## Edge-Disjoint Paths in Networks (Part 3)

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## Expander Embedding

Starting Point:

• A graph G(V,E) that has a well-linked terminal set X of size k, the degree of each vertex in the graph is at most 4, and the degree of each terminal is 1.

Goal:

Embed a low-degree expander of size k/polylog(k) on the terminals with constant congestion on the edges.

#### Idea 1: Good Family of Sets



 $|out(S_j)| = #$  of edges on boundary of  $S_j = k/polylog(k)$ .

Each  $S_j$  is well-linked w.r.t. its boundary out( $S_j$ ).

Each  $S_j$  can connect by edge-disjoint paths to k/polylog(k) terminals.

#### Idea 2: Routing Trees



For each terminal  $t_i$ , there is a tree  $T_i$  that spans  $t_i$  and a distinct edge  $e_{ij}$  in  $out(S_j)$  for each j.

#### Embedding an Expander



Implementing one round of the cut-matching game.



# Routing on the Embedded Expander

Expander vertex: a connected component in G containing the terminal.
Expander edge: a path in G connecting some pair of vertices in the two components.

An edge of G belongs only to O(1) components/paths. Degree of each expander vertex is  $\Theta(\log^2 k)$ .

#### Routing on the Embedded Expander



Routing on vertex-disjoint paths in the expander corresponds to a constant congestion routing in G !

Two Challenges

- How does one find a good family of sets?
- How do you use a good family to find the routing trees?

[Chuzhoy '12] tackles both challenges.

We will primarily focus on the second task.

#### Tools

- Mader's Theorem.
- Toughness and bounded degree spanning trees.

#### Mader's Theorem

Mader's Theorem: Given any undirected graph G and a vertex v of degree not equal to 3 such that there is no cut-edge incident on v, there always exists a splittable pair of edges incident on v.

Starting from an Eulerian graph, we can repeatedly apply Mader's theorem to preserve connectivity between a special set of vertices while eliminating edges incident on other vertices.



Splitting off to preserve pairwise edge connectivities between the  $t_i$  vertices.



- Every edge in new graph is a path in the old graph.
- These paths are edgedisjoint.
- Degree of each t<sub>i</sub> vertex remains unchanged.
- Edge-connectivity between the t<sub>i</sub> vertices is preserved.

#### Toughness and Bounded Degree Spanning Trees

The toughness  $\tau(G)$  of a connected undirected graph G is defined as the ratio

 $\tau(G) = \min_{S} |S|/c(S)$ 

where the minimum is taken over c(5) > 1.

- Toughness of a star is 1/(n-1).
- Toughness of a cycle is 1.

#### Theorem [Furer and Raghavachari '94]

In any connected graph G, one can find in poly-time a spanning tree T such that the maximum degree in T is bounded by  $1/\tau(G) + 3$ .

#### Starting Point: Good Family of Sets

A collection of  $h = \Theta(\log^2 k)$  vertex-disjoint subgraphs  $S_1, S_2, ..., S_h$  such that

- $out(S_i)$  is well-linked in  $G[S_i]$  and has size  $k_1 = k/polylog(k)$ ,
- out(S<sub>i</sub>) can send k<sub>1</sub>= k/polylog(k) units of flow without congestion to a fixed set X' of k<sub>1</sub> terminals.

#### Goal: Routing Trees

Find k/polylog(k) trees in G, say,  $T_1$ ,  $T_2$ , ... such that

- each tree  $T_i$  is rooted at a distinct terminal,
- each tree T<sub>i</sub> connects to a distinct edge on the boundary out(S<sub>j</sub>) of each S<sub>j</sub>, and
- no edge in the graph is used by more than O(1) trees.

Step One (The graph  $H_1$ )

- Add new vertices s<sub>1</sub>, s<sub>2</sub>, ..., s<sub>h</sub> to G.
- Connect vertex  $s_i$  to the boundary of  $S_i$ .
- Double all edges so that we have an Eulerian graph.
- $\lambda(s_i, s_j)$  = edge connectivity between  $s_i$  and  $s_j$  =  $2k_1$ .

Step Two (The graph  $H_2$ )

• Apply Mader's theorem to split off all edges incident on the original vertices in G.

- Theorem applies since we have an Eulerian graph.
- We end up with a new multigraph  $H_2$  with only vertices  $s_1, s_2, ..., s_h$  such that  $\lambda(s_i, s_j) = 2k_1$ .
- Edges in  $H_2$  correspond to edge-disjoint paths in G.

Step Three (The graph  $H_3$ )

• Degree of each vertex in  $H_2$  is  $2k_1$ .

• Discard from  $H_2$  any edges with multiplicity less than  $k_2 = k_1/h^2$  to get a new multigraph  $H_3$ .

• Thus any pair of adjacent vertices in  $H_3$  has at least  $k_1/h^2$  parallel edges which correspond to  $k_1/h^2$  edgedisjoint paths in G.

