

# The Metric Relaxation for 0-Extension Admits an $\Omega\left(\log^{2/3} k\right)$ Gap

Nitzan Tur

Joint work with: Roy Schwartz

# Problem Definition

# Problem Definition

Input:

- $\mathcal{G} = (V, E)$  equipped with  $w : E \rightarrow \mathbb{R}^+$ .

# Problem Definition

Input:

- $\mathcal{G} = (V, E)$  equipped with  $w : E \rightarrow \mathbb{R}^+$ .
- $T = \{t_1, \dots, t_k\} \subseteq V$  terminals.

# Problem Definition

Input:

- $\mathcal{G} = (V, E)$  equipped with  $w : E \rightarrow \mathbb{R}^+$ .
- $T = \{t_1, \dots, t_k\} \subseteq V$  terminals.
- $D : T \times T \rightarrow \mathbb{R}^+$  a semi-metric.

# Problem Definition

Input:

- $\mathcal{G} = (V, E)$  equipped with  $w : E \rightarrow \mathbb{R}^+$ .
- $T = \{t_1, \dots, t_k\} \subseteq V$  terminals.
- $D : T \times T \rightarrow \mathbb{R}^+$  a semi-metric.

Goal: Find  $f : V \rightarrow T$ , identity on  $T$ , minimizing:

$$\sum_{(u,v) \in E} w_e \cdot D(f(u), f(v)).$$

# The Metric Extension Relaxation

A solution  $f$ :

- 1 Extends  $D$  from  $T$  to  $V$ .
- 2 Satisfies:  $\min_{i=1}^k \{D(u, t_i)\} = 0, \forall u \in V$ .

# The Metric Extension Relaxation

A solution  $f$ :

- 1 Extends  $D$  from  $T$  to  $V$ .
- 2 Satisfies:  $\min_{i=1}^k \{D(u, t_i)\} = 0, \forall u \in V$ .

The metric extension relaxation ( $MET$ ) ignores 2 above [Karzanov-98]:



# The Metric Extension Relaxation

A solution  $f$ :

- 1 Extends  $D$  from  $T$  to  $V$ .
- 2 Satisfies:  $\min_{i=1}^k \{D(u, t_i)\} = 0, \forall u \in V$ .

The metric extension relaxation ( $MET$ ) ignores 2 above [Karzanov-98]:

$$\begin{aligned} (MET) \quad \min \quad & \sum_{e=(u,v) \in E} w_e \cdot \delta(u, v) \\ \text{s.t.} \quad & (V, \delta) \text{ is a semi-metric space} & (1) \\ & \delta(t_i, t_j) = D(t_i, t_j) & \forall t_i, t_j \in T, i \neq j \quad (2) \end{aligned}$$

# Known Results - Upper Bounds

$$\left. \begin{array}{l} O(\log(k)) \quad [\text{Călinsecu-Karloff-Rabani-05}] \\ O\left(\frac{\log(k)}{\log \log(k)}\right) \quad [\text{Fakcharoenphol-Harrelson-Rao-Talwar-03}] \end{array} \right\} \text{round (MET)}$$

# Known Results - Upper Bounds

$$\left. \begin{array}{l} O(\log(k)) \quad [\text{Călinsecu-Karloff-Rabani-05}] \\ O\left(\frac{\log(k)}{\log \log(k)}\right) \quad [\text{Fakcharoenphol-Harrelson-Rao-Talwar-03}] \end{array} \right\} \text{round (MET)}$$

Above algorithms consist of two steps:

- 1 Select “scale” for each vertex.
- 2 Decompose the metric  $\delta$  in each scale.

# Known Results - Lower Bounds

(*MET*) admits an integrality gap of  $\Omega(\sqrt{\log k})$  [Călinsecu-Karloff-Rabani-05].

# Known Results - Lower Bounds

(*MET*) admits an integrality gap of  $\Omega(\sqrt{\log k})$  [Călinsecu-Karloff-Rabani-05].

Earthmover based relaxation [Chekuri-Khanna-Naor-Zosin-04]:

- Embeds vertices to  $\Delta_k$ .

# Known Results - Lower Bounds

(*MET*) admits an integrality gap of  $\Omega(\sqrt{\log k})$  [Călinsecu-Karloff-Rabani-05].

Earthmover based relaxation [Chekuri-Khanna-Naor-Zosin-04]:

- Embeds vertices to  $\Delta_k$ .
- At least as strong as (*MET*).

# Known Results - Lower Bounds

(*MET*) admits an integrality gap of  $\Omega(\sqrt{\log k})$  [Călinsecu-Karloff-Rabani-05].

Earthmover based relaxation [Chekuri-Khanna-Naor-Zosin-04]:

- Embeds vertices to  $\Delta_k$ .
- At least as strong as (*MET*).
- Assuming UGC [Manokaran-Naor-Raghavendra-Schwartz-08]:

integrality gap of  $\alpha \Rightarrow \alpha$ -hardness.

# Known Results - Lower Bounds

(*MET*) admits an integrality gap of  $\Omega(\sqrt{\log k})$  [Călinsecu-Karloff-Rabani-05].

Earthmover based relaxation [Chekuri-Khanna-Naor-Zosin-04]:

- Embeds vertices to  $\Delta_k$ .
- At least as strong as (*MET*).
- Assuming UGC [Manokaran-Naor-Raghavendra-Schwartz-08]:

integrality gap of  $\alpha \Rightarrow \alpha$ -hardness.

- Admits integrality gap of  $\Omega(\sqrt{\log k})$  [Karloff-Khot-Mehta-Rabani-09].



# Known Results - Summary

## Comments:

- 1 Known algorithms do not know how to exploit earthmover metrics.

# Known Results - Summary

## Comments:

- 1 Known algorithms do not know how to exploit earthmover metrics.
- 2  $O(\sqrt{\log k})$  barrier for designing and analyzing gap instances.

# Known Results - Summary

## Comments:

- 1 Known algorithms do not know how to exploit earthmover metrics.
- 2  $O(\sqrt{\log k})$  barrier for designing and analyzing gap instances.

**Question:** bridge the gap between  $O\left(\frac{\log(k)}{\log \log(k)}\right)$  and  $\Omega(\sqrt{\log k})$  for (*MET*)?

## Theorem [Schwartz-T-20]

For every  $k$ , ( $MET$ ) admits an integrality gap of  $\Omega(\log^{2/3}(k))$  for 0-Extension.

## Theorem [Schwartz-T-20]

For every  $k$ , ( $MET$ ) admits an integrality gap of  $\Omega(\log^{2/3}(k))$  for 0-Extension.

## Proof Overview:

- Construction of graph extensions.
- Small gap implies that graph extensions “split”.
- Most graph extensions do not “split”.

