

# Breaking **Quadratic Time** for **Small** Vertex Connectivity and an Approximation Scheme



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**@WOLA'19**

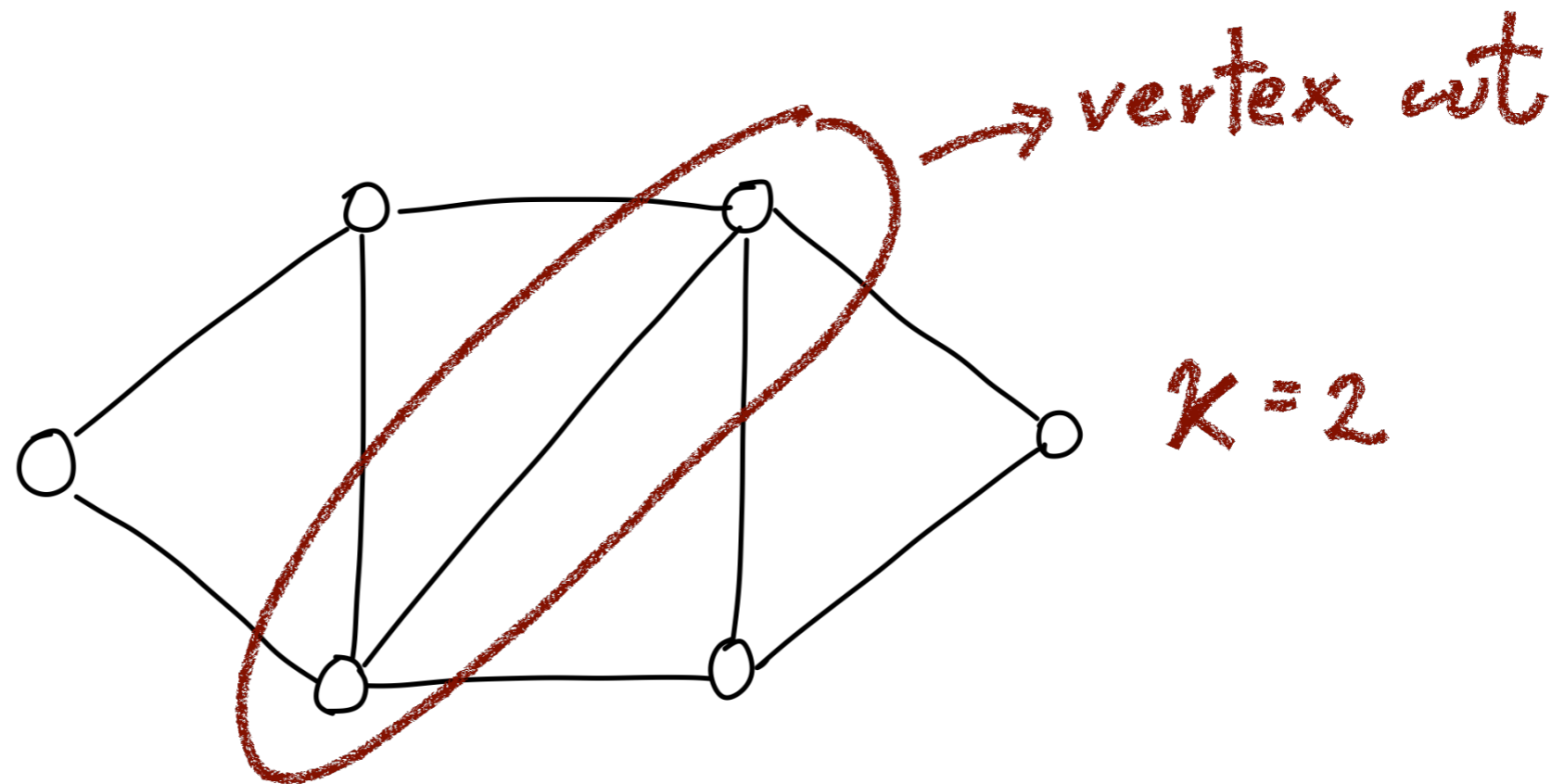
22 July 2019

# Take Home Message:

“Local algorithms are useful for vertex connectivity”

# Vertex Connectivity

$$G = (V, E), |V| = n, |E| = m$$



Compute  $\kappa$  the **minimum** number of vertices to be removed to disconnect the graph

