

# Fault-Tolerant $k$ -Supplier with Outliers

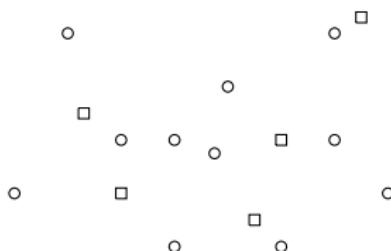
Deeparnab Chakrabarty, Luc Cote, **Ankita Sarkar**

STACS, March 2024

## Background: $k$ -Supplier

### Input.

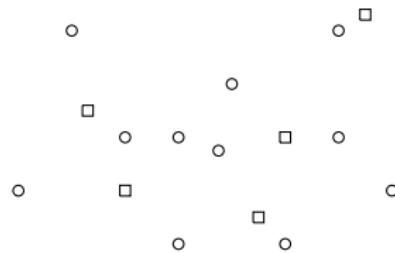
- Clients  $C$ ,  $|C| = n$
- Facilities  $F$



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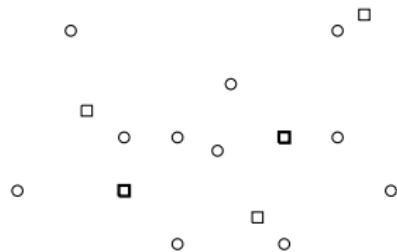
- Clients  $C$ ,  $|C| = n$
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- Metric  $d$  on  $C \cup F$
- Parameter  $k$



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## Output.

- $S \subseteq F$ ,  $|S| \leq k$

$$k = 2$$

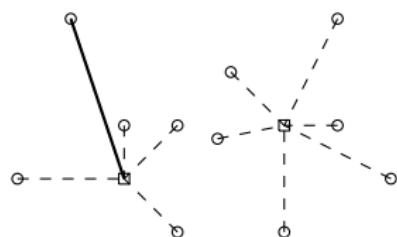
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- minimize  $\max_{v \in C} d(v, S)$



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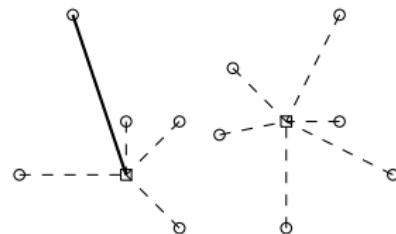
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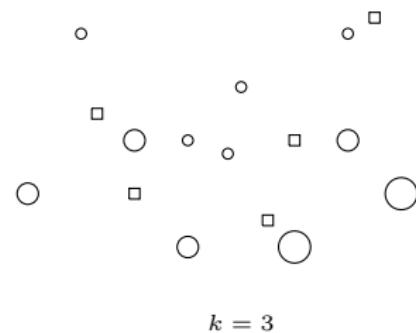
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Tight 3-approximation [Hochbaum and Shmoys, 1986].

## Background: Fault-tolerant $k$ -Supplier (FkS)

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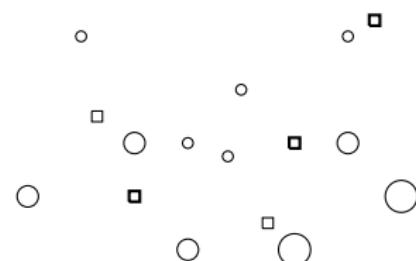
- Clients  $C$ ,  $|C| = n$
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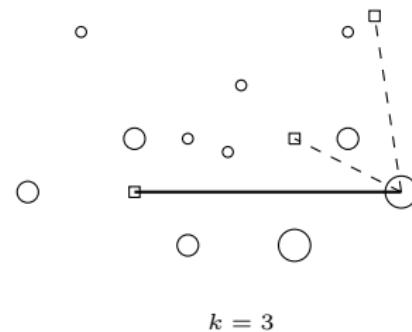
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$$\max_{v \in C} \underbrace{d_{\ell_v}(v, S)}_{\text{distance of } v \text{ to } \ell_v^{\text{th}} \text{ open facility}}$$

