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Joint works with Jan van den Brand, Michal Dory, Gramoz Goranci, Yasamin Nazari, Maximilian Probst Gutenberg, Antonis Skarlatos, and Tijn de Vos



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## **Dynamic Environments**











Adversary inserts and deletes edges



**Distance** Matrix

(	0	1	1	1	1	
	1	0	1	1	1	
	1	1	0	2	2	
	1	2	2	0	1	
	1	2	2	1	0	)

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Algorithm updates distance matrix



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State of the Art

Amortized update time  $\tilde{O}(n^2)$  [Demetrescu, Italiano '03]

- 1. Exact
- 2. 1 +  $\epsilon$
- 3. Small constant (2 to < 3)
- 4. Thorup-Zwick (3 to  $O(\log n)$ )
- 5. Above Logarithmic



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- Deterministic worst-case update time:
  - *Õ*(n<sup>2+41/61</sup>) [Chechik, Zhang '23]
  - $\tilde{O}(n^{2.6})$  unweighted [Probst Gutenberg, Wulff-Nilsen '20]
- Trade-off: worst-case update time/query time O(n<sup>1.724</sup>)
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#### Decremental:

- Total update time  $\tilde{O}(n^3)$  in unweighted graphs [Demetrescu, Italiano '01; Baswana, Hariharan, Sen '02]
- Deterministic version: [Evald, Fredslund-Hansen, Probst Gutenberg, Wulff-Nilsen '21]

#### Decremental: Pretty well explored

- Total upate time  $\tilde{O}(mn)$  [Bernstein '13]
- Deterministic total update time O(mn<sup>1+o(1)</sup>) in undirected graphs [Bernstein, Probst Gutenberg, Saranurak]

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### Fully dynamic: [v.d. Brand, Nanongkai '19]

- Update time  $\tilde{O}(n^{2.045})$
- Update time  $\tilde{O}(n^2)$  in unweighted, undirected graphs
- Trade-offs:
  - Update time  $n^{1.863}$ , query time  $O(n^{0.666})$
  - Update time *n*<sup>1.823</sup>, query time *O*(*n*<sup>0.45</sup>) in unweighted, undirected graphs

### **Our Results**

#### [v.d. Brand, F, Nazari '22]

- Deterministic 1 +  $\epsilon$  in unweighted, undirected graphs
  - *k* sources: worst-case update time  $O(n^{1.529} + kn^{1+o(1)})$
  - single pair: worst-case update time  $O(n^{1.407})$



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- Trade-offs:
  - $1 + \epsilon$  with worst-case upate time  $O(n^{1.788})$  and query time  $O(n^{0.45})$  in unweighted, undirected graphs
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### **Remarks:**

- Randomized  $O(n^{1.529} + kn^{1+o(1)})$  by [Bergamaschi et al. '21]
- *n*<sup>1.529</sup> and *n*<sup>1.407</sup> match CLBs [v.d. Brand, Nanongkai, Saranurak '19]



#### **Two Worlds**

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- 3. Algebraic data structure can be extended to slowly changing set of nodes

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### **Prior work:**

- Fully dynamic:  $2 + \epsilon$  with update time  $m^{1+o(1)}$  [Bernstein '09]
- Decremental: 2 with total update time n<sup>2.5</sup> [Henzinger, K, Nanongkai '13]

### **Our Result**

### [Dory, F, Nazari, de Vos arXiv '22]

- Decremental  $2 + \epsilon$ -approximation in weighted graphs
- Total update time  $\tilde{O}(m^{1/2}n^{3/2+o(1)})$  if  $m \le n^{5/3}$
- Total update time  $\tilde{O}(mn^{2/3})$  if  $m \ge n^{5/3}$
- Constant query time







### Main ideas:

- Setup based on bunches and clusters (similar to TZ distance oracle)
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#### **My impression**

Static algorithms are still too "messy". A candidate for SOSA?