# Part 1: Introduction

Background and Results

$$G = (V, E), |V| = n, |E| = m, k = \kappa \quad \text{*omit polylog factor}$$

Reference	General	$m = O(n)$
<b>Kleitman'69</b> , Podderyugin'73, Even Tarjan'75	$mnk^2$	$n^2$
Even'75, Galil'80, Esfahanian Hakimi'84, Matula'87	$(n + k^2)mk$	$n^2$
Becker et al'82 (Randomized)	$mnk$	$n^2$
Nagamochi Ibaraki'92	Can assume $m = O(nk)$	
* Linial Lovasz Wigderson'88, Cheriyan Reif'91	$n^\omega + nk^\omega$	$n^\omega$
* Henzinger Rao Gabow'00 (Randomized)	$mn$	$n^2$

\* **state-of-the-art**

$$G = (V, E), |V| = n, |E| = m, k = \kappa \quad \text{*omit polylog factor}$$

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* Henzinger Rao Gabow'00 (Randomized)	$mn$	$n^2$
Gabow'06 (Deterministic)	$mn + m \min\{k^{2.5} + n^{3/4}k\}$	$n^2$

Even for  $m = O(n), k = O(1)$ ,  
 $O(n^2)$  time remains since **1969**

$$G = (V, E), |V| = n, |E| = m, k = \kappa \quad \text{*omit polylog factor}$$

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Gabow'06 (Deterministic)	$mn + m \min\{k^{2.5} + n^{3/4}k\}$	$n^2$
Our work (STOC'19)	$m + n^{4/3}k^{7/3}$	$n^{4/3}$
Our follow-up work'19, Forster Young'19	$m + nk^3$	$n$

Near-linear time when  $k = O(\text{polylog}(n))$

# Approximation

$O(n^{2.5})$  when  $k = \Omega(n^{0.64..})$

Reference	Time	Approx
Linial Lovasz Wigderson'88, Cheriyam Reif'91, Henzinger'97	$\min\{n^{2.5}, n^2k, n^\omega + nk^\omega\}$	2
Censor-Hillel Ghaffari Kuhn'14	$m$	$\log n$
Our work* (STOC'19)	$\min\{n^{2.2+o(1)}, n^\omega\}$	$(1 + \epsilon)$

For any  $k$

\*Actual bound is  $m + \frac{1}{\text{poly}(\epsilon)} \min\{nk^2, n^{5/3+o(1)}k^{2/3}, \frac{n^{3+o(1)}}{k}, n^\omega\}$

**Remark:** use fast approximate s,t-vertex connectivity from Chuzhoy Khanna (STOC'19)



# Contributions

(including our follow-up work)

Breaking **50-year-old**  $O(n^2)$  time  
for small  $\kappa$

Near-**linear** time for  $\kappa = O(1)$   
Fastest up to  $\kappa = O(n^{0.457})$

Fastest  $(1 + \epsilon)$ -approximation  
for **any**  $\kappa$

# Follow-up'19: Testing $k$ -Vertex Connectivity

One-sided tester:  $k$ -vertex connected vs.  $\epsilon$ -far

Reference	Query Complexity (Simplified)	
Goldreich Ron'02, Orenstein Ron'11, Yoshida Ito'10, Yoshida' Ito 12	$\tilde{O}\left(\frac{2^{k+1}}{\epsilon^{k+1}}\right)$	<b>Open:</b> polynomial #queries?
Forster Young'19	$\tilde{O}\left(\frac{k^3}{\epsilon^2}\right)$	
Our follow-up '19	$\tilde{O}\left(\frac{k}{\epsilon^2}\right)$	

# Part 2: Techniques

$$G = (V, E), |V| = n, |E| = m, k = \kappa \quad \text{*omit polylog factor}$$

Reference	General	$m = O(n)$
<b>Kleitman'69</b> , Podderiyugin'73, Even Tarjan'75	$mnk^2$	$n^2$
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Gabow'06 (Deterministic)	$mn + mk^{2.5} + mn^{3/4}k$	$n^2$

## Barrier: Single-Source Vertex Connectivity

No  $o(n^2)$  algorithm is known

Fix a node  $s$ , compute the **smallest** vertex-cut separating  $s$  from some node