# Graph Extensions

# Definition

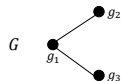
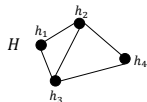
# Definition

Given  $G = (V_G, E_G)$  and  $H = (V_H, E_H)$ ,  $\text{Ext}(G, H)$  is a distribution over graphs:



# Definition

Given  $G = (V_G, E_G)$  and  $H = (V_H, E_H)$ ,  $\text{Ext}(G, H)$  is a distribution over graphs:

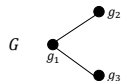
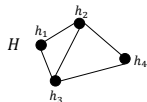


# Definition

Given  $G = (V_G, E_G)$  and  $H = (V_H, E_H)$ ,  $\text{Ext}(G, H)$  is a distribution over graphs:

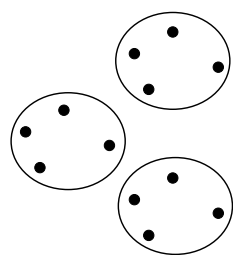
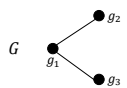
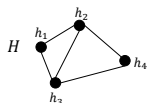
Vertices:

- $V_G \times V_H$ .



# Definition

Given  $G = (V_G, E_G)$  and  $H = (V_H, E_H)$ ,  $\text{Ext}(G, H)$  is a distribution over graphs:

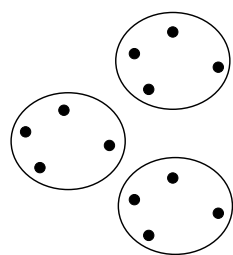
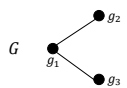
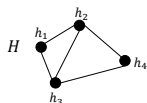


Vertices:

- $V_G \times V_H$ .

# Definition

Given  $G = (V_G, E_G)$  and  $H = (V_H, E_H)$ ,  $\text{Ext}(G, H)$  is a distribution over graphs:

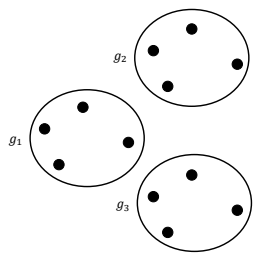
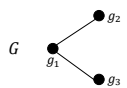
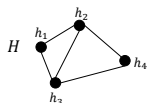


Vertices:

- $V_G \times V_H$ .
- $\{(g, h) : h \in V_H\}$  is  $g$ 's cloud.

# Definition

Given  $G = (V_G, E_G)$  and  $H = (V_H, E_H)$ ,  $\text{Ext}(G, H)$  is a distribution over graphs:

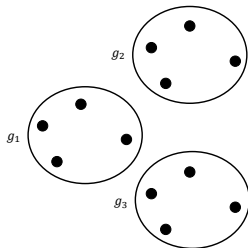
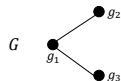
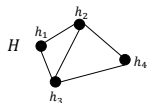


Vertices:

- $V_G \times V_H$ .
- $\{(g, h) : h \in V_H\}$  is  $g$ 's cloud.

# Definition

Given  $G = (V_G, E_G)$  and  $H = (V_H, E_H)$ ,  $\text{Ext}(G, H)$  is a distribution over graphs:



Vertices:

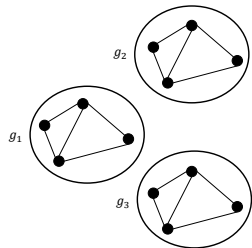
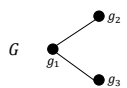
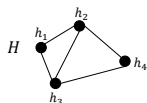
- $V_G \times V_H$ .
- $\{(g, h) : h \in V_H\}$  is  $g$ 's cloud.

Edges:

- intra-cloud edges are  $E_H$ .

# Definition

Given  $G = (V_G, E_G)$  and  $H = (V_H, E_H)$ ,  $\text{Ext}(G, H)$  is a distribution over graphs:



## Vertices:

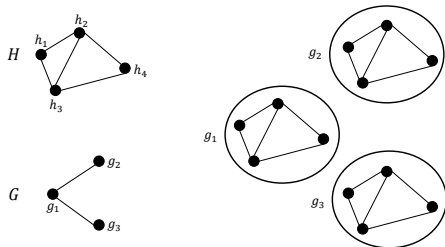
- $V_G \times V_H$ .
- $\{(g, h) : h \in V_H\}$  is  $g$ 's cloud.

## Edges:

- intra-cloud edges are  $E_H$ .

# Definition

Given  $G = (V_G, E_G)$  and  $H = (V_H, E_H)$ ,  $\text{Ext}(G, H)$  is a distribution over graphs:



Vertices:

- $V_G \times V_H$ .
- $\{(g, h) : h \in V_H\}$  is  $g$ 's cloud.

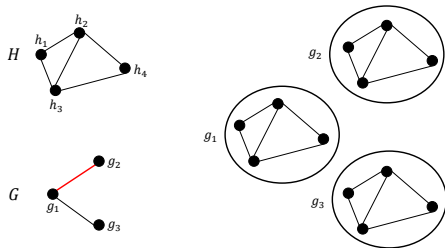
Edges:

- intra-cloud edges are  $E_H$ .
- inter-cloud edges  $(g_i, g_j) \in E_G$ :  
uniform random matching.



# Definition

Given  $G = (V_G, E_G)$  and  $H = (V_H, E_H)$ ,  $\text{Ext}(G, H)$  is a distribution over graphs:



Vertices:

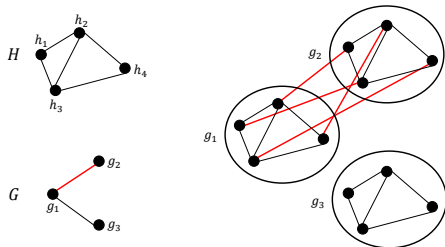
- $V_G \times V_H$ .
- $\{(g, h) : h \in V_H\}$  is  $g$ 's cloud.

Edges:

- intra-cloud edges are  $E_H$ .
- inter-cloud edges  $(g_i, g_j) \in E_G$ :  
uniform random matching.

# Definition

Given  $G = (V_G, E_G)$  and  $H = (V_H, E_H)$ ,  $\text{Ext}(G, H)$  is a distribution over graphs:



Vertices:

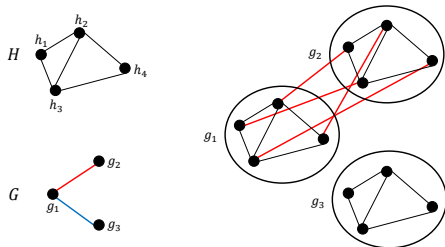
- $V_G \times V_H$ .
- $\{(g, h) : h \in V_H\}$  is  $g$ 's cloud.

Edges:

- intra-cloud edges are  $E_H$ .
- inter-cloud edges  $(g_i, g_j) \in E_G$ :  
uniform random matching.