The Graph H<sub>3</sub>

Claim: There is a spanning tree T of degree at most 5 in the graph  $H_3$ .

- Suffices to show that toughness of  $H_3$  is at least  $\frac{1}{2}$ .
- Suppose deleting a set Z of vertices creates p connected components, say,  $C_1$ ,  $C_2$ , ...,  $C_p$  in  $H_3$ .
- Each  $C_i$  has at least  $2k_1$  edges leaving it in  $H_2$ .

• At most  $h^2(k_1/h^2) = k_1$  edges are discarded overall in going from  $H_2$  to  $H_3$ .

At least  $pk_1$  edges must be leaving  $C_1, C_2, ..., C_p$  in  $H_3$ .

The Graph H<sub>3</sub>

- On the other hand, total number of edges entering Z is bounded by  $2k_1|Z|$  since degree of any vertex in  $H_3$  is at most  $2k_1$ .
- It follows that  $pk_1 \leq 2k_1|Z|$ , and hence  $|Z| \geq p/2$ .

So  $\tau(H_3) \geq \frac{1}{2}$ .

By [Furer and Raghavachari '94] theorem,  $H_3$  has a spanning tree with maximum degree  $3 + 1/\tau(H_3) = 5$ .

#### Constructing the Routing Trees

Final Step (Construct the Routing Trees)

- Fix any spanning tree T of degree at most 5 in  $H_3$ .
- Each edge of T corresponds to k<sub>2</sub> = k<sub>1</sub>/h<sup>2</sup> parallel edges (which in turn correspond to edge-disjoint paths in G).
- Arbitrarily root the tree T and replace each vertex s<sub>i</sub> by the good set S<sub>i</sub>.

#### Low Degree Spanning Tree



#### Low Degree Spanning Tree Expanded



#### Low Degree Spanning Tree Expanded



#### Recovering the Routing Trees

- Using the fact that each S<sub>i</sub> is well-linked w.r.t. its boundary, we can now recover T<sub>1</sub>, T<sub>2</sub>, ..., T<sub>k2</sub> such that
  - each  $T_i$  is rooted at a distinct terminal, and
  - no edge in the graph is used by more than O(1) trees.
- Recovery creates congestion = Max degree in T.
- This is where the bounded degree assumption helps!

## Finding a Good Family of Sets

#### Legal Contracted Graph (LCG)

- Let r = k/polylog(k).
- For any set S of vertices, G[S] subgraph of G induced by the set S.
- A graph H is an LCG of G if
  - H is obtained by contracting a disjoint subset of vertices that do not contain terminals.
  - Degree of each vertex in H is at most r.
  - For any vertex v where v possibly represents a contracted set S of vertices, the graph G[S] is α-well-linked w.r.t. out(S) in G for α = 1/polylog(k).



Partition of non-terminals into clusters:

- Each cluster has degree at most k/polylog(k).
- Each cluster is  $\alpha$ -well-linked w.r.t. its boundary where  $\alpha = 1/\text{polylog}(k)$ .
- Contraction reduces the # of edges but terminals remain well-linked.

Н

A contraction of G

#### Properties of LCG

- The initial graph G is an LCG of itself.
- Terminals remain well-linked in any LCG H of
  - Any cut in the LCG H maps to a cut of the same value in G.
- Since maximum degree r in an LCG H is much smaller than k, there must be Ω(k) edges in H that are incident only on non-terminals.
- The last two properties will play a crucial role.

The Algorithm

Let m = # of edges between non-terminals.

• Start by randomly partitioning all non-terminals into h sets, say,  $X_1, X_2, ..., X_h$ .

- With constant probability, each X<sub>i</sub> satisfies:
  - $|Out(X_i)| \le 10m/h.$
  - $|E(X_i)| \ge m/10h^2$ .

• Note that  $|Out(X_i)|$  and  $|E(X_i)|$  are separated only by a factor of  $h = \Theta(\log^2 k)$ .

The Algorithm

Consider a set  $X_i$ .

- Uncontract all vertices inside X<sub>i</sub>.
- If  $G[X_i]$  is  $\alpha$ -well-linked w.r.t.  $Out(X_i)$ , then  $X_i$  is a good set.
- If not then do a  $\alpha$ -well-linked decomposition inside  $X_i$ .
  - If the decomposition creates a  $\alpha$ -well-linked piece with boundary of size at least  $\mathbf{r}$ , this is a good set.
  - Otherwise, the process fails.
  - But total # of edges cut in the well-linked decomposition process is bounded by α|Out(X<sub>i</sub>)|(log<sup>2</sup> k) < |E(X<sub>i</sub>)| -- a reduction in the size of the LCG if we contract new pieces.