# Part 2.1: Local Vertex Connectivity

to replace **Single-Source Vertex Connectivity**

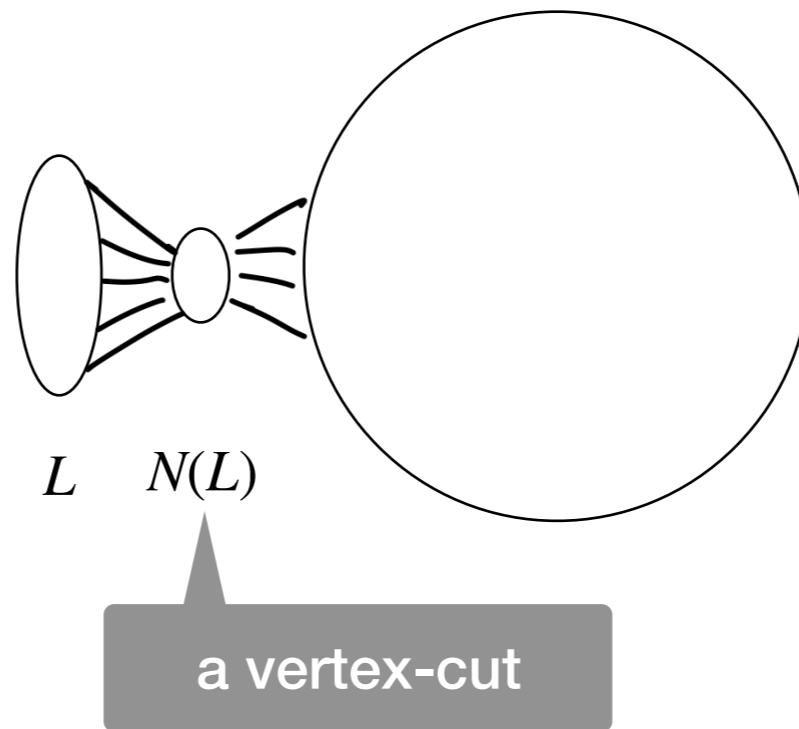
Fix a node  $s$ , is there a vertex-cut “near”  $s$  ?  
(in **sub-linear** time)

**Explore around  $s$**

**Assumption:  $G$  is regular,**

$$m = O(n), \kappa = O(1)$$

**Notation:  $N(L)$  = neighbors of  $L \subset V$**



# Local Vertex Connectivity

Explore around  $x$

**Input: LocalVC**( $x \in V, \nu, k$ ) **where**  $\nu < \frac{m}{k}$

**Output: Either**

Target vertex-cut

**(1) declare that no  $L \subset V$  exists** **OR**  
**where  $L \ni x, |L| \leq \nu, |N(L)| < k,$**

**(2) a vertex-set  $L$**   
**where  $|N(L)| < k$**



# Local Vertex Connectivity

Explore around  $x$

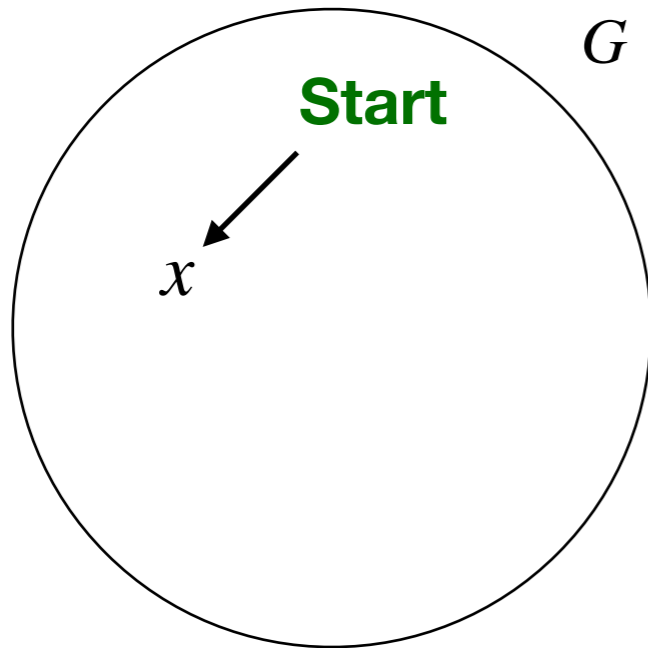
**Input:** LocalVC( $x \in V, \nu, k$ ) where  $\nu < \frac{m}{k}$