# Definition

Given  $G = (V_G, E_G)$  and  $H = (V_H, E_H)$ ,  $\text{Ext}(G, H)$  is a distribution over graphs:



Vertices:

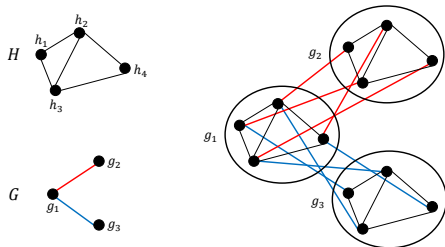
- $V_G \times V_H$ .
- $\{(g, h) : h \in V_H\}$  is  $g$ 's cloud.

Edges:

- intra-cloud edges are  $E_H$ .
- inter-cloud edges  $(g_i, g_j) \in E_G$ :  
uniform random matching.

# Definition

Given  $G = (V_G, E_G)$  and  $H = (V_H, E_H)$ ,  $\text{Ext}(G, H)$  is a distribution over graphs:



Vertices:

- $V_G \times V_H$ .
- $\{(g, h) : h \in V_H\}$  is  $g$ 's cloud.

Edges:

- intra-cloud edges are  $E_H$ .
- inter-cloud edges  $(g_i, g_j) \in E_G$ :  
uniform random matching.

# Graph Extensions

Comments:

## Comments:

- 1 Naturally captures edge lengths:

$$\{\ell_H(e)\}_{e \in E_H}, \{\ell_G(e)\}_{e \in E_G} \Rightarrow \ell(e) = \begin{cases} \ell_H(e) & \text{(intra-cloud)} \\ \ell_G(e) & \text{(inter-cloud)} \end{cases}$$

# Graph Extensions

## Comments:

- 1 Naturally captures edge lengths:

$$\{\ell_H(e)\}_{e \in E_H}, \{\ell_G(e)\}_{e \in E_G} \Rightarrow \ell(e) = \begin{cases} \ell_H(e) & \text{(intra-cloud)} \\ \ell_G(e) & \text{(inter-cloud)} \end{cases}$$

- 2  $H$  has no edges  $\Rightarrow$  graph extensions coincide with lifts of graphs.

# Graph Extensions

## Comments:

- 1 Naturally captures edge lengths:

$$\{\ell_H(e)\}_{e \in E_H}, \{\ell_G(e)\}_{e \in E_G} \Rightarrow \ell(e) = \begin{cases} \ell_H(e) & \text{(intra-cloud)} \\ \ell_G(e) & \text{(inter-cloud)} \end{cases}$$

- 2  $H$  has no edges  $\Rightarrow$  graph extensions coincide with lifts of graphs.

- 3 Relates to group extensions:

$G$  and  $H$  are Cayley graphs and  $K$  is a group extension of  $G$  by  $H$



$K$ 's Cayley graph is in the support of  $\text{Ext}(G, H)$



# What is a Split?

Recall proof overview:

- Small gap implies that graph extensions “split”.
- Most graph extensions do not “split”.

# What is a Split?

Recall proof overview:

- Small gap implies that graph extensions “split”.
- Most graph extensions do not “split”.

## Intuition

Given  $X \sim \text{Ext}(G, H)$  a split assigns to **most** clouds  $g$  a **representative**  $f(g) \in V_X$  where:

# What is a Split?

Recall proof overview:

- Small gap implies that graph extensions “split”.
- Most graph extensions do not “split”.

## Intuition

Given  $X \sim \text{Ext}(G, H)$  a split assigns to **most** clouds  $g$  a **representative**  $f(g) \in V_X$  where:

- 1  $g$ 's representative  $f(g)$  is **close** to cloud  $g$  in  $G$ .

# What is a Split?

Recall proof overview:

- Small gap implies that graph extensions “split”.
- Most graph extensions do not “split”.

## Intuition

Given  $X \sim \text{Ext}(G, H)$  a split assigns to **most** clouds  $g$  a **representative**  $f(g) \in V_X$  where:

- 1  $g$ 's representative  $f(g)$  is **close** to cloud  $g$  in  $G$ .
- 2 **most** neighboring clouds  $(g_1, g_2) \in E_G$  have **close** representatives in  $X$ .

# What is a Split?

Recall proof overview:

- Small gap implies that graph extensions “split”.
- Most graph extensions do not “split”.

## Intuition

Given  $X \sim \text{Ext}(G, H)$  a split assigns to **most** clouds  $g$  a **representative**  $f(g) \in V_X$  where:

- 1  $g$ 's representative  $f(g)$  is **close** to cloud  $g$  in  $G$ .
- 2 **most** neighboring clouds  $(g_1, g_2) \in E_G$  have **close** representatives in  $X$ .
- 3  $f$  preserves some topological properties of  $G$ .

# What is a Split?

Recall proof overview:

- Small gap implies that graph extensions “split”.
- Most graph extensions do not “split”.

## Intuition

Given  $X \sim \text{Ext}(G, H)$  a split assigns to **most** clouds  $g$  a **representative**  $f(g) \in V_X$  where:

- 1  $g$ 's representative  $f(g)$  is **close** to cloud  $g$  in  $G$ .
- 2 **most** neighboring clouds  $(g_1, g_2) \in E_G$  have **close** representatives in  $X$ .
- 3  $f$  preserves some topological properties of  $G$ .

Notes:

- Need to quantify **most** and **close**.
- Captures split extensions of groups.

# The Instance

# Instance Definition

$X \sim \text{Ext}(G, H)$  where:

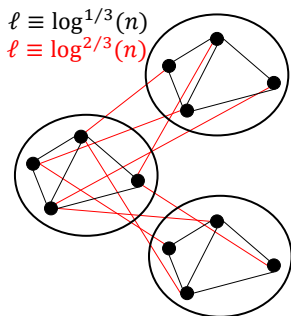
- 1  $G$  and  $H$  are constant degree high girth expanders on  $n$  vertices.
- 2  $\ell_H(e) \equiv \log^{1/3}(n)$  and  $\ell_G(e) \equiv \log^{2/3}(n)$ .



# Instance Definition

$X \sim \text{Ext}(G, H)$  where:

- 1  $G$  and  $H$  are constant degree high girth expanders on  $n$  vertices.
- 2  $\ell_H(e) \equiv \log^{1/3}(n)$  and  $\ell_G(e) \equiv \log^{2/3}(n)$ .

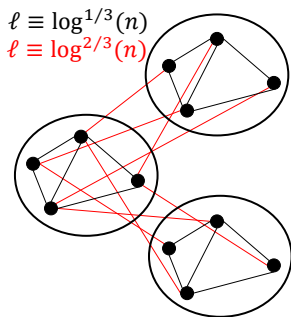


$X \sim \text{Ext}(G, H)$

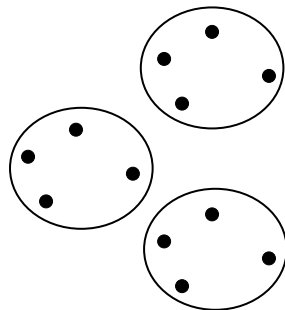
# Instance Definition

$X \sim \text{Ext}(G, H)$  where:

- 1  $G$  and  $H$  are constant degree high girth expanders on  $n$  vertices.
- 2  $\ell_H(e) \equiv \log^{1/3}(n)$  and  $\ell_G(e) \equiv \log^{2/3}(n)$ .



