## Sensitivity Oracle for All-pairs Mincuts

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# Introduction



## Sensitivity Oracles

Introduction

- Most data structures are designed for static graphs.
- But, real world graphs are dynamic.
- We need data structures that can handle failures and insertions of edges.

**★ Sensitivity Oracles ★** 



#### What shall we learn?

Introduction

We will learn about a sensitivity oracle for all-pairs mincuts.

#### Given

- $\rightarrow$  Vertices s, t
- $\rightarrow$  An edge *e* to be inserted/deleted

#### Output

- $\rightarrow$  Did the value of (s, t)-mincut change upon insertion/deletion?
- → If yes, report one such mincut.



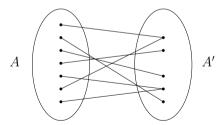
What is all this? I need definitions!

# **Preliminaries**



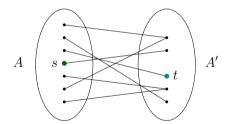
(All graphs G are undirected and unweighted.)

- Cut: A partition of V(G) into non-empty sets (A, A').
- Size of a cut: No. of edges with one end in A and the other in A'.
- Global mincut: A cut of minimum size.





- (s, t)-cut: A cut with  $s \in A$  and  $t \in A'$ .
- (s, t)-mincut: An (s, t)-cut of minimum size.



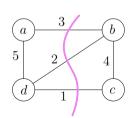


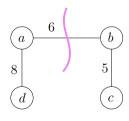
## Gomory-Hu trees: a data structure for (s, t) mincuts

• **Gomory-Hu tree:** A weighted tree *T* of *G* such that:

$$\rightarrow V(T) = V(G)$$

- $\rightarrow T uv$  gives a (u, v)-mincut of G with size w(uv)
- A GHT can store (s, t)-mincuts for all pairs s, t of G. Moreover, (s, t)-mincut values can be obtained in O(1) time.







## What's our goal?

**Goal:** Design a data structure to answer the following queries:

- FT-MINCUT( $\{s, t\}, e$ ): Does the deletion of e decrease the value of (s, t)-mincut?
- IN-MINCUT( $\{s, t\}, e$ ): Does the insertion of e increase the value of (s, t)-mincut?

In both cases, report one such (s, t)-mincut.



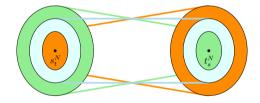
## Necessary and sufficient conditions for change in size of (s, t)-mincut

- Edge xy is removed: Size of an (s, t)-mincut decreases by  $1 \iff xy$  is present in some (s, t)-mincut
- Edge xy is inserted: Size of an (s, t)-mincut increases by  $1 \iff xy$  is present in every (s, t)-mincut



#### An alternate characterisation for the insertion case

•  $s_t^N$  - Nearest mincut from s to t: A set of vertices with the property that every (s,t)-mincut (A,A') with  $s \in A$  has  $s_t^N \subseteq A$ .



• Edge xy is inserted: Size of an (s, t)-mincut increases by  $1 \iff xy$  is present in every (s, t)-mincut  $\iff x \in s_t^N$  and  $y \in t_S^N$ .



## GHT as a sensitivity oracle for (s, t)-mincuts

- Store  $O(n^2)$  copies of GHT, one for the insertion/deletion of each edge.
- Takes  $O(n^3)$  space and O(1) query-time.

**Question:** Can we achieve O(1) query time using  $O(n^2)$  space?

This is the goal of today's talk. So, the answer is YES!



Strip  $\mathcal{D}_{s,t}$ :

A sensitivity oracle for (s, t)-mincuts



## Structure of $\mathcal{D}_{s,t}$

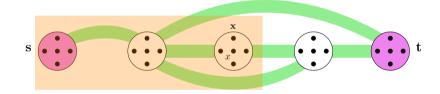
- This is a quotient graph of *G* with a DAG-like structure.
- Terminal nodes: Nodes containing s and t; denoted by s and t.
- All edges incident to a non-terminal node belong to side-s or side-t.





## Encoding of minimum (s,t)-cuts in $\mathcal{D}_{s,t}$

•  $\mathcal{R}_s(x)$  - Reachability cone of a vertex x: The set of all vertices in the direction from  $\mathbf{x}$  to  $\mathbf{s}$ .



