# Constant Approximation of Min-Distances in Near-Linear Time 

Shiri Chechik<br>Tianyi Zhang

## Distance parameters in graphs

$G=(V, E, \omega)$ be a weighted directed graph
Distance parameters:
diameter, radius, eccentricity

- Eccentricity of any vertex
= Maximum distance to other vertices
- Radius = Minimum eccentricity among all vertices
- Diameter $=$ Maximum eccentricity among all vertices


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## Variants of distances in digraphs

- In directed graphs, $\operatorname{dist}(u, v) \neq \operatorname{dist}(v, u)$ not symmetric
- Round-trip distance $=\operatorname{dist}(u, v)+\operatorname{dist}(v, u)$
- $\operatorname{Max}-\operatorname{distance}=\max \{\operatorname{dist}(u, v), \operatorname{dist}(v, u)\}$
- Min-distance $=\min \{\operatorname{dist}(u, v), \operatorname{dist}(v, u)\}$

Exactly computing distance parameters (ecc, diam, rad) requires $m^{2-\epsilon}$ time under SETH and HSC

Faster algorithms need to allow approximations

## Variants of distances in digraphs

- Rndtrip-dist \& max-dist satisfy triangle inequalities
- Min-dist violates triangle inequalities

round-trip distance
$\operatorname{rnd}(u, v)+\operatorname{rnd}(v, w) \geq \operatorname{rnd}(u, w)$

min-distance
min-dist(u, v) + min-dist(v, w)
$<$ min-dist $(u, w)=\infty$


## Variants of distances in digraphs

- Rndtrip-dist \& max-dist satisfy triangle inequalities
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round-trip distance
$\operatorname{Ecc}(\mathrm{v})$ is 2-approx of round-trip diameter

min-distance


## A short history

| reference | which param? | approx | runtime | input type |
| :---: | :---: | :---: | :---: | :---: |
| AVW, 2016 | min-diameter | 2 | m | acyclic |
| AVW, 2016 | min-radius | 3 | $m^{1 / 2}$ | acyclic |
| DK, 2021 | min-radius | k | $\mathrm{mn}^{1 / k}$ | acyclic |
| DK, 2021 | min- <br> eccentricities | $\mathrm{k}+0.001$ | $\mathrm{mn}^{1 / k}$ | acyclic |
| open | all param | $\mathrm{O}(1)$ | m | acyclic |

## A short history

| reference | which param? | approx | runtime | input type |
| :---: | :---: | :---: | :---: | :---: |
| DWV+, 2019 | min-diameter | $4 \mathrm{k}-5$ | $m n^{1 / k}$ | general |
| DWV+, 2019 | min-radius | 3 | $m n^{1 / 2}$ | general |
| DWV+, 2019 | min- <br> eccentricities | 5.001 | $m n^{1 / 2}$ | general |
| open | any param | $\mathrm{O}(1)$ | m | general |

## Our results

| reference | which param? | approx | runtime | input type |
| :---: | :---: | :---: | :---: | :---: |
| open | all/any param | O(1) | m | acyclic / general |
| new | min-diameter | $4 \mathrm{k}-5 \mathrm{vs} 4$ | $m n^{1 / k}$ vs m | general |
| new | min-radius | 3 vs 4 | $m n^{1 / 2}$ vs m | general |
| new | mineccentricities | 5.001 | $m n^{1 / 2}$ vs m | general |
| new | min-radius | $k$ vs 3 | $m n^{1 / k}$ vs m | acyclic |
| new | mineccentricities | $k+0.01$ vs 3.01 | $m n^{1 / k}$ vs m | acyclic |

## Our results

| reference | which param? | approx | runtime | input type |
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| This talk | new | min-diameter | $4 \mathrm{k}-5 \mathrm{vs} 4$ | $\mathrm{mn}^{1 / k} \mathrm{vs} \mathrm{m}$ |
| new | min-radius | 3 vs 4 | $\mathrm{mn}^{1 / 2} \mathrm{vs} \mathrm{m}$ | general |
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| new | min-radius | $\mathrm{k} \quad \mathrm{vs} \quad 3$ | $\mathrm{mn}^{1 / k} \mathrm{vs} \mathrm{m}$ | acyclic |
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# Min-diameter in general digraphs 