**Output:** Either

(1) declare that no  $L \subset V$  exists  
where  $L \ni x, |L| \leq \nu, |N(L)| < k,$

OR

(2) a vertex-set  $L$   
where  $|N(L)| < k$



# Local Vertex Connectivity

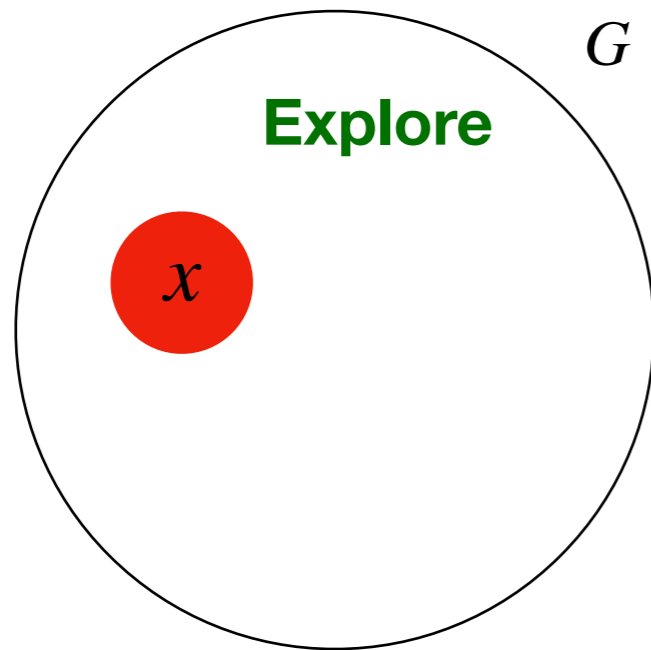
**Input: LocalVC**( $x \in V, \nu, k$ ) where  $\nu < \frac{m}{k}$

**Output: Either**

**(1) declare that no  $L \subset V$  exists  
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**OR**

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# Local Vertex Connectivity

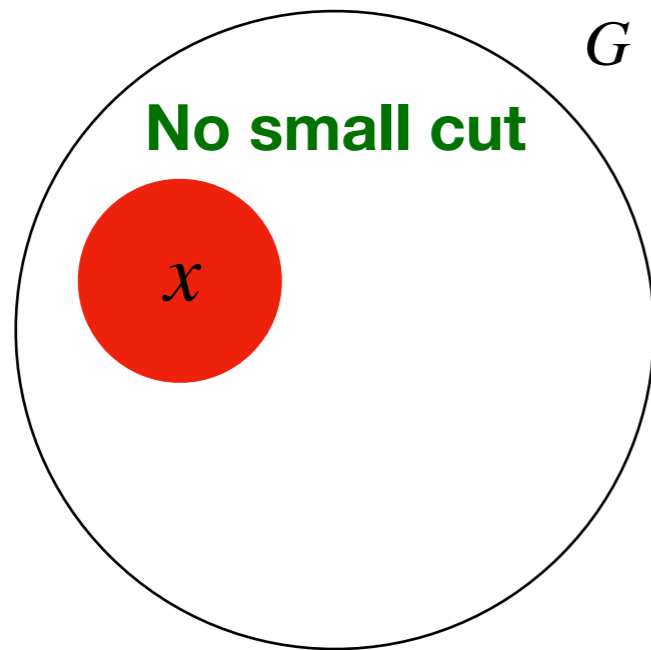
**Input: LocalVC**( $x \in V, \nu, k$ ) where  $\nu < \frac{m}{k}$