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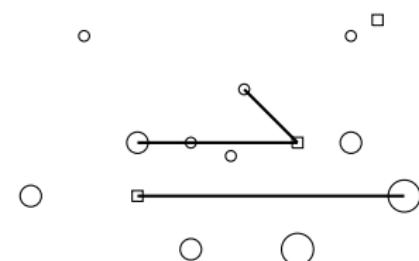
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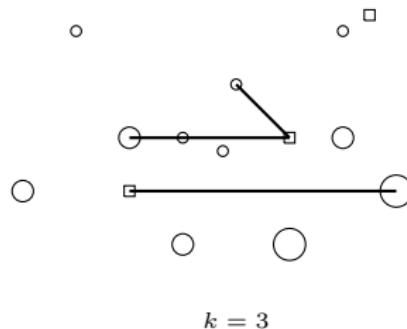
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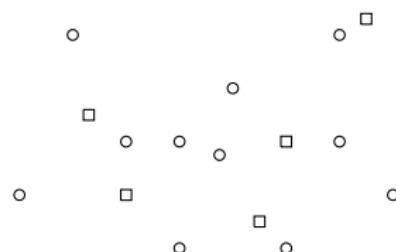
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Tight 3-approximation [modified Hochbaum-Shmoys].

# Background: $k$ -Supplier with Outliers ( $k$ SO)

## Input.

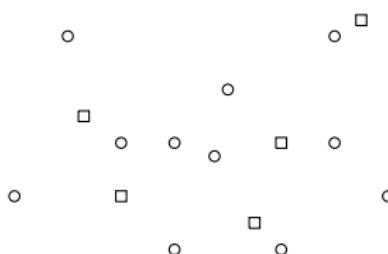
- Clients  $C$ ,  $|C| = n$
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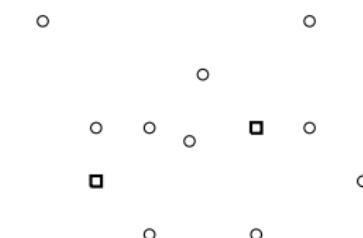
- $S \subseteq F$ ,  $|S| \leq k$
- $\underbrace{T}_{\text{inliers}} \subseteq C$ ,  $|T| \geq m$ ,  
minimize  $\max_{v \in T} d(v, S)$

$$k = 2, m = 6$$

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- Facilities  $F$
- Metric  $d$  on  $C \cup F$
- Parameter  $k$
- Parameter  $m$



## Output.

- $S \subseteq F$ ,  $|S| \leq k$   $k = 2, m = 6$
- $\underbrace{T}_{\text{inliers}} \subseteq C$ ,  $|T| \geq m$ ,  
minimize  $\max_{v \in T} d(v, S)$

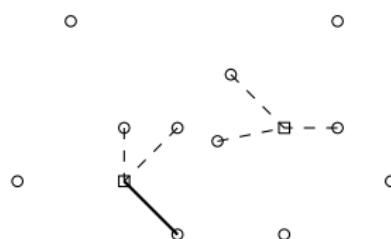
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LP-guided modified Hochbaum-Shmoys

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LP-guided modified Hochbaum-Shmoys

$$r := \text{opt}; \{\text{cov}_v := \mathbf{1}_{v \in T}\}_{v \in C}, \{x_i := \mathbf{1}_{i \in S}\}_{i \in F}$$

- $\sum_{v \in C} \text{cov}_v \geq m, \sum_{i \in F} x_i \leq k$
- $\forall v \in C, \sum_{i \in B(v,r) \cap F} x_i \geq \text{cov}_v$

# Fault-tolerant $k$ -Supplier with Outliers (FkSO)

## Input.

- Clients  $C$ ,  $|C| = n$
- Facilities  $F$
- Metric  $d$  on  $C \cup F$
- Parameter  $k$
- Parameter  $m$
- Fault-tolerances  $\{\ell_v\}_{v \in C}$

## Output.

- $S \subseteq F$ ,  $|S| \leq k$
- $\underbrace{T}_{\text{inliers}} \subseteq C$ ,  $|T| \geq m$ , minimize  $\max_{v \in T} d_{\ell_v}(v, S)$

# This work: approximability of FkSO

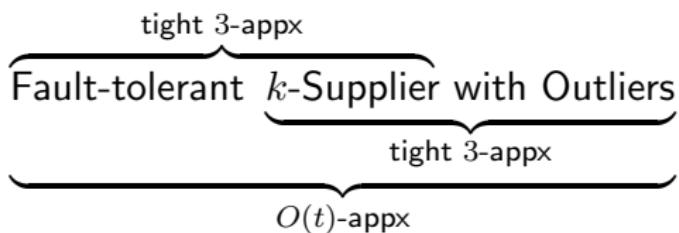
Fault-tolerant  $k$ -Supplier with Outliers

tight 3-appx

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??