$X \sim \text{Ext}(G, H)$

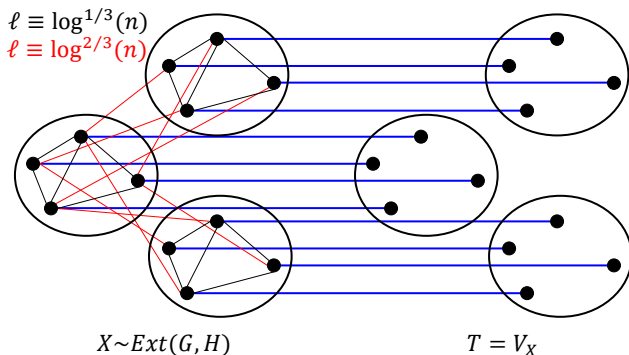


$T = V_X$

# Instance Definition

$X \sim \text{Ext}(G, H)$  where:

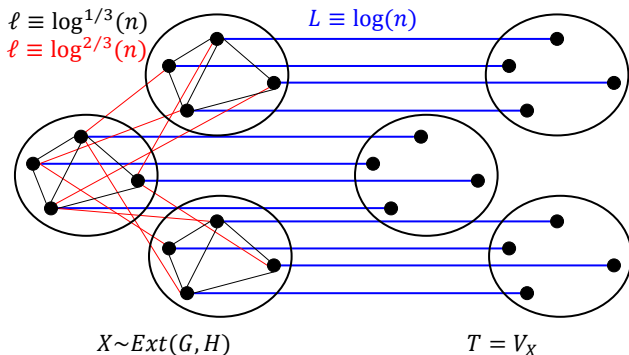
- 1  $G$  and  $H$  are constant degree high girth expanders on  $n$  vertices.
- 2  $\ell_H(e) \equiv \log^{1/3}(n)$  and  $\ell_G(e) \equiv \log^{2/3}(n)$ .



# Instance Definition

$X \sim \text{Ext}(G, H)$  where:

- 1  $G$  and  $H$  are constant degree high girth expanders on  $n$  vertices.
- 2  $\ell_H(e) \equiv \log^{1/3}(n)$  and  $\ell_G(e) \equiv \log^{2/3}(n)$ .

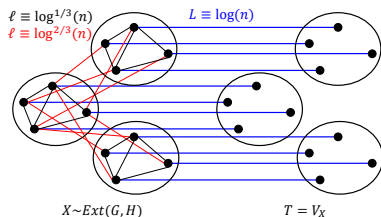


# Instance Definition (cont.)

$\mathcal{G}$  and  $T$  are defined, what remains?

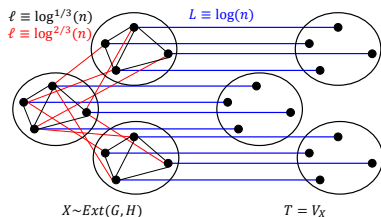
# Instance Definition (cont.)

$\mathcal{G}$  and  $T$  are defined, what remains?



# Instance Definition (cont.)

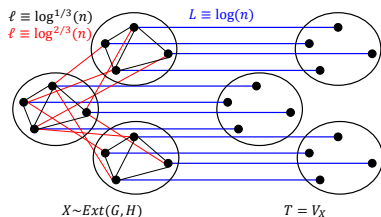
$\mathcal{G}$  and  $T$  are defined, what remains?



- $(T, D)$  shortest path metric on  $\mathcal{G}$ .

# Instance Definition (cont.)

$\mathcal{G}$  and  $T$  are defined, what remains?



- $(T, D)$  shortest path metric on  $\mathcal{G}$ .
- Weights  $w$  are inverse of length.



# The Fractional Solution

- Our construction naturally gives a solution to (*MET*).

# The Fractional Solution

- Our construction naturally gives a solution to (*MET*).
- Each edge costs 1.

# The Fractional Solution

- Our construction naturally gives a solution to (*MET*).
- Each edge costs 1.
- There are  $\Theta(n^2)$  edges in the instance.

# The Fractional Solution

- Our construction naturally gives a solution to (*MET*).
- Each edge costs 1.
- There are  $\Theta(n^2)$  edges in the instance.
- $\Theta(n^2)$  in total.

## Recall Proof Overview:

- Construction of graph extensions.
- Small gap implies that graph extensions “split”.
- Most graph extensions do not “split”.

## Recall Proof Overview:

- Construction of graph extensions.
  - Small gap implies that graph extensions “split”.
  - Most graph extensions do not “split”.
- 
- Assume we have a small gap  $O(\varepsilon^2 \log^{2/3}(n))$ :  
$$f : V_X \rightarrow T \text{ costs } O(\varepsilon^2 \log^{2/3}(n) \cdot n^2).$$
  - At most  $\varepsilon n^2$  edges cost more than  $\varepsilon \log^{2/3}(n)$ .

## Recall Proof Overview:

- Construction of graph extensions.
  - Small gap implies that graph extensions “split”.
  - Most graph extensions do not “split”.
- 
- Assume we have a small gap  $O(\varepsilon^2 \log^{2/3}(n))$ :  
$$f : V_X \rightarrow T \text{ costs } O(\varepsilon^2 \log^{2/3}(n) \cdot n^2).$$
  - At most  $\varepsilon n^2$  edges cost more than  $\varepsilon \log^{2/3}(n)$ .

**Conclusion:**  $\delta(f(u), f(v)) \leq \varepsilon \log^{2/3}(n) \delta(u, v)$  for  $1 - \varepsilon$  of the edges.

# Split - Existence of Representatives

## Intuition

Given  $X \sim \text{Ext}(G, H)$  a split assigns to **most** clouds  $g$  a **representative**  $f(g) \in V_X$  where:

- 1  $g$ 's representative  $f(g)$  is **close** to cloud  $g$  in  $G$ .
- 2 **most** neighboring clouds  $(g_1, g_2) \in E_G$  have **close** representatives in  $X$ .
- 3  $f$  preserves some topological properties of  $G$ .

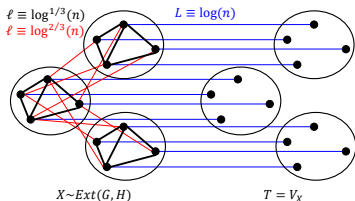


# Split - Existence of Representatives

## Intuition

Given  $X \sim \text{Ext}(G, H)$  a split assigns to **most** clouds  $g$  a **representative**  $f(g) \in V_X$  where:

- 1  $g$ 's representative  $f(g)$  is close to cloud  $g$  in  $G$ .
- 2 most neighboring clouds  $(g_1, g_2) \in E_G$  have close representatives in  $X$ .
- 3  $f$  preserves some topological properties of  $G$ .