**Output: Either**

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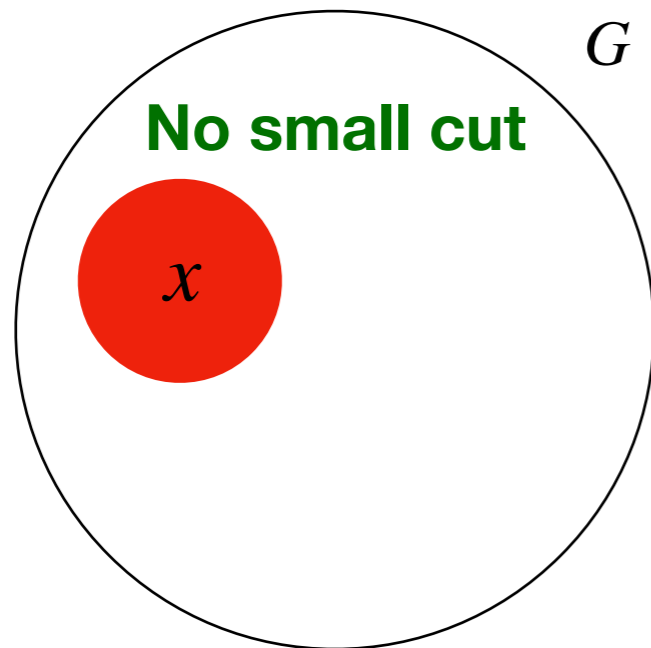


# Local Vertex Connectivity

**Input: LocalVC**( $x \in V, \nu, k$ ) where  $\nu < \frac{m}{k}$

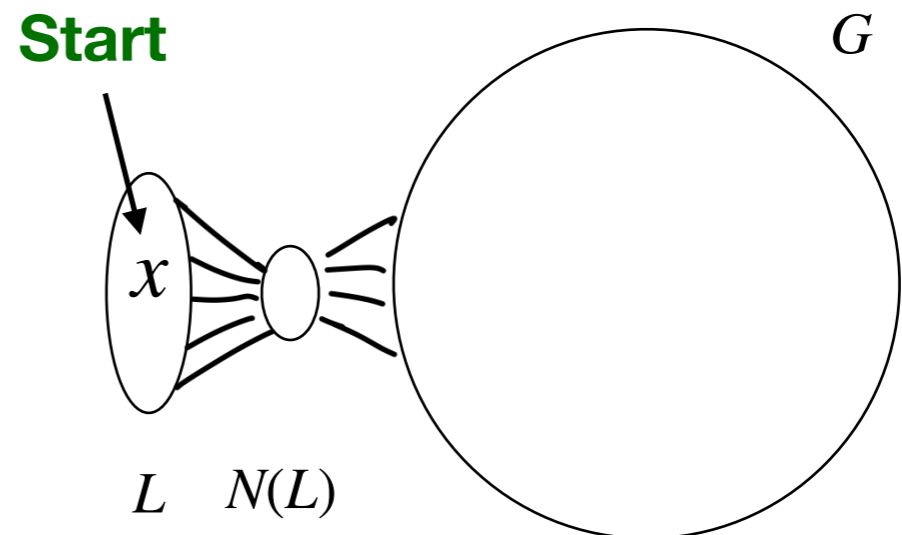
**Output: Either**

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**OR**

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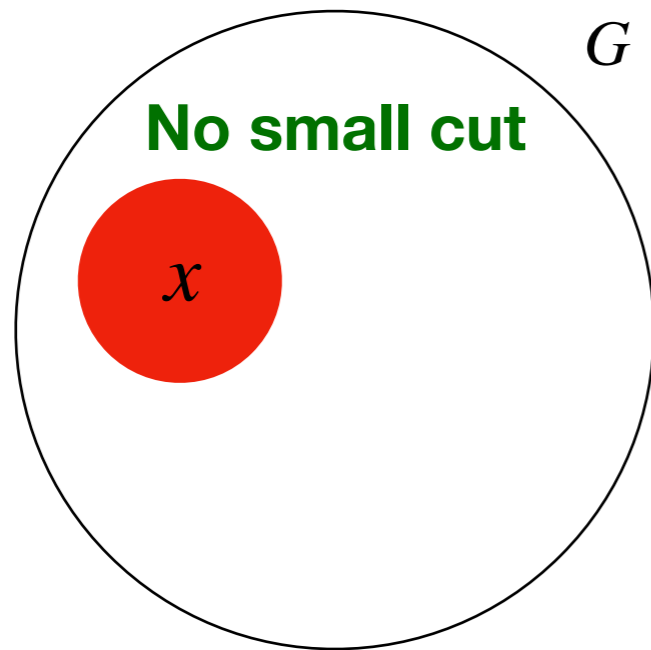


