrarily
- Synchronous rounds:
 - Each machine does arbitrary local computation
 - Machines send messages to each other
- A machine may only send and receive S words per round







Superlinear	Linear	Sublinear
$\mathcal{S} = O(n^{1+\delta})$	S = O(n)	$\mathcal{S} = O(n^{\delta})$

S	up	erlinear
S		$O(n^{1+\delta})$

Linear S = O(n)

Sublinear $\mathcal{S} = O(n^{\delta})$

Let *N* be the total input size¹. In O(1) rounds on MPC with sublinear local space we can:

- Sort N values
- Prefix sum of *N* values
- "Colored summation" (given N values, each with an associated color, sum the values of each color)
- Broadcast values to all machines
- Simulate O(1) rounds of PRAM

¹When considering graphs, N = m + n.

Total space available to the MPC, $\mathcal{T} = S \times \mathcal{M}$ Often assumed that $\mathcal{T} = O(\text{poly}(m+n))$ Must have that $\mathcal{T} = \Omega(m+n)$ Ideally want to get $\mathcal{T} = \Theta(m+n)$, but this is challenging

Connectivity

Connectivity



- Compute labelling $\ell: V \rightarrow V$ such that:
 - If u and v are in the same connected component then

 \ell(u) = l(v)
 - Otherwise, $\ell(u) \neq \ell(v)$
- Same as "picking a representative" for each component
- Fundamental subroutine in graph algorithms

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S	Connectivity	Source
Superlinear: $O(n^{1+\delta})$	<i>O</i> (1)	[LMSV '11]
$\lim_{n \to \infty} O(n)$	<i>O</i> (1) rand.	[JN '18]
Linear. $O(n)$	<i>O</i> (1) det.	[Now '21]
Sublinear: $O(n^{\delta})$	$O(\log n)$	PRAM algorithm

The problem seems to be hard when $S = O(n^{\delta})$...

1-vs-2-Cycles Conjecture



1-vs-2-Cycles Conjecture

Distinguishing one cycle from two cycles requires $\Omega(\log n)$ rounds in MPC with $S = O(n^{\delta})$.

This conjecture is widely believed!

Difficulty of MPC Lower Bounds [RVW '16] (informal)

Any non-trivial lower bound in sublinear MPC implies $\mathit{NC}^1 \subsetneq \mathit{P}$

- Maybe long cycles are just difficult?
- Can we do better than Ω(log n) conditionally?



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- Trivial O(D) algorithm where D is diameter. Each phase:
 - Broadcast highest ID you know to all neighbors
 - Check if any edge has different "highest ID"s at endpoints
- Stop when no edge has different IDs at endpoints



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- What about graph exponentiation?
 - Create edges to nodes at distance 2, repeatedly
 - Halves diameter in O(1) rounds; takes O(log D) rounds in total
 - ...but needs $\mathcal{T} = \Omega(n^{\omega})$
- Can we solve connectivity in O(log D) rounds when

 T = Θ(m + n)?

Connectivity: First Breakthrough



- Idea: graph exponentiation, but stop before we exceed \mathcal{T} [ASSWZ '18]
- Increase the degree of all nodes to $\left[\sqrt{\frac{m}{n}}, \frac{m}{n}\right]$
 - (we stop if we find the whole component)
- Takes O(log D) rounds

Connectivity: First Breakthrough



- A graph with min-degree d has a dominating set of size $\widetilde{O}(\frac{n}{d})$
- Can easily find it using sampling in O(1) rounds
- Idea: find such a set (of "leaders") and contract non-leaders to them

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- Idea: find such a set (of "leaders") and contract non-leaders to them
- Insight: we have much more space now!

• Increase minimum degree to $b = \sqrt{\frac{m}{n}}$

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- Increase minimum degree to b^2
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- Increase minimum degree to b^2
- Find $O(\frac{n}{b^3})$ "leaders", contract non-leaders into leaders
- Now have $O(\frac{n}{b})$ vertices, $\Omega(b^2)$ space per vertex

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- Find $O(\frac{n}{b^3})$ "leaders", contract non-leaders into leaders
- Now have $O(\frac{n}{b^3})$ vertices, $\Omega(b^4)$ space per vertex

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etc...