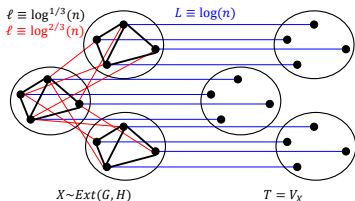
- Distance between terminals  $\geq L = \log(n)$ .
- Intra-cloud neighbors distance is  $\log^{1/3}(n)$ .

# Split - Existence of Representatives

## Intuition

Given  $X \sim \text{Ext}(G, H)$  a split assigns to **most** clouds  $g$  a **representative**  $f(g) \in V_X$  where:

- 1  $g$ 's representative  $f(g)$  is close to cloud  $g$  in  $G$ .
- 2 most neighboring clouds  $(g_1, g_2) \in E_G$  have close representatives in  $X$ .
- 3  $f$  preserves some topological properties of  $G$ .



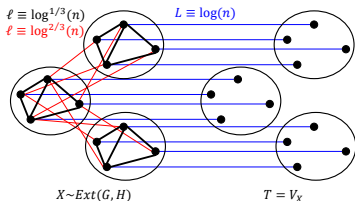
- Distance between terminals  $\geq L = \log(n)$ .
- Intra-cloud neighbors distance is  $\log^{1/3}(n)$ .
- Most intra-cloud neighbors are assigned to the same terminal.
- $H$  is an expander.

# Split - Existence of Representatives

## Intuition

Given  $X \sim \text{Ext}(G, H)$  a split assigns to **most** clouds  $g$  a **representative**  $f(g) \in V_X$  where:

- 1  $g$ 's representative  $f(g)$  is close to cloud  $g$  in  $G$ .
- 2 most neighboring clouds  $(g_1, g_2) \in E_G$  have close representatives in  $X$ .
- 3  $f$  preserves some topological properties of  $G$ .



- Distance between terminals  $\geq L = \log(n)$ .
- Intra-cloud neighbors distance is  $\log^{1/3}(n)$ .
- Most intra-cloud neighbors are assigned to the same terminal.
- $H$  is an expander.

Most clouds have a consensus and this consensus is the representative.

# Split - Representatives are Close

## Intuition

Given  $X \sim \text{Ext}(G, H)$  a split assigns to **most** clouds  $g$  a **representative**  $f(g) \in V_X$  where:

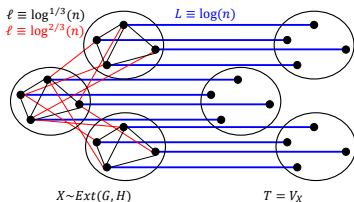
- 1  $g$ 's representative  $f(g)$  is **close** to cloud  $g$  in  $G$ .
- 2 **most** neighboring clouds  $(g_1, g_2) \in E_G$  have **close** representatives in  $X$ .
- 3  $f$  preserves some topological properties of  $G$ .

# Split - Representatives are Close

## Intuition

Given  $X \sim \text{Ext}(G, H)$  a split assigns to **most** clouds  $g$  a **representative**  $f(g) \in V_X$  where:

- 1  $g$ 's representative  $f(g)$  is **close** to cloud  $g$  in  $G$ .
- 2 **most** neighboring clouds  $(g_1, g_2) \in E_G$  have **close** representatives in  $X$ .
- 3  $f$  preserves some topological properties of  $G$ .



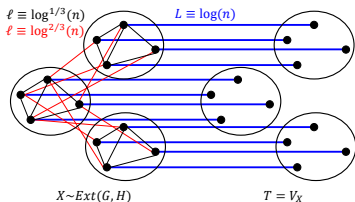
- Blue edges length is  $\log(n)$ .
- Red edges (inter-cloud) length is  $\log^{2/3}(n)$ .

# Split - Representatives are Close

## Intuition

Given  $X \sim \text{Ext}(G, H)$  a split assigns to **most** clouds  $g$  a **representative**  $f(g) \in V_X$  where:

- 1  $g$ 's representative  $f(g)$  is **close** to cloud  $g$  in  $G$ .
- 2 **most** neighboring clouds  $(g_1, g_2) \in E_G$  have **close** representatives in  $X$ .
- 3  $f$  preserves some topological properties of  $G$ .



- Blue edges length is  $\log(n)$ .
- Red edges (inter-cloud) length is  $\log^{2/3}(n)$ .

Cloud of  $f(g)$  is  $\underbrace{\varepsilon \log^{2/3}(n) \cdot \log(n)}_{\text{gap}} / \log^{2/3}(n) = \varepsilon \log(n)$  **hops** away in  $G$  from  $g$ .

# Split - Neighboring Representatives

## Intuition

Given  $X \sim \text{Ext}(G, H)$  a split assigns to **most** clouds  $g$  a **representative**  $f(g) \in V_X$  where:

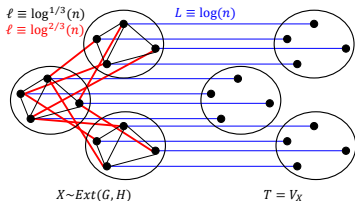
- 1  $g$ 's representative  $f(g)$  is **close** to cloud  $g$  in  $G$ .
- 2 **most** neighboring clouds  $(g_1, g_2) \in E_G$  have **close** representatives in  $X$ .
- 3  $f$  preserves some topological properties of  $G$ .

# Split - Neighboring Representatives

## Intuition

Given  $X \sim \text{Ext}(G, H)$  a split assigns to **most** clouds  $g$  a **representative**  $f(g) \in V_X$  where:

- 1  $g$ 's representative  $f(g)$  is **close** to cloud  $g$  in  $G$ .
- 2 **most** neighboring clouds  $(g_1, g_2) \in E_G$  have **close** representatives in  $X$ .
- 3  $f$  preserves some topological properties of  $G$ .



- Red edges (inter-cloud) length is  $\log^{2/3}(n)$ .
- Blue edges (intra-cloud) length is  $\log^{1/3}(n)$ .

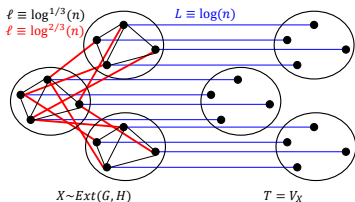


# Split - Neighboring Representatives

## Intuition

Given  $X \sim \text{Ext}(G, H)$  a split assigns to **most** clouds  $g$  a **representative**  $f(g) \in V_X$  where:

- 1  $g$ 's representative  $f(g)$  is **close** to cloud  $g$  in  $G$ .
- 2 **most** neighboring clouds  $(g_1, g_2) \in E_G$  have **close** representatives in  $X$ .
- 3  $f$  preserves some topological properties of  $G$ .



- Red edges (inter-cloud) length is  $\log^{2/3}(n)$ .
- Blue edges (intra-cloud) length is  $\log^{1/3}(n)$ .