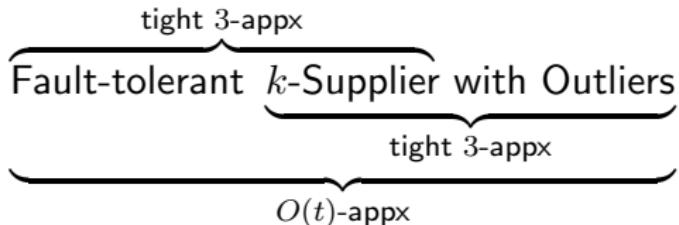
# This work: approximability of FkSO



## Main result

Where  $t = |\ell_v : v \in C|$ , FkSO admits a  $(4t - 1)$ -approximation.

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## Main result

Where  $t = |\ell_v : v \in C|$ , FkSO admits a  $(4t - 1)$ -approximation.

- “Uniform case” i.e.  $t = 1$  admits 3-appx
- “Hochbaum-Shmoys-like algorithms” are  $\Omega(t)$ .

## FkSO: Natural LP [CGK16, ...]

$\{\text{cov}_v := \mathbf{1}_{v \in T}\}_{v \in C}, \{x_i := \mathbf{1}_{i \in S}\}_{i \in F}$

- $\sum_{v \in C} \text{cov}_v \geq m, \sum_{i \in F} x_i \leq k$
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# FkSO: Infinite integrality gap in natural LP

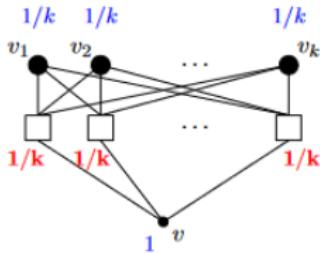
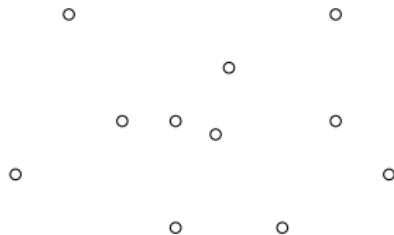


Figure 1: One of the  $k$  identical gadgets in the gap example, showing LP values in red ( $x$  values) and blue (cov values). The “edges” represent distance 1, and all other distances are determined by making triangle inequalities tight. The fault-tolerances are  $\ell_{v_1} = \ell_{v_2} = \dots = \ell_{v_k} = k$ , and  $\ell_v = 1$ .

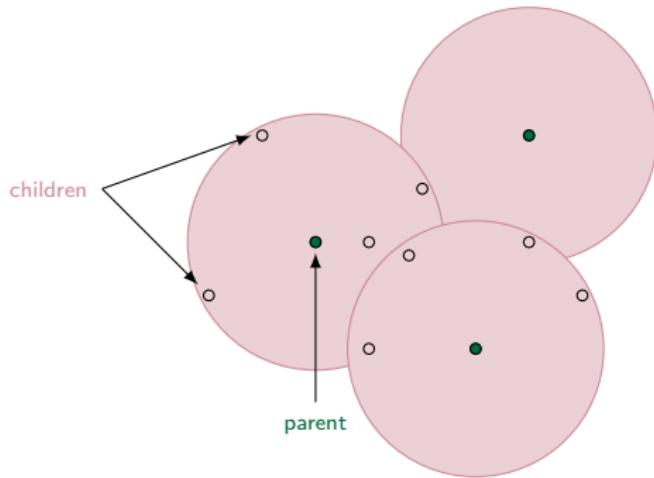
## FkSO: Stronger LP

- Exponential-sized LP [Chakrabarty and Negahbani, 2019]
- Find solutions via round-or-cut
- $\text{cov}_v$ 's as before