# **Regime 4: Thorup-Zwick style (3 to** $O(\log n)$ **)**

## Partially dynamic:

- Decremental with stretch  $(2k 1)(1 + \epsilon)$ , update time  $\tilde{O}((m + n^{1+o(1)})n^{1/k})$ , and query time  $\min(O(\log \log(nW), k)$  [Chechik '18; Łącki, Nazari '22]
- Incremental with stretch  $(2k 1)^t$  and worst case update/query time  $\tilde{O}(m^{1/(t+1)}n^{t/k})$  [Chen, Goranci, Monika Henzinger, Peng, Saranurak '20]

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- Stretch  $2^{O(\rho k)}$ , update time  $\tilde{O}(m^{1/2}n^{1/k})$ , and query time  $O(k^2\rho^2)$  ( $\rho = 1 + \lceil \log n^{1-1/k} / \log(m/n^{1-1/k}) \rceil$ ) [Abraham, Chechik, Talwar '14]
- Stretch Õ(log n), update/query time O(m<sup>2/3+o(1)</sup>) [Chen, Goranci, Monika Henzinger, Peng, Saranurak '20]

### [F, Goranci, Nazari, Skarlatos '23]

Fully dynamic distance oracle, for any constant 0 <  $\rho$  < 1:

- Stretch  $(256/\rho^2)^{4/\rho}$ , update time  $n^{\rho}$ , query time  $n^{\rho/8}$  or
- Stretch  $O(\log \log n)$ , update time  $n^{\rho}$ , query time  $n^{o(1)}$



## Main Idea

#### Very general reduction

• **Decremental** algorithm maintaining hub set *H*(*v*) for every node *v* such that for any pair *s*, *t*:

$$\delta(s,t) = \min_{\nu \in H(s) \cap H(t)} \delta_H(s,\nu) + \delta_H(s,t)$$

• can be extended to fully dynamic distance oracle

### Thorup-Zwick distance oracle as hub labeling scheme

• Stretch 2*k* − 1

 $\frac{2}{(\log n)^{1/200}} < \rho < \frac{1}{400}$ 

- Hub set of size  $O(n^{1/k})$
- Additional query mechanism for query time O(k) instead of  $O(n^{1/k})$

**Independent result** [Chuzhoy, Zhang '23]: stretch  $(\log \log n)^{2^{1/\rho^3}}$ , update time  $\tilde{O}(n^{O(\rho)})$ , and query time  $\tilde{O}(2^{O(1/\rho)})$  for any

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**Decremental:** [Chuzhoy '21; Bernstein, Probst Gutenberg, Saranurak '21]

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## Fully dynamic:

Stretch O(log n)<sup>3k-2</sup>, update time time m<sup>1/k+o(1)</sup> · O(log n)<sup>4k-2</sup>, and query time O(k(log n)<sup>2</sup>) [Forster, Goranci, Henzinger '21]

### **Our Result**

### [F, Nazari, Probst Gutenberg '23]

- Incremental
- Polylogarithmic stretch
- Total update time  $\tilde{O}(m)$
- Query time  $O(\log \log n)$





### Notable:

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### **Overall setup:**

- Hierarchy of k = Θ(log log n) sparsifiers: G = H<sub>1</sub>, H<sub>2</sub>, ..., H<sub>k</sub> following [Andoni, Stein, Zhong '20]
- $H_i$  is an  $\alpha$ -approximation of  $H_{i-1}$  for some constant  $\alpha$  $\alpha^k = \text{polylog } n$

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# Challenge:

- Naively, number of edges added to  $H_{i+1}$ :  $O(\dots + |E(H_i)| \log n)$
- For  $k = \Theta(\log \log n)$  levels:  $m \cdot O(\log n)^{\log \log n}$  insertions (at best)

I would like to see the following:

- 1. Conditional lower bound of  $n^{2.5}$  for worst-case update time in exact APSP
- 2. Stretch (2k 1), (worst case) update time  $O(n^{1/k})$ , query time O(k)
- 3. Deterministic decremental with polylogarithmic stretch, polylogarithmic query time and update time  $\tilde{O}(m)$