#### Theorem 1

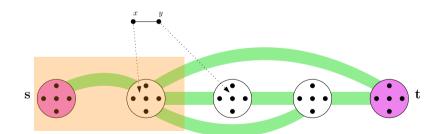
A set of vertices A is an (s,t)-mincut  $\iff$  the corresponding vertices in  $\mathcal{D}_{s,t}$  defines a reachability cone.



#### Corollaries of Theorem 1

## Corollary 2

An edge xy belongs to an (s,t)-mincut if and only if it appears in  $\mathcal{D}_{s,t}$ .

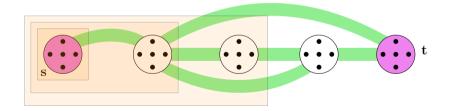




#### Corollaries of Theorem 1

#### Corollary 3

The set of vertices mapped to **s** defines  $s_{t}^{N}$ . Similarly, the set of vertices mapped to **t** defines  $t_s^N$ .





## Strip $\mathcal{D}_{s,t}$ as a sensitivity oracle

• FT-MINCUT( $\{s, t\}, xy$ ): Check if x and y are mapped to different nodes x and y. (O(1) time)

If yes, report vertices mapped to  $\mathcal{R}_s(\mathbf{x})$ . (O(n) time)

• IN-MINCUT( $\{s, t\}, xy$ ): Check if x is mapped to s and y is mapped to t. (O(1) time)

If yes, report any mincut, say vertices mapped to s. (O(n) time)



## $\mathcal{D}_{s,t}$ as a sensitivity oracle for all-pairs mincut

• Store  $O(n^2)$  copies of  $\mathcal{D}_{s,t}$  one for the insertion/deletion of each edge.

The space occupied is  $O(n^3)$  and query time is O(1). This solution is no better than the trivial solution of using Gomory-Hu trees.



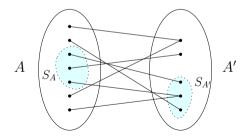
# The connectivity carcass

A sensitivity oracle for Steiner mincuts



#### Steiner cuts

- Let  $S \subseteq V(G)$  be a fixed set of vertices (Steiner set).
- S-cut: A cut (A, A') with  $A \cap S \neq \emptyset$  and  $A' \cap S \neq \emptyset$ .
- S-mincut: An S-cut with minimum size.





## What's our goal?

• Notation:  $c_S$  = size of S-mincut;  $c_{s,t}$  = size of (s,t)-mincut

#### Observation 4

Let  $s, t \in S$ . Then  $c_{s,t} \ge c_S$ . Moreover,  $c_{s,t} > c_S \iff s, t$  are not separated by any S-mincut.

- **Objective:** Suppose that  $c_{s,t}=c_S$ . Design a sensitivity oracle that can answer FT-MINCUT( $\{s,t\},e$ ) and IN-MINCUT( $\{s,t\},e$ ) in O(1) time.
  - Also, report the corresponding *S*-mincuts in O(n) time.



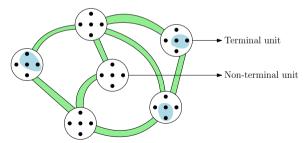
## The Connectivity Carcass

**Connectivity Carcass:** A data structure that meets the objective. It has the following components (w.r.t a fixed Steiner set *S*):

- lacksquare Flesh graph  $\mathcal{F}_{\mathcal{S}}$
- ② Skeleton  $\mathcal{H}_S$
- **1** Projection map  $\pi_S$



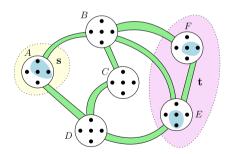
- A quotient graph of G; it generalises  $\mathcal{D}_{s,t}$  to S-mincuts.
- **Units:** Vertices of  $\mathcal{F}_S$ . Vertices of G mapped to a unit are not separated by any S-mincut.
- **Terminal unit:** A unit that contains an *S*-vertex.

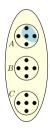




#### $\mathcal{F}_S o \mathsf{Strip}$ corresponding to an S-mincut

A strip for an S-mincut can be constructed from  $\mathcal{F}_S$  by contracting the Steiner units on each side of the cut into source  $\mathbf{s}$  and terminal  $\mathbf{t}$ .