## Good partition: $k$ -Supplier [HS86]

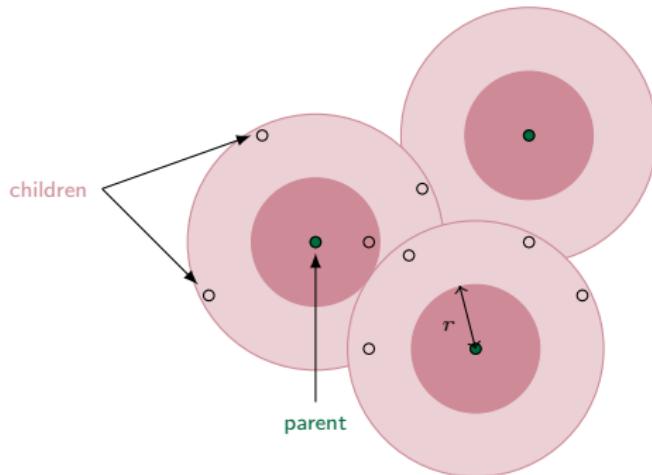


# Good partition: $k$ -Supplier [HS86]



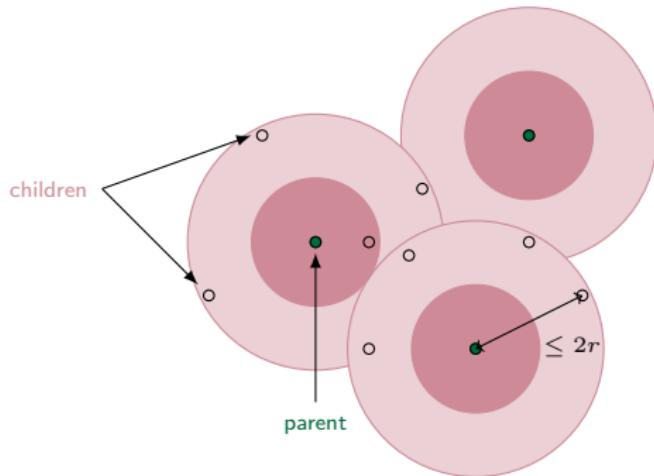
- ① parent-child structure

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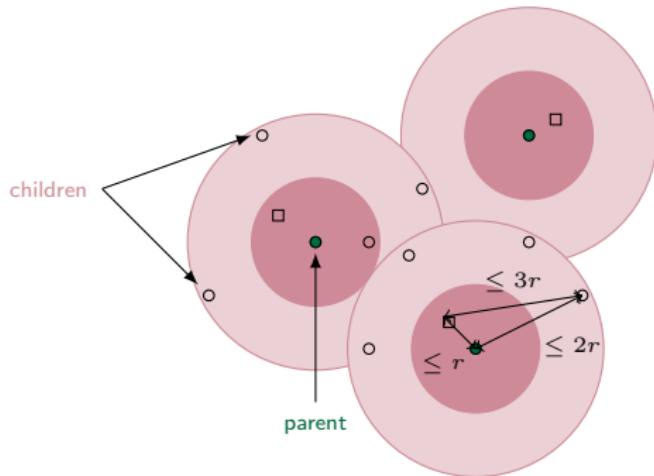
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- ② parents are well-separated

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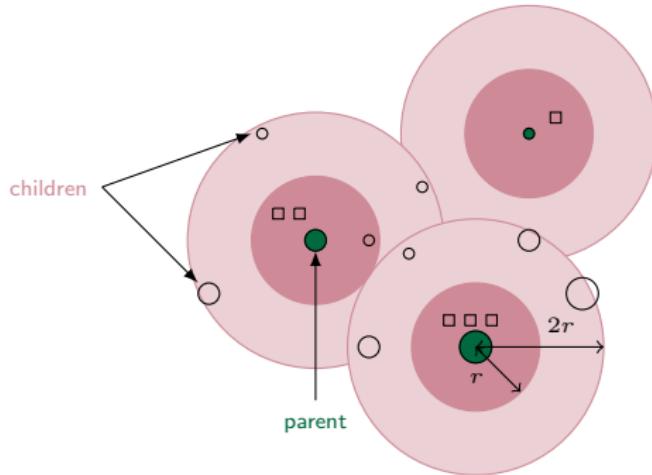
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- ③ children are within  $2r$  of their parents