$f(g_1)$  and  $f(g_2)$  are  $\underbrace{\varepsilon \log^{2/3}(n) \cdot \log^{2/3}(n)}_{\text{gap}} / \log^{1/3}(n) = \varepsilon \log(n)$  **hops** away in  $X$ .

## Intuition

Given  $X \sim \text{Ext}(G, H)$  a split assigns to **most** clouds  $g$  a **representative**  $f(g) \in V_X$  where:

- 1  $g$ 's representative  $f(g)$  is **close** to cloud  $g$  in  $G$ .
- 2 **most** neighboring clouds  $(g_1, g_2) \in E_G$  have **close** representatives in  $X$ .
- 3  $f$  preserves some topological properties of  $G$ .

## Intuition

Given  $X \sim \text{Ext}(G, H)$  a split assigns to **most** clouds  $g$  a **representative**  $f(g) \in V_X$  where:

- 1  $g$ 's representative  $f(g)$  is **close** to cloud  $g$  in  $G$ .
- 2 **most** neighboring clouds  $(g_1, g_2) \in E_G$  have **close** representatives in  $X$ .
- 3  $f$  preserves some topological properties of  $G$ .

- We have  $f : V_G \rightarrow V_X$ , the representative map.
- Let  $\pi : V_X \rightarrow V_G$  projection.

## Intuition

Given  $X \sim \text{Ext}(G, H)$  a split assigns to **most** clouds  $g$  a **representative**  $f(g) \in V_X$  where:

- 1  $g$ 's representative  $f(g)$  is **close** to cloud  $g$  in  $G$ .
- 2 **most** neighboring clouds  $(g_1, g_2) \in E_G$  have **close** representatives in  $X$ .
- 3  $f$  preserves some topological properties of  $G$ .

- We have  $f : V_G \rightarrow V_X$ , the representative map.
- Let  $\pi : V_X \rightarrow V_G$  projection.

**Topological Property:**  $\pi \circ f$  preserves the cycle structure of  $G$ .

## Intuition

Given  $X \sim \text{Ext}(G, H)$  a split assigns to **most** clouds  $g$  a **representative**  $f(g) \in V_X$  where:

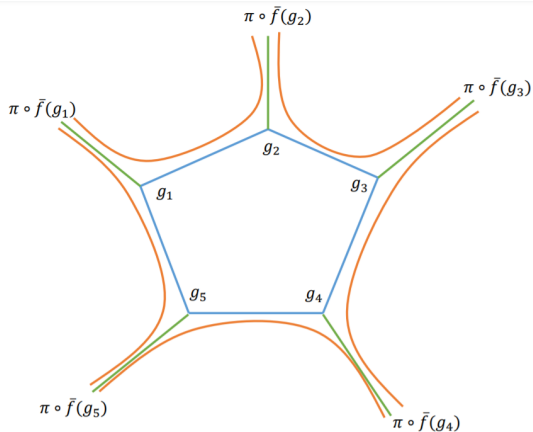
- 1  $g$ 's representative  $f(g)$  is **close** to cloud  $g$  in  $G$ .
- 2 **most** neighboring clouds  $(g_1, g_2) \in E_G$  have **close** representatives in  $X$ .
- 3  $f$  preserves some topological properties of  $G$ .

- We have  $f : V_G \rightarrow V_X$ , the representative map.
- Let  $\pi : V_X \rightarrow V_G$  projection.

**Topological Property:**  $\pi \circ f$  preserves the cycle structure of  $G$ .

**Algebraic topology intuition:**  $\pi \circ f$  is a homeomorphism  $\Rightarrow$  it preserves the first homology.

# Cycle-Homeomorphism

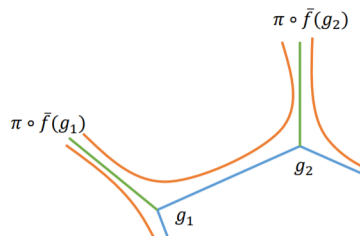


- $\pi : V_X \rightarrow V_G$ , the natural projection.
- $f : V_G \rightarrow V_X$ , the representative map.
- $f$  induces a map  $\bar{f} : E_G \rightarrow \mathbb{F}_2^{E_X}$ , "the short path map"

We call  $f$  a *Cycle-Homeomorphism* if  $\pi \circ \bar{f} : \mathbb{F}_2^{E_G} \rightarrow \mathbb{F}_2^{E_G}$  is identity on cycles.

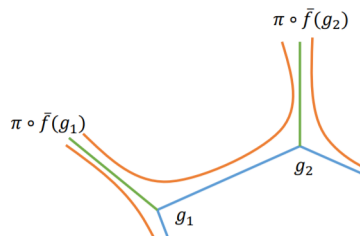
# Cycle-Homeomorphism

Let  $g_1, g_2$  neighboring clouds.



# Cycle-Homeomorphism

Let  $g_1, g_2$  neighboring clouds.

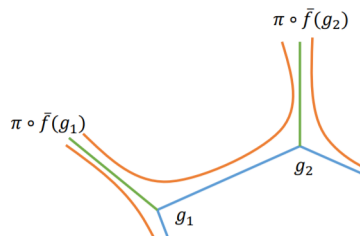


- $g_1, g_2$  are 1 hops away.



# Cycle-Homeomorphism

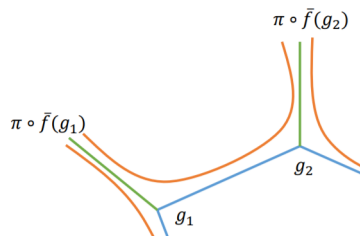
Let  $g_1, g_2$  neighboring clouds.



- $g_1, g_2$  are 1 hops away.
- $\pi \circ \bar{f}(g_1), g_1$  are  $\varepsilon \log(n)$  hops away.
- $\pi \circ \bar{f}(g_2), g_2$  are  $\varepsilon \log(n)$  hops away.

# Cycle-Homeomorphism

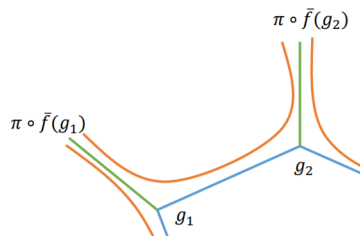
Let  $g_1, g_2$  neighboring clouds.



- $g_1, g_2$  are 1 hops away.
- $\pi \circ \bar{f}(g_1), g_1$  are  $\varepsilon \log(n)$  hops away.
- $\pi \circ \bar{f}(g_2), g_2$  are  $\varepsilon \log(n)$  hops away.
- $\pi \circ \bar{f}(g_2), \pi \circ \bar{f}(g_1)$  are  $\varepsilon \log(n)$  hops away.

# Cycle-Homeomorphism

Let  $g_1, g_2$  neighboring clouds.