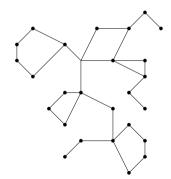


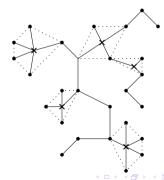




## (2) The skeleton $\mathcal{H}_S$

- $\mathcal{H}_S$  is a cactus graph (two cycles share  $\leq 1$  vertex).
- For fast computations,  $H_S$  is stored in the form of its "dual", the skeleton tree  $T(\mathcal{H}_S)$ .

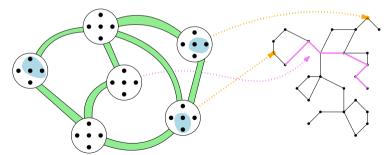




## (3) The projection map $\pi_S$

 $\pi_S$  is a mapping from units of  $\mathcal{F}_S$  to paths of  $\mathcal{H}_S$ .

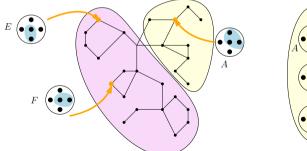
- Terminal units are mapped to nodes of  $\mathcal{H}_S$ .
- ullet Non-terminal units are mapped to *proper paths*, i.e., paths which intersect  $\leq 1$  edge of each cycle

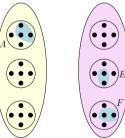




## Mincuts of $\mathcal{H}_S$ store bunches of S

- **Bunch:** An equivalence of S-mincuts, where two S-mincuts are equivalent if they divide S in the same way.
- Every mincut of  $\mathcal{H}_S$  (tree edge or 2 cycle edges) corresponds to a bunch given by the Steiner units on either side of the mincut.



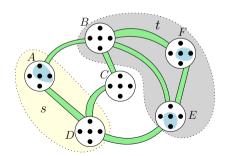


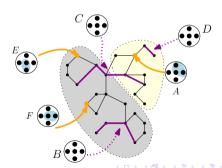


#### $\mathcal{F}_{S} o \mathsf{Strip}$ corresponding to a bunch

Consider any mincut of  $\mathcal{H}_S$  and the corresponding bunch  $\mathcal{B}$ . To construct strip  $\mathcal{D}_{\mathcal{B}}$ :

- All units which are mapped completely to one side of the cut get contracted into s
  or t.
- Non-terminal units whose paths cross the cut are retained as such.





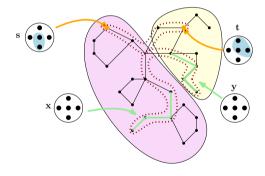
## Necessary and sufficient condition for an edge to be in (s, t)-mincut

For any two vertices u, v, let  $P(u, v) \to a$  path in  $\mathcal{H}_S$  with prefix  $\pi_S(\mathbf{u})$  and suffix  $\pi_S(\mathbf{v})$ .

#### Theorem 5

Let  $s, t \in S$  such that  $c_{s,t} = c_S$ . Then xy belongs to an (s,t)-mincut  $\iff$  there is a mincut of  $\mathcal{H}_S$  whose edges intersect both P(s,t) and P(x,y).

The theorem is simplified for ease of presentation, but is not precisely correct



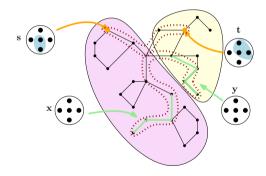


#### Proof of Theorem 5

#### Proof.

The following statements are equivalent:

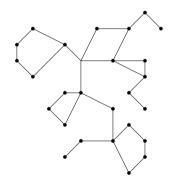
- $\bigcirc$  xy is an edge of some (s, t)-mincut.
- $\bigcirc$  xy is an edge of some bunch  $\mathcal{B}$  that separates s and t.
- There is an  $x \rightsquigarrow y$  path in  $\mathcal{D}_{\mathcal{B}}$  whose terminal nodes contain s and t.
- There is a mincut of  $\mathcal{H}_{\varsigma}$ corresponding to  $\mathcal{B}$  whose edges intersect both P(s,t) and P(x,y)

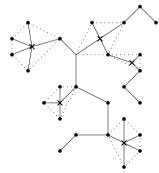




#### Answering the query FT-MINCUT

- Theorem 5 can be tested on the skeleton tree  $T(\mathcal{H}_S)$ .
- Testing whether two paths in a tree intersect can be done in O(1) time using LCA queries.