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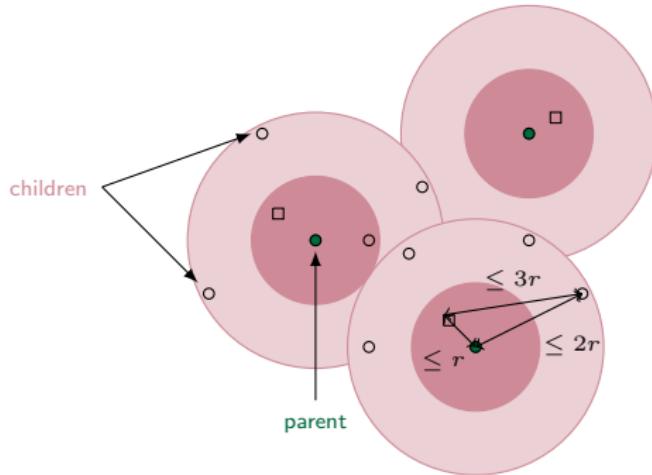
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## Good partition: Fault-tolerant $k$ -Supplier



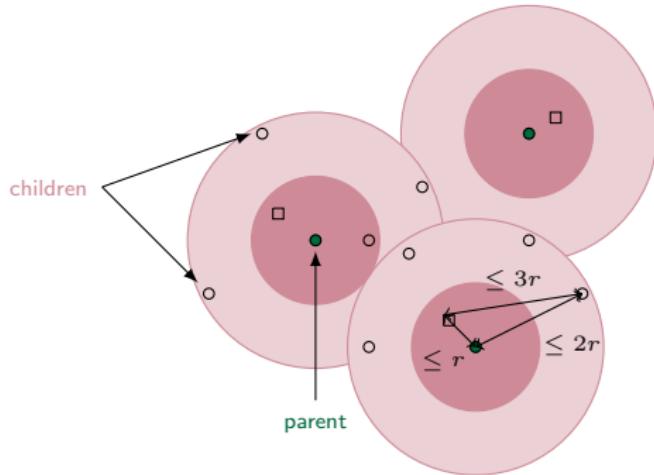
- ① parent-child structure,  $\ell_{\text{parent}} \geq \ell_{\text{child}}$
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## Good partition: $k$ -Supplier with Outliers [CGK16]



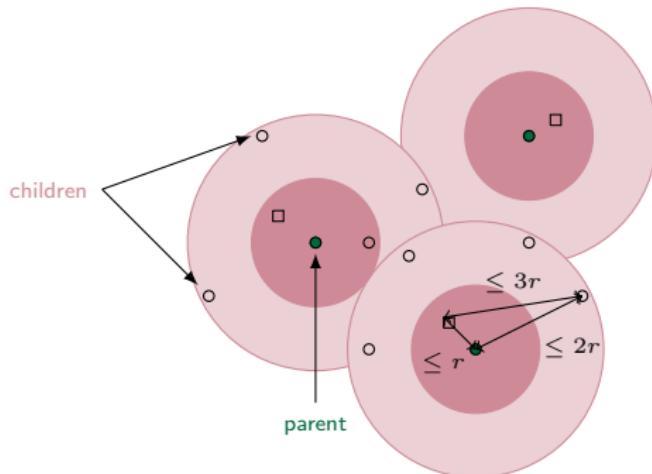
- ① parent-child structure,  $\text{cov}_{\text{parent}} \geq \text{cov}_{\text{child}}$
- ② parents are well-separated
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# Good partition: Fault-tolerant $k$ -Supplier with Outliers



- ① parent-child structure,  $\ell_{\text{parent}} \geq \ell_{\text{child}}$ ,  $\text{cov}_{\text{parent}} \geq \text{cov}_{\text{child}}$
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# Good partition: Fault-tolerant $k$ -Supplier with Outliers