## First attempt

Goal: decide min-diam <D or >D/4

1. Pick a random vertex $t$
2. Compute SSSP in to and from $t$
3. Define two sets:

$$
\begin{aligned}
& U_{+}=\{u \mid \operatorname{dist}(t, u)<D / 4\} \\
& U_{-}=\{u \mid \operatorname{dist}(u, t)<D / 4\}
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4. Recurse on $G\left[U_{+}\right]$and $G\left[U_{-}\right]$

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Goal: decide min-diam $<$ D or $>$ D/4

1. Pick a random vertex $t$
2. Compute SSSP in to and from $t$
3. Define two sets:

$$
\begin{aligned}
& U_{+}=\text {If } U_{+} \cup U_{-} \neq V D / 4 \\
& \text { then claim min-diam }>\mathrm{D} / 4
\end{aligned}
$$

4. Recurse on $G\left[U_{+}\right]$and $G\left[U_{-}\right]$


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Goal: decide min-diam <D or >D/4

1. Pick a random vertex $t$
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3. Define two sets:

$$
\text { If } U_{+} \cup U_{-}=V
$$

Endpoints of min-diam should belong to the same side
4. Recurse on $G\left[U_{+}\right]$and $G\left[U_{-}\right]$


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## Some issues:

- Soundness

A large min-distance within $G\left[U_{+}\right]$ does not imply a large min-distance in $G[V]$

- Runtime $G\left[U_{+}\right]$and $G\left[U_{-}\right]$are usually intersecting, runtime can be high



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- Observation Distance from t to z is < D/4 + D/4



## Soundness issue

- A large min-distance within $G\left[U_{+}\right]$ does not imply a large min-distance in $G[V]$
- Observation Distance from $t$ to $z$ is < D/4 + D/4
- Idea

Add more vertices in the recursion
$S_{+}=\{u \mid \operatorname{dist}(t, u)<D / 2\}$
This preserves pairwise distances for

$$
U_{+}=\{u \mid \operatorname{dist}(t, u)<D / 4\}
$$



## Soundness issue

- Two different vertex sets:

$$
\begin{aligned}
& S_{+}=\{u \mid \operatorname{dist}(t, u)<D / 2\} \\
& U_{+}=\{u \mid \operatorname{dist}(t, u)<D / 4\}
\end{aligned}
$$

- $G\left[S_{+}\right]$only preserves pairwise distances among $U_{+}$, not the entire $S_{+}$
- In general, the recursive algorithm needs to take two parameters ( $S, U$ ) such that $U \subseteq S \subseteq V$



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$G[S]$ preserves pairwise distances among $U$
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$G\left[S_{i}\right]$ preserves pairwise distances among $U_{i}$


## Runtime issue

- $S_{+}$and $S_{-}$are usually intersecting, so the runtime can be high

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\begin{aligned}
& S_{+}=\{u \mid \operatorname{dist}(t, u)<D / 2\} \\
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$S_{+}=\{u \mid \operatorname{dist}(t, u)<D / 2\}$
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- Enforce disjointness by recursing on instances $\left(S_{+} \backslash S_{-}, U_{+}\right) \&\left(S_{-} \backslash S_{+}, U_{-}\right)$


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- How about soundness again?