- Increase minimum degree to b⁴
- Find $O(\frac{n}{b^7})$ "leaders", contract non-leaders into leaders
- Now have vertices, $\Omega(b^8)$ space per vertex

etc...

Start with $b = \sqrt{\frac{m}{n}}$, make double-exponential progress on *b*...

 $O(\log \log_{m/n} n)$ phases overall!

Conditionally Sublogarithmic Connectivity [ASSWZ '18] Solves connectivity on MPC with $S = O(n^{\delta})$ and $T = \Theta(m + n)$ in $O(\log D \cdot \log \log_{m/n} n)$ rounds, with good probability.

They obtain $O(\log D)$ rounds and high success probability if, for some arbitrary constant $\epsilon > 0$, either:

•
$$\mathcal{T} = \Omega((m+n)^{1+\epsilon});$$
 or

• $m = \Omega(n^{1+\epsilon})$

Spanning Forest in ASSWZ '18

- Authors of [ASSWZ '18] extended the idea to spanning forest
- Not too difficult, because of the "phase" structure:
- Idea is to (while doing expansion at node v) maintain a "local shortest path" tree rooted at v of all the nodes which v knows. Need to take care:
 - When performing expansion, need to "merge" the local shortest path trees
 - When performing contraction, need to show that the nodes contracted into some leader are a subtree of the local shortest path tree of that leader
 - Preserve information about edges post-contraction

Using connectivity and spanning forest as black boxes:

- Diameter estimate
 - Gives estimate D' s.t. $D \le D' \le D^{O(\log \log_{m/n} n)}$
- MST (we'll talk about this later!)
 - Approximate MST
 - Bottleneck Spanning Tree (BST)

Connectivity: Second Breakthrough

- Previous result has low success probability
- Average degree (b²) can initially be constant
- For concentration bounds, need $\frac{m}{n} = \Omega(\text{polylog } n)$
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- For concentration bounds, need $\frac{m}{n} = \Omega(\text{polylog } n)$

- Idea 1: Perform random contractions to reduce vertices by a constant factor in O(1) rounds [BDEŁM '19]
 - If repeated $O(\log \log n)$ times, reduces $n \to \frac{n}{\operatorname{polylog}(n)}$
 - Requires a subroutine to find a linear matching on a line



Each vertex selects an outgoing edge to its highest ID neighbor.

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Remove outgoing edges of nodes with in-degree ≥ 2 .

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Contract all in-edges of nodes with in-degree ≥ 2 .

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We're left with a series of directed paths; we need to contract a constant fraction of edges on those paths.

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We use coin-tossing to find a linear-size matching on this path, and contract these edges.

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- Idea 2: Can improve the running time by interleaving expansion/contraction per-vertex [BDEŁM '19]
- Each vertex has a *level* which controls its space budget
- Guarantee that after O(1) rounds, each node either:
 - Learns its 2-hop neighborhood (expansion), or;
 - Participates in leader selection with other nodes (contraction), the leaders' levels are increased by 1
- Since maximum level is O(log log_{m/n} n), this gives a O(log D + log log_{m/n})-round algorithm

Faster Connectivity [BDEŁM '19]

Connectivity can be solved on MPC with $S = O(n^{\delta})$ and $T = \Theta(m+n)$ in $O(\log D + \log \log_{m/n} n)$ rounds, with high probability.

Again, significant graph density or significantly superlinear global space give an $O(\log D)$ -round algorithm.

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Extension to spanning forest seems much harder here, because of the decoupling of the expansion/contraction process ...

Deterministic Connectivity

Two randomized subroutines:



(a) Finding a constant-fraction sized matching on a path



(b) Finding a dominating set of size O(n/b) in a graph with min. degree b

Can we derandomise them?

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(a) Finding a constant-fraction sized matching on a path



(b) Finding a dominating set of size O(n/b) in a graph with min. degree b

Can we derandomise them?

[CMT '21] showed that the randomness can be reduced *slightly*: $(\log n)^{O(\log D + \log \log_{m/n} n)}$ bits suffice if D is not too large.