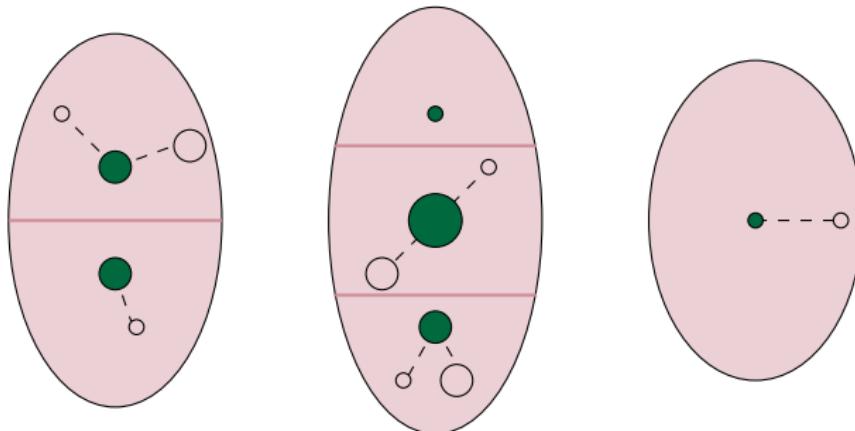


- ① parent-child structure,  $\ell_{\text{parent}} \geq \ell_{\text{child}}$ ,  $\text{cov}_{\text{parent}} \geq \text{cov}_{\text{child}}$
  - ② parents are well-separated
  - ③ children are within  $2r$  of their parents
- $\ell_v$ 's and  $\text{cov}_v$ 's clash!

## $(\rho, \text{cov})$ -good partition for FkSO

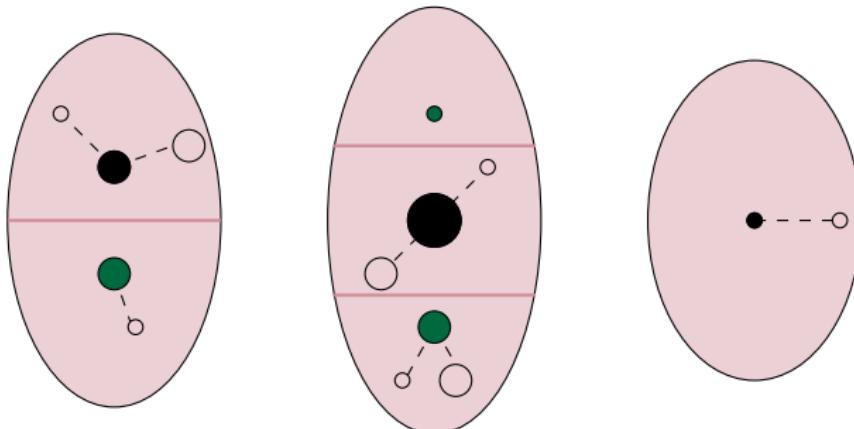
- ① parent-child structure,  $\ell_{\text{parent}} \geq \ell_{\text{child}}$ ,  $\text{cov}_{\text{parent}} \geq \text{cov}_{\text{child}}$
- ② well-separated subset of parents
- ③ children are within  $\rho r$  of this subset