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x , y such that $\operatorname{dist}_{G\left[S_{+} \backslash S_{-}\right]}^{\min }(x, y)=\infty$



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$\mathrm{x}, \mathrm{y}$ such that $\operatorname{dist}_{G\left[S_{+} \backslash S_{-}\right]}^{\min }(x, y)=\infty$ but $\operatorname{dist}_{G\left[S_{+}\right]}(x, y)<D / 4$

$S_{+}$


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- $\operatorname{dist}(x, t) \leq \operatorname{dist}(x, z)+\operatorname{dist}(z, t)<3 D / 4$



## Runtinne ise ise

- Enforce disjointness by recursing on instances $\left(S_{+} \backslash S_{-}, U_{+}\right) \&\left(S_{-} \backslash S_{+}, U_{-}\right)$
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$\mathrm{x}, \mathrm{y}$ such that $\operatorname{dist}_{G\left[S_{+} \backslash S_{-}\right]}^{\min }(x, y)=\infty$ but $\operatorname{dist}_{G\left[S_{+}\right]}(x, y)<D / 4$
- $\operatorname{dist}(x, t) \leq \operatorname{dist}(x, z)+\operatorname{dist}(z, t)<3 D / 4$ $\operatorname{dist}(x, t)+\operatorname{dist}(t, y)<D$
- Recurse on $\left(S_{+} \backslash S_{-}, C_{+}\right)$



## The recursive algorithm

## On input pair $(S, C)$

1. Pick a random vertex $t \in C$
2. Compute SSSP in to and from t
3. Define sets:
$S_{+}=\{x \mid \operatorname{dist}(t, x)<D / 2\}$
$C_{+}=C \cap\{x \mid \operatorname{dist}(t, x)<D / 4, \operatorname{dist}(x, t) \geq 3 D / 4\}$
4. Recurse on ( $S_{+} \backslash S_{-}, C_{+} \backslash S_{-}$) and symmetrically $\left(S_{-} \backslash S_{+}, C_{-} \backslash S_{+}\right)$


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## $O(\log n)$-approx min-radius in general digraphs

## Contraction \& Recurse

Goal: decide if the min-radius is
$<O(R \log n)$ or $>R$

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C

Pick a random vertex
$S$

## Contraction \& Recurse

Goal: decide if the min-radius is

$$
<O(R \log n) \text { or }>\mathrm{R}
$$

1. Define four sets $C_{+,-}, S_{+,-}$

$$
\begin{aligned}
& C_{+}=\{u \mid \operatorname{dist}(t, u)<R\} \\
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\end{aligned}
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2. 

$$
\begin{gathered}
\text { If } S_{+} \cup S_{-}=V \\
\mathrm{t} \text { is a center with small radius }
\end{gathered}
$$



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2. Define $W=V \backslash\left(S_{+} \cup S_{-}\right) \neq \varnothing$


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Runtime issue: $W=V \backslash\left(S_{+} \cup S_{-}\right)$ appears in both recursion branches


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- A single vertex could appear everywhere on the recursion tree
- Pruning while recursing: Every vertex appears in at most two branches on the recursion tree
(Details omitted in this presentation)



## Brief sketch of 4-approx of min-radius

## Achieving 4-approx

Goal: decide if the min-radius is $<4 R$ or $>R$

- Cannot use contractions



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Goal: decide if the min-radius is $<4 R$ or $>R$

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- Partition $S=S_{+} \cup S_{-}$ Recurse on $\left(S_{+}, C_{+}\right),\left(S_{-}, C_{-}\right)$



## Achieving 4-approx

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- Impossible to preserve pairwise distances in subgraphs



## Achieving 4-approx

Goal: decide if the min-radius is $<4 R$ or $>R$

- Cannot use contractions
- Partition $S=S_{+} \cup S_{-}$ Recurse on $\left(S_{+}, C_{+}\right),\left(S_{-}, C_{-}\right)$
- Impossible to preserve pairwise distances in subgraphs
- Solution: Only preserve some pairs of distances, i.e. $C \times(C \cup T)$



## Further questions

- Better approximation ratio in near-linear time?

Min-diam/radius in general digraphs:

$$
3 \text { in } \tilde{O}\left(m n^{1 / 2}\right) \quad \text { vs } \quad 4 \text { in } \tilde{O}(m)
$$

## Thanks for listening