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**Input: LocalVC**( $x \in V, \nu, k$ ) where  $\nu < \frac{m}{k}$

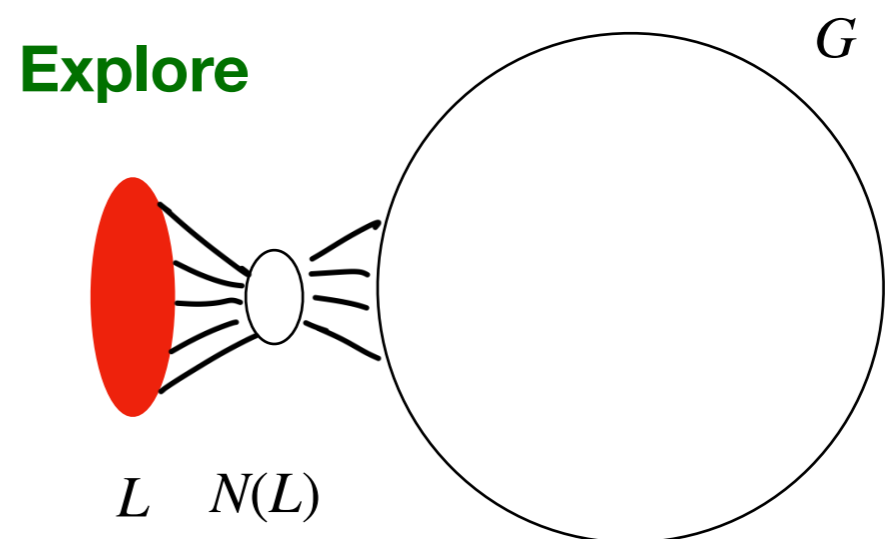
**Output: Either**

**(1) declare that no  $L \subset V$  exists  
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**OR**

**(2) a vertex-set  $L$   
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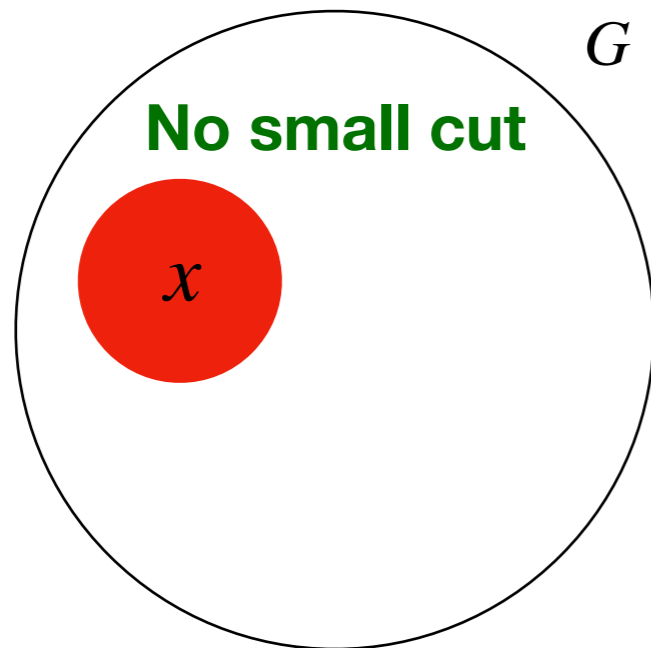


# Local Vertex Connectivity

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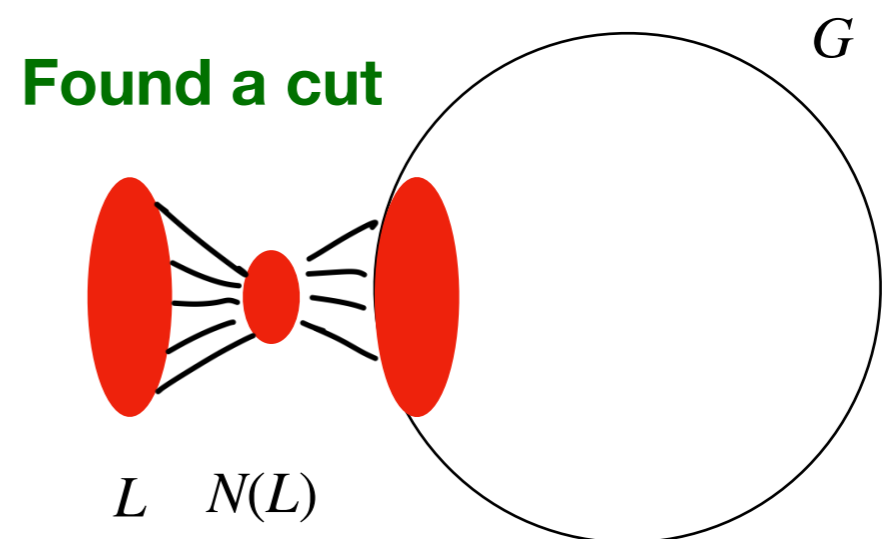
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**OR**