## Reporting (s, t)-mincut that contains xy

Theorem 5 gives the following method:

- Find the mincut of  $\mathcal{H}_S$  that intersects both P(s,t) and P(x,y).
- ② Construct the strip  $\mathcal{D}_{\mathcal{B}}$  associated with this mincut.
- **3** Compute the reachability cone  $\mathcal{R}_{s}(x)$  from the strip.

While this method requires O(m) time, it is possible to reduce it to O(n). (See [BP22] for more details.)

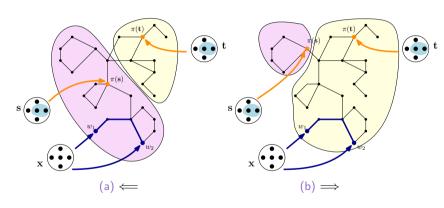


## Necessary and sufficient conditions for a vertex to be in $s_{\star}^{N}$

Let 
$$x \in V(G)$$
 and  $P(w_1, w_2) = \pi(\mathbf{x})$ .

#### Theorem 6

Let s. t be separated by some S-mincut. Then  $x \in s_t^N$  if and only if  $\pi(\mathbf{s})$  intersects all paths  $P(w_1, \pi(\mathbf{t}))$ and  $P(w_2, \pi(\mathbf{t}))$ .

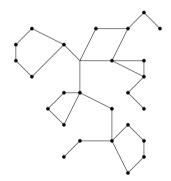


 $x \in S_t^N$  iff **x** and **s** are mapped to the same side of every mincut of  $\mathcal{H}_S$ .



#### Answering the query IN-MINCUT

The conditions mentioned in Theorem 6 can be tested on  $T(\mathcal{H}_S)$  in O(1) time using LCA queries.





#### Summary

To answer the queries FT-MINCUT( $\{s,t\},e$ ), FT-MINCUT( $\{s,t\},e$ ) and to report the corresponding mincuts, we only need the following:

- Projection map  $\pi_S$
- ② Skeleton tree  $T(\mathcal{H}_S)$

Define  $D(S) := (\pi_S, T(\mathcal{H}_S))$ .



# Hierarchical tree $\mathcal{T}_G$

A sensitivity oracle for all-pairs mincuts

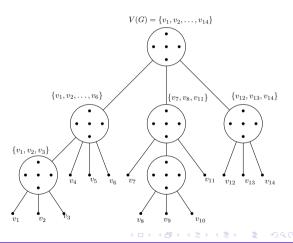


#### The hierarchical tree $\mathcal{T}_G$

- Root = V(G) and leaves are individual vertices of G.
- Let S be the set of vertices at a node  $w \in \mathcal{T}_G$ . The children of w are the equivalence class of nodes satisfying the relation  $c_{u,v} > c_S$ .

#### Observation 7

For any two vertices  $u, v, c_{u,v} = c_S$  where S is the set of vertices at the LCA of u, v in  $\mathcal{T}_G$ .



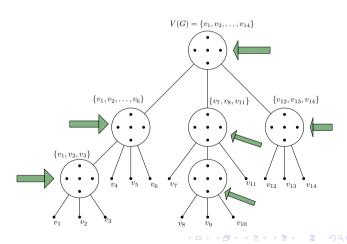
#### Sensitivity oracle for all-pairs mincuts

To get a sensitivity oracle for all-pairs mincut:

- Augment each internal node with D(S).
- To answer the queries

  FT-MINCUT( $\{s,t\},e$ ) and

  IN-MINCUT( $\{s,t\},e$ ), use D(S) at the LCA of s,t.
- Space =  $O(n^2)$ ; Query-time = O(1)



#### Summary

- We got a sensitivity oracle by appending nodes of  $\mathcal{T}_G$  with D(S).
- This occupies  $O(n^2)$  space with O(1) query-time. Moreover, corresponding mincuts can be returned in O(n) time.
- The paper [BP22] discusses another data structure with O(n) space and  $O(\min(m, nc_{s,t}))$  query-time



## Open questions

#### Open Problem 1

Design a sensitivity oracle for all-pairs mincuts that occupies  $o(n^2)$  space and o(m) query-time.

#### Open Problem 2

Design a sensitivity oracle for all pairs mincuts that can tolerate the removal or insertion of upto k>1 edges.



#### References

[BP22] Surender Baswana and Abhyuday Pandey. Sensitivity oracles for all-pairs mincuts.

In Proceedings of the 2022 Annual ACM-SIAM Symposium on Discrete Algorithms (SODA), pages 581–609. SIAM, 2022.



References