- Method for derandomizing algorithms
- Idea: "fix the seed" of randomized algorithms
- If a set of seeds meet an objective in expectation when you pick one uniformly, at least one seed meets the objective

k-wise Independence

Let $k, n, \ell \in \mathbb{N}$ with $k \leq n$. A family of hash functions $\mathcal{H} = \{h : \{1, \dots, n\} \rightarrow \{0, 1\}^{\ell}\}$ is called *k*-wise independent if for all $I \subseteq \{1, \dots, n\}$ with $|I| \leq k$, the random variables h(i) with $i \in I$ are independent and uniformly distributed in $\{0, 1\}^{\ell}$ when his chosen randomly from \mathcal{H} .

Small Families of *k*-wise independent Hash Functions

For every $n, \ell \in \mathbb{N}$, one can construct a family of pairwise independent hash functions $\mathcal{H} = \{h : \{1, \ldots, n\} \to \{0, 1\}^{\ell}\}$ such that choosing a uniformly random function h from \mathcal{H} takes $O(\ell + \log n)$ random bits.

Method of Conditional Expectations

- Given an algorithm which solves the target problem using k-wise independent random variables:
- Construct a family of *k*-wise approximate hash functions
 - Each function can be specified with $O(\log n)$ bits
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- Fix the seed log *n* bits at a time
- Iteratively set prefix until entire seed is specified
- $O(\log n)$ length seeds, fix log n bits at a time: O(1) stages

Method of Conditional Expectations in MPC

$$b_1, b_2 \dots b_k \underbrace{b_{k+1} \dots b_{k+\log n}}_{\beta} \dots b_{O(\log n)}$$

- We've fixed the first k bits, $b_1 \dots b_k$
- Consider a possible setting β of the next log n bits
 (b_{k+1}...b_{k+log n})
- Machines compute the expected value of h at the hash functions prefixed by b₁...b_k · β
- Aggregate using colored summation
- Pick the best possible β; broadcast result to all machines

k-wise, ϵ -approximate Hash Functions



 For finding a large matching on a line, pairwise (2-wise) independence is enough

k-wise, ϵ -approximate Hash Functions



- For the dominating set problem, wanted O(log n)-wise independence
 - ...but this family of hash functions is too large!
- Solution: *k*-wise, *e*-approximately independence
- Weaker tail bounds, but hash functions can be specified by O(log n) bits again!

Deterministic Connectivity [CC '21]

Connectivity can be solved on MPC with $S = O(n^{\delta})$ and $T = \Theta(m + n)$ in $O(\log D + \log \log_{m/n} n)$ rounds, **deterministically**.

As before, superlinear global space or some polynomial density gives an $O(\log D)$ -round algorithm.

Improved Deterministic Connectivity

- Method of conditional expectations requires locally evaluating poly(n) seeds
- We often don't care about "local work" in MPC
- But local work bounded by poly(n), when n could be billions...

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- Method of conditional expectations requires locally evaluating poly(n) seeds
- We often don't care about "local work" in MPC
- But local work bounded by poly(n), when n could be billions...
- Algorithm of [FGG '22] reduces total work by reducing the number of seeds which need to be searched through.
- Number of seeds so low that they can be brute-forced.
- Idea: color the graph first!
 - Nodes of the same color make the same choice
 - Reduce domain of hash functions from |V| to |C|
- Also analysis of dominating set using only pairwise independence

Deterministic Connectivity [FGG '22]

Connectivity can be solved on MPC with $S = O(n^{\delta})$ and $\mathcal{T} = \Theta(m+n)$ in $O(\log D + \log \log_{m/n} n)$ rounds, deterministically, with $\widetilde{O}(m)$ local computation in total.

Brand new result! (Will appear at SODA '23)

Connectivity in Forests [BLMOU '23]

Connectivity can be solved on MPC with $S = O(n^{\delta})$ and $T = \Theta(m + n)$ in $O(\log D)$ rounds, deterministically, when the input graph is a forest.

- Achieve this by rooting the tree
- "Balanced exponentiation" approach
- Can perform O(log D) rounds of vertex contraction "for free" to get O(poly(D)) factor extra space.

$$D = \Omega(\operatorname{polylog}(n)) \Longrightarrow O(\log D)$$
$$\mathcal{T} = \Omega((m+n)^{1+c}) \Longrightarrow O(\log D)$$
$$m = \Omega(n^{1+c}) \Longrightarrow O(\log D)$$
$$G \text{ is a forest} \Longrightarrow O(\log D)$$

otherwise
$$\implies O(D)$$

Conditional Lower Bound [BDEŁM '19]

Connectivity on MPC with $S = O(n^{\delta})$ requires $\Omega(\log D)$ rounds, where $D \ge \log^{1+\rho} n$ is the diameter of the graph, unless the 1-vs-2-cycles conjecture is false.