The Algorithm

- If each of X<sub>1</sub>, X<sub>2</sub>, ..., X<sub>h</sub> succeeds, we get a good family of sets.
- Otherwise, some X<sub>i</sub> fails and we get a new LCG that has fewer edges than before.
- We repeat this process until we succeed.

## Random Partitioning



Randomly assign each nonterminal to one of the  $h = \Theta(\log^2 k)$  clusters.

With constant probability, for each i

- $|out(X_i)| \leq 10m/h$
- $|E(X_i)| \ge m/10h^2$
- m = # of edges between non-terminals



#### EDP Hardness Results

#### Max Independent Set (MIS) to EDP



For each vertex v in the MIS instance, there is an  $s_v-t_v$  pair and a canonical path connecting  $s_v$  to  $t_v$ .












Seems Promising ...

- If we could enforce that every routed pair only uses its canonical path, we would get  $n^{\Omega(1)}$ -hardness.
- But the path intersections create cheating (noncanonical) paths.





Seems Promising ...

- If we could enforce that every routed pair only uses its canonical path, we would get  $n^{\Omega(1)}$ -hardness.
- But path intersections create cheating (noncanonical) paths.
- How do we deal with them?

### **Directed Graphs**

- Efficient labeling schemes to encode intersections of canonical paths that eliminate all non-canonical paths.
  - Once you leave the canonical path, you can not return to the original path.
  - So each pair is connected only by a canonical path.
- Allows us to essentially carry independent set hardness to directed EDP even with congestion.
  - n<sup>Ω(1/c)</sup>-hardness for directed EDP with congestion c. [Andrews, Zhang '06] [Chuzhoy, Guruswami, K, Talwar '07]

### Undirected Graphs

- No efficient labeling schemes known, and instead we rely on girth arguments.
- Girth of a graph = length of the shortest cycle.
- Canonical path + a non-canonical path = a cycle.
- So if girth is large and the canonical path is short, it follows that any cheating path must be large.

## Undirected Graphs

- Each source-sink pair has a short canonical path.
- Path intersections are implemented using a "random process" to get a high girth graph: O(log n) girth.



Pairs routed on non-canonical paths consume too much routing capacity.

# Hardness of Undirected EDP

Simplified Analysis (ignores implementation of girth property)

- Start with a degree d-bounded independent set instance where  $d = \log^{1/2} n$ .
- Hard to decide if max independent set size is  $\Omega(n/d^{\epsilon})$ (Yes case) or  $O(n/d^{1-\epsilon})$  (No case) for any  $\epsilon > 0$ .
- Create an  $\Omega(\log n)$  girth undirected EDP instance:
  - Canonical paths have length  $d = \log^{1/2} n$ .
  - Non canonical paths have length  $\Omega(\log n)$ .
  - O(nd) edges in total.

# Hardness of Undirected EDP

#### Yes Case

• We can route  $\Omega(n/d^{\epsilon})$  pairs in an edge-disjoint manner using canonical paths.

No Case

• Only  $O(n/d^{1-\epsilon})$  pairs can be routed on canonical paths.

• Only O(nd/log n) pairs can be routed on non-canonical paths since girth is  $\Omega(log n)$ .

# Hardness of Undirected EDP

#### Yes Case

•  $\Omega(n/\log^{\epsilon} n)$  pairs can be routed.

#### No Case

•  $O(n/d^{1-\epsilon}) + O(nd/\log n) = O(n/\log^{1/2} n)$  pairs can be routed when d =  $\log^{1/2} n$ .

So we get a  $\Omega(\log^{1/2-\epsilon} n)$  hardness for undirected EDP with no congestion.

# So what remains to be done ...

Approximability of undirected EDP with no congestion.

On the positive side ...

O(n<sup>1/2</sup>)-approximation [Chekuri, K, Shepherd '06]

- Algorithm is based on rounding the multicommodity flow relaxation.
- Upper bound matches the integrality gap of the flow relaxation.

## So what remains to be done ...

On the negative side ...

Ω(log<sup>1/2-ε</sup> n) hardness [Andrews, Chuzhoy, Guruswami, K, Talwar, Zhang '05]

Approximability of undirected EDP remains wide open!

## Undirected Congestion Minimization

A related open problem is congestion minimization in undirected graphs: minimize congestion needed to route all pairs.

- Randomized rounding of LP gives an O(log n/log log n) approximation [Raghavan and Thompson '87].
- A matching hardness result known in directed graphs. [Andrews, Zhang '06] [Chuzhoy, Guruswami, K, Talwar '07]
- But in undirected graphs, best known hardness is  $\Omega(\log \log n / \log \log \log n)$  [Andrews and Zhang '07]

# Concluding Remarks

- Several beautiful ideas composed together to obtain a constant congestion polylog-approximation for EDP.
- These ideas have already been used to obtain many other important results.
- With constant congestion, it is also possible to get a polylog-approximation for vertex-disjoint paths [Chekuri, Ene '13].