- $g_1, g_2$  are 1 hops away.
- $\pi \circ \bar{f}(g_1), g_1$  are  $\varepsilon \log(n)$  hops away.
- $\pi \circ \bar{f}(g_2), g_2$  are  $\varepsilon \log(n)$  hops away.
- $\pi \circ \bar{f}(g_2), \pi \circ \bar{f}(g_1)$  are  $\varepsilon \log(n)$  hops away.

- The cycle  $g_1 \rightarrow g_2 \rightarrow \pi \circ \bar{f}(g_2) \rightarrow \pi \circ \bar{f}(g_1) \rightarrow g_1$  has  $O(\varepsilon \log(n))$  edges.
- The girth of  $G$  has  $\Omega(\log(n))$ .
- This cycle is trivial.
- $f$  is cycle-homeomorphism.

# Splits (probably) Do Not Exist

# Splits (probably) Do Not Exist

## Recall Proof Overview:

- Construction of graph extensions.
- Small gap implies that graph extensions “split”.
- Most graph extensions do not “split”.

# Splits (probably) Do Not Exist

## Recall Proof Overview:

- Construction of graph extensions.
- Small gap implies that graph extensions “split”.
- Most graph extensions do not “split”.

Informally:

- We need to choose a vertex “in” each cloud.

# Splits (probably) Do Not Exist

## Recall Proof Overview:

- Construction of graph extensions.
- Small gap implies that graph extensions “split”.
- Most graph extensions do not “split”.

## Informally:

- We need to choose a vertex “in” each cloud.
- Neighboring clouds have “neighboring” representatives.

# Splits (probably) Do Not Exist

## Recall Proof Overview:

- Construction of graph extensions.
- Small gap implies that graph extensions “split”.
- Most graph extensions do not “split”.

## Informally:

- We need to choose a vertex “in” each cloud.
- Neighboring clouds have “neighboring” representatives.
- We have  $|V_G|$  “variables” and  $|E_G|$  “constraints”.



# Splits (probably) Do Not Exist

## Recall Proof Overview:

- Construction of graph extensions.
- Small gap implies that graph extensions “split”.
- Most graph extensions do not “split”.

## Informally:

- We need to choose a vertex “in” each cloud.
- Neighboring clouds have “neighboring” representatives.
- We have  $|V_G|$  “variables” and  $|E_G|$  “constraints”.
- Each variable has “ $n$ ” possibilities.

# Splits (probably) Do Not Exist

## Recall Proof Overview:

- Construction of graph extensions.
- Small gap implies that graph extensions “split”.
- Most graph extensions do not “split”.

## Informally:

- We need to choose a vertex “in” each cloud.
- Neighboring clouds have “neighboring” representatives.
- We have  $|V_G|$  “variables” and  $|E_G|$  “constraints”.
- Each variable has “ $n$ ” possibilities.
- Each constraint holds with probability of “ $1/n$ ”.

# Splits (probably) Do Not Exist

## Recall Proof Overview:

- Construction of graph extensions.
- Small gap implies that graph extensions “split”.
- Most graph extensions do not “split”.

## Informally:

- We need to choose a vertex “in” each cloud.
- Neighboring clouds have “neighboring” representatives.
- We have  $|V_G|$  “variables” and  $|E_G|$  “constraints”.
- Each variable has “ $n$ ” possibilities.
- Each constraint holds with probability of “ $1/n$ ”.
- If  $|E_G| \geq 2|V_G|$ , then split should not exist (via union bound).

# Splits (probably) Do Not Exist (cont.)

Two issues:

- 1 All requirements, e.g., “in” and “neighboring”, hold approximately:

# Splits (probably) Do Not Exist (cont.)

Two issues:

- 1 All requirements, e.g., “in” and “neighboring”, hold approximately:
  - Each variable has  $n^{1+\varepsilon}$  possibilities.
  - Each constraint holds with probability of  $1/n^{1-\varepsilon}$ .

# Splits (probably) Do Not Exist (cont.)

Two issues:

- 1 All requirements, e.g., “in” and “neighboring”, hold approximately:
  - Each variable has  $n^{1+\varepsilon}$  possibilities.
  - Each constraint holds with probability of  $1/n^{1-\varepsilon}$ .
- 2 The constraints are not probabilistically independent:

# Splits (probably) Do Not Exist (cont.)

Two issues:

- 1 All requirements, e.g., “in” and “neighboring”, hold approximately:
  - Each variable has  $n^{1+\varepsilon}$  possibilities.
  - Each constraint holds with probability of  $1/n^{1-\varepsilon}$ .
- 2 The constraints are not probabilistically independent:
  - Define a suitable combinatorial structure that allows enough independence.
  - Linearly independent (modulo 2) cycles imply probabilistic independence.

# Certificates

A combinatorial structure that satisfies:

- Existence of split  $\Rightarrow$  existence of certificate.



# Certificates

A combinatorial structure that satisfies:

- Existence of split  $\Rightarrow$  existence of certificate.
- There are not too many certificates:

# Certificates

A combinatorial structure that satisfies:

- Existence of split  $\Rightarrow$  existence of certificate.
- There are not too many certificates:

$$\text{number of certificates} \leq n^{(1+O(\varepsilon))n}$$

# Certificates

A combinatorial structure that satisfies:

- Existence of split  $\Rightarrow$  existence of certificate.
- There are not too many certificates:

$$\text{number of certificates} \leq n^{(1+O(\varepsilon))n}$$

- Provides enough (almost) independent constraints:

# Certificates

A combinatorial structure that satisfies:

- Existence of split  $\Rightarrow$  existence of certificate.
- There are not too many certificates:

$$\text{number of certificates} \leq n^{(1+O(\varepsilon))n}$$

- Provides enough (almost) independent constraints:

at least  $|E_G| - |V_G|$  constraints each satisfied with probability  $\leq n^{-(1-O(\varepsilon))}$

# Certificates

A combinatorial structure that satisfies:

- Existence of split  $\Rightarrow$  existence of certificate.

- There are not too many certificates:

$$\text{number of certificates} \leq n^{(1+O(\varepsilon))n}$$

- Provides enough (almost) independent constraints:

at least  $|E_G| - |V_G|$  constraints each satisfied with probability  $\leq n^{-(1-O(\varepsilon))}$

**Conclusion:** no split exists by union bound!

# Certificates

A combinatorial structure that satisfies:

- Existence of split  $\Rightarrow$  existence of certificate.

- There are not too many certificates:

$$\text{number of certificates} \leq n^{(1+O(\epsilon))n}$$

- Provides enough (almost) independent constraints:

at least  $|E_G| - |V_G|$  constraints each satisfied with probability  $\leq n^{-(1-O(\epsilon))}$

**Conclusion:** no split exists by union bound!

A certificate encodes a “formal roadmap” of:

union of all shortest paths in  $X$  between  $f(g_1)$  and  $f(g_2)$  for  $(g_1, g_2) \in E_G$

# Certificates - Inner Connected Components

A certificate's core is an Inner Connected Component graph:

# Certificates - Inner Connected Components

A certificate's core is an Inner Connected Component graph:

- 1 Union of all shortest paths in  $X$  between  $f(g_1)$  and  $f(g_2)$  for  $(g_1, g_2) \in E_G$ .