Start with an instance of 1-v-2 cycles



Temporarily remove edges with probability $O(\log n/D')$, breaking cycle into paths



Use fast algorithm to find connected components in $o(\log D')$ rounds



Contract components and re-add edges; repeat



Takes $o(\log n)$ rounds overall, which contradicts 1-v-2 cycle

Conditional Lower Bound [CC '22]

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The bound holds for any value of D.

- Similar argument to [BDEŁM '19]
- Remove dependence on *n* in the sampling probability
- No longer need to worry so much about bounding the diameter of all components: just ignore high-diameter components!

MST



- Given a weighted graph as input, compute a minimum spanning forest
- Clearly no easier than connectivity; a minimum spanning forest *is a spanning forest*
- But is it *harder* than connectivity?


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This is the same table as before!

Algorithm for MST given in [ASSWZ '18]; runs in²:

$$O\left(\min\left\{\left(\log D_{MST} + \log\left(\frac{\log n}{2 + \gamma \log n}\right)\right) \cdot \frac{\log n}{2 + \gamma \log n}, \log n\right\}\right)$$

with $\mathcal{T} = O((m+n)^{1+\gamma})$.

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$$\gamma = 0 \Longrightarrow O(\log n) \text{ rounds}$$

 $\gamma > c \Longrightarrow O(\log D_{MST}) \text{ rounds}$

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This result was derandomized by $[\underline{C}C '22]$

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MST in Sublinear MPC

- Algorithm of [ASSWZ '18] use repeated applications of connectivity
- Given an instance of MST with *m* edges, *n* vertices, and a factor of *k* extra space, create sub-instances. For instance *i* ∈ [1, *k*]:
 - Contract lightest $(i 1) \cdot m/k$ edges using a connectivity algorithm
 - Discard edges heavier than the (*im*/*k*)th lightest
 - Solve MSF on the remaining graph (recursively)

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 - Discard edges heavier than the (*im*/*k*)th lightest
 - Solve MSF on the remaining graph (recursively)
- If γ = 0, the recursion depth is dominant;
 If γ > c, the connectivity complexity dominates
- Dependence on D_{MST} rather than D because we contract edges in size order

MST in $O(\log D)$ rounds?

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No.

MST can't be calculated in $o(\log n)$ rounds, parameterized on D, n[**C**C '22]:



We start with an instance of either 1 cycle or two cycles: all edges have weight 1 $\ensuremath{\mathsf{1}}$

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MST can't be calculated in $o(\log n)$ rounds, parameterized on D, n[**C**C '22]:



We add a universal vertex with edges to all existing nodes; these edges have weight 2.

MST can't be calculated in $o(\log n)$ rounds, parameterized on D, n[**C**C '22]:



We then run our MST algorithm.

MST can't be calculated in $o(\log n)$ rounds, parameterized on D, n[**C**C '22]:



If one weight-2 edge is used, then we have one cycle...

MST can't be calculated in $o(\log n)$ rounds, parameterized on D, n[**C**C '22]:



If two are used, we have 2 cycles!

MST can't be calculated in $o(\log n)$ rounds, parameterized on D, n[**C**C '22]:



Note that D = 2 but $D_{MST} = O(n)$.

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Even approximating an MST is difficult!

MST can't be calculated in $o(\log n)$ rounds, parameterized on D, n[**C**C '22]:



Even approximately calculating the weight of an MST is difficult!

Conclusion

- Can connectivity be solved in sublinear MPC with optimal global space in O(log D) rounds?
 - ...deterministically?
 - ...using $\Theta(m+n)$ local computation?
 - ...while maintaining a spanning forest?
- If not, what about a lower bound? Impossibility result only holds for polynomial memory...
- Can we compute an MST in sublinear MPC with optimal global space in o(log n) rounds (conditionally)?
- Computation-efficient derandomization in MPC—what more can be done?

Thank you for listening!