## $(\rho, \text{cov})$ -good partition $\mathcal{P}$



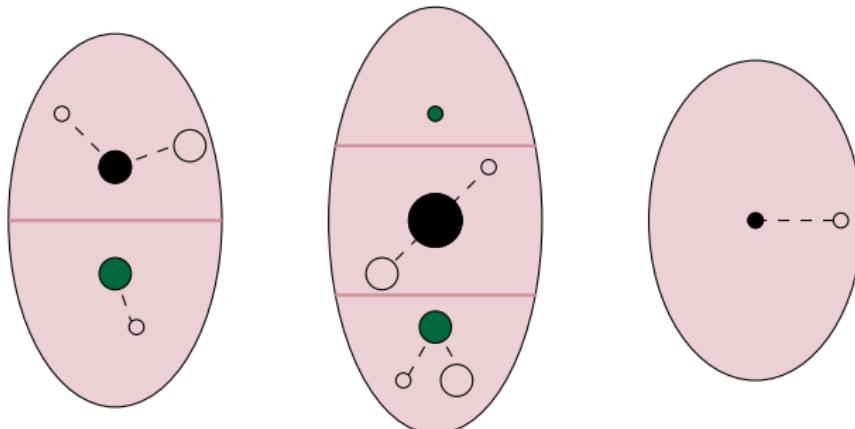
- ①  $\mathcal{P}$  coarsens a **parent-child** structure,  
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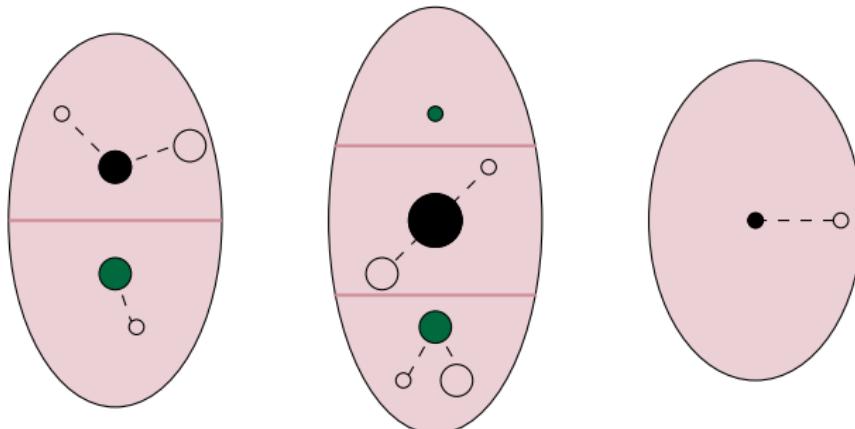
- ①  $\mathcal{P}$  coarsens a **parent-child** structure,  
 $\ell_{\text{parent}} \geq \ell_{\text{child}}$ ,  $\text{cov}_{\text{parent}} \geq \text{cov}_{\text{child}}$
- ②  $\{\text{grparents}(P) \in \text{parent} \cap P\}_{P \in \mathcal{P}}$  s.t.  $\ell_{\text{grparent}} \geq \ell_{\text{parent}}$ ,  
**grparents** are **well-separated**

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 $\ell_{\text{parent}} \geq \ell_{\text{child}}$ ,  $\text{cov}_{\text{parent}} \geq \text{cov}_{\text{child}}$
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## $(\rho + 1)$ -approximation

Theorem (Approximation from good partition)

*Given  $\text{cov}_v$ 's from the LP, if we can construct a  $(\rho, \text{cov})$ -good partition, then we can find a  $(\rho + 1)$ -approximation.*

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Theorem (Approximation from good partition)

*Given  $\text{cov}_v$ 's from the LP, if we can construct a  $(\rho, \text{cov})$ -good partition, then we can find a  $(\rho + 1)$ -approximation.*

DP and round-or-cut.

$$\rho = O(t)$$

## Theorem

We can construct, in polytime, a  $(4t - 2, \text{cov})$ -good partition.

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We can construct, in polytime, a  $(4t - 2, \text{cov})$ -good partition.

Generalization of HS86, CGK16.

$$\rho = \Omega(t)$$

Same tension between  $\ell_v$ 's and  $\text{cov}_v$ 's!

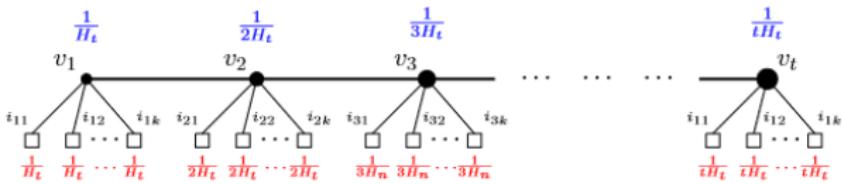


Figure 3: An example showing the limitations of good partitions, with a solution to (L1)-(L4) shown in red (*z values*) and blue (*cov values*). The thin “edges” represent distance 1, the thick “edges” represent distance 2, and all other distances are determined by making triangle inequalities tight. The fault-tolerances are  $\ell_{v_1} = 1, \ell_{v_2} = 2, \dots, \ell_{v_t} = t$ .

## Takeaways

- $\text{cov}_v$ 's from  $k\text{SO}$    $\ell_v$ 's from  $\text{FkS}$
- $(\rho, \text{cov})$ -good partition  $\implies (\rho + 1)$ -approximation
- $\rho = \Theta(t)$ , where  $t = \#\text{distinct } \ell_v$ 's

Thank you!