# Certificates - Inner Connected Components

A certificate's core is an Inner Connected Component graph:

- 1 Union of all shortest paths in  $X$  between  $f(g_1)$  and  $f(g_2)$  for  $(g_1, g_2) \in E_G$ .
- 2 Contract all intra-cloud edges.

# Certificates - Inner Connected Components

A certificate's core is an Inner Connected Component graph:

- 1 Union of all shortest paths in  $X$  between  $f(g_1)$  and  $f(g_2)$  for  $(g_1, g_2) \in E_G$ .
- 2 Contract all intra-cloud edges.
- 3 Contract vertices of degree  $\leq 2$  that do not contain a representative.

# Certificates - Inner Connected Components

A certificate's core is an Inner Connected Component graph:

- 1 Union of all shortest paths in  $X$  between  $f(g_1)$  and  $f(g_2)$  for  $(g_1, g_2) \in E_G$ .
- 2 Contract all intra-cloud edges.
- 3 Contract vertices of degree  $\leq 2$  that do not contain a representative.

A vertex of the above graph is an Inner Connected Component.

# Certificates - How to Count?

**Goal:** upper bound the number of inner connected components graphs.

# Certificates - How to Count?

**Goal:** upper bound the number of inner connected components graphs.

**Components:**

- Each component is a connected sub-graph of a cloud.

# Certificates - How to Count?

**Goal:** upper bound the number of inner connected components graphs.

**Components:**

- Each component is a connected sub-graph of a cloud.
- Each component has  $n^\epsilon$  vertices of  $X$ .

# Certificates - How to Count?

**Goal:** upper bound the number of inner connected components graphs.

**Components:**

- Each component is a connected sub-graph of a cloud.
- Each component has  $n^\varepsilon$  vertices of  $X$ .
- Each component has  $n^{\varepsilon d}$  “data” ( $d$  is its degree).

# Certificates - How to Count?

**Goal:** upper bound the number of inner connected components graphs.

**Components:**

- Each component is a connected sub-graph of a cloud.
- Each component has  $n^\varepsilon$  vertices of  $X$ .
- Each component has  $n^{\varepsilon d}$  “data” ( $d$  is its degree).

**Edges between components:**

- Each edge is a path in  $X$  between components.



# Certificates - How to Count?

**Goal:** upper bound the number of inner connected components graphs.

**Components:**

- Each component is a connected sub-graph of a cloud.
- Each component has  $n^\varepsilon$  vertices of  $X$ .
- Each component has  $n^{\varepsilon d}$  “data” ( $d$  is its degree).

**Edges between components:**

- Each edge is a path in  $X$  between components.
- Each path has at most  $\varepsilon \log(n)$  hops.

# Certificates - How to Count?

**Goal:** upper bound the number of inner connected components graphs.

**Components:**

- Each component is a connected sub-graph of a cloud.
- Each component has  $n^\varepsilon$  vertices of  $X$ .
- Each component has  $n^{\varepsilon d}$  “data” ( $d$  is its degree).

**Edges between components:**

- Each edge is a path in  $X$  between components.
- Each path has at most  $\varepsilon \log(n)$  hops.
- Each edge contains  $(d_G + d_H)^{\varepsilon \log(n)} = n^{O(\varepsilon)}$  “data”.

## Observation

Scanning Inner Connected Components graph:

closing a cycle yields a constraint on a uniform random matching.

## Observation

Scanning Inner Connected Components graph:

closing a cycle yields a constraint on a uniform random matching.

**Question:** how to upper bound probability of obtaining a certificate?

- Remove a spanning tree.

## Observation

Scanning Inner Connected Components graph:

closing a cycle yields a constraint on a uniform random matching.

**Question:** how to upper bound probability of obtaining a certificate?

- Remove a spanning tree.
- Remaining edges correspond to disjoint paths.

## Observation

Scanning Inner Connected Components graph:

closing a cycle yields a constraint on a uniform random matching.

**Question:** how to upper bound probability of obtaining a certificate?

- Remove a spanning tree.
- Remaining edges correspond to disjoint paths.
- Each path closes a cycle “correctly” with probability of  $\leq O(1/n^{1-\epsilon})$ .

## Observation

Scanning Inner Connected Components graph:

closing a cycle yields a constraint on a uniform random matching.

**Question:** how to upper bound probability of obtaining a certificate?

- Remove a spanning tree.
- Remaining edges correspond to disjoint paths.
- Each path closes a cycle “correctly” with probability of  $\leq O(1/n^{1-\epsilon})$ .
- Each closed cycle is correct “independently”.

# Certificates - Bounding Probability (cont.)

Let  $\chi$  be the Euler characteristic of the Inner Connected Components graph:



# Certificates - Bounding Probability (cont.)

Let  $\chi$  be the Euler characteristic of the Inner Connected Components graph:

- $\Pr_{X \sim \text{Ext}(G,H)} [\text{certificate}] = n^{-\chi \cdot (1 - O(\varepsilon))}.$

# Certificates - Bounding Probability (cont.)

Let  $\chi$  be the Euler characteristic of the Inner Connected Components graph:

- $\Pr_{X \sim \text{Ext}(G,H)} [\text{certificate}] = n^{-\chi \cdot (1 - O(\varepsilon))}$ .
- $f$  is a cycle-homeomorphism  $\implies$  the cycles space of the Inner Connected Components graph is larger than the cycles space of  $G$ .

# Certificates - Bounding Probability (cont.)

Let  $\chi$  be the Euler characteristic of the Inner Connected Components graph:

- $\Pr_{X \sim \text{Ext}(G,H)} [\text{certificate}] = n^{-\chi \cdot (1-O(\epsilon))}$ .
- $f$  is a cycle-homeomorphism  $\implies$  the cycles space of the Inner Connected Components graph is larger than the cycles space of  $G$ .
- $\chi \geq |E_G| - |V_G| = \left(\frac{d_G}{2} - 1\right) n > n$ .

# Certificates - Bounding Probability (cont.)

Let  $\chi$  be the Euler characteristic of the Inner Connected Components graph:

- $\Pr_{X \sim \text{Ext}(G,H)} [\text{certificate}] = n^{-\chi \cdot (1-O(\varepsilon))}$ .
- $f$  is a cycle-homeomorphism  $\implies$  the cycles space of the Inner Connected Components graph is larger than the cycles space of  $G$ .
- $\chi \geq |E_G| - |V_G| = \left(\frac{d_G}{2} - 1\right) n > n$ .

We are done by a union bound as:

$$\underbrace{n^{-\chi \cdot (1-O(\varepsilon))}}_{\text{probability}} \cdot \underbrace{n^{(1+O(\varepsilon))}}_{\text{no. certificates}} \leq n^{-(\chi-n)(1-O(\varepsilon))} \ll 1$$

# Questions?