**(2) a vertex-set  $L$   
where  $|N(L)| < k$**



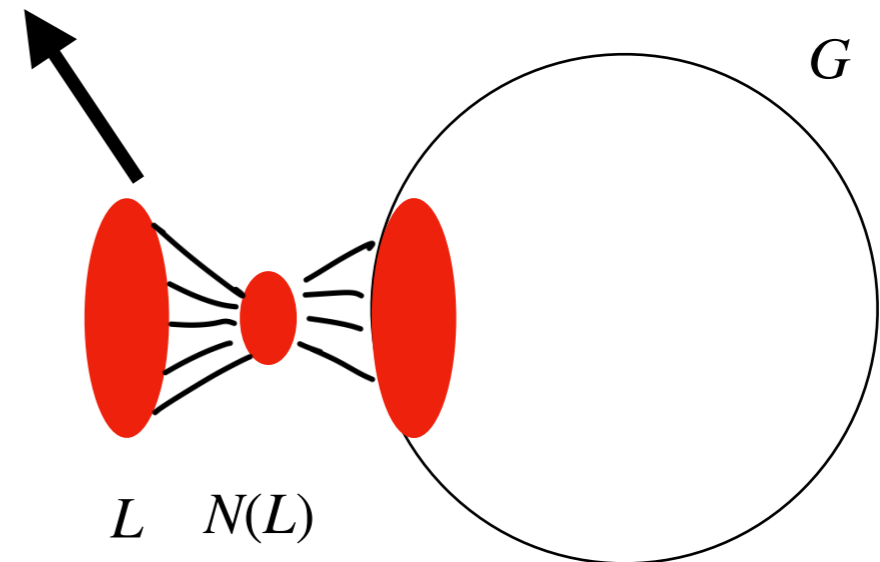
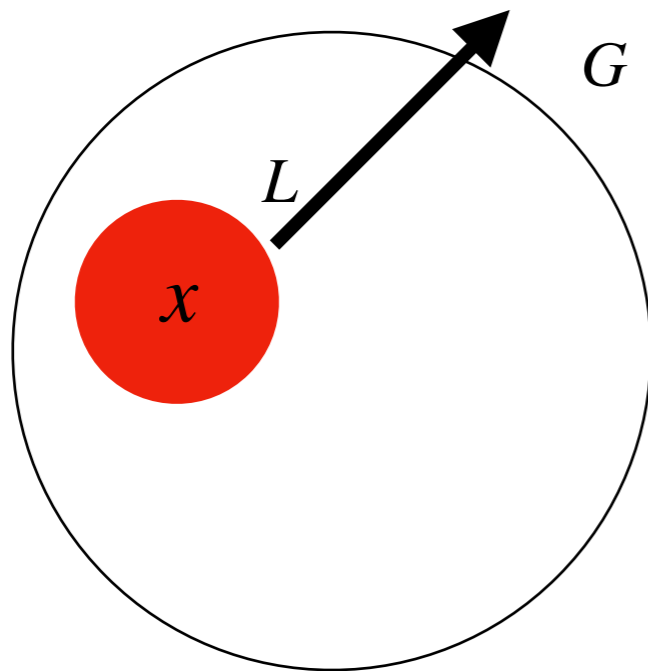
# Local Vertex Connectivity

Input: LocalVC( $\nu, k$ )

Output: Either

(1) declare that no such vertex-set  $L$  exists where  $L \ni x, |L| \leq \nu$  and  $|N(L)| < k$

(2) a vertex-set  $L$  where  $|N(L)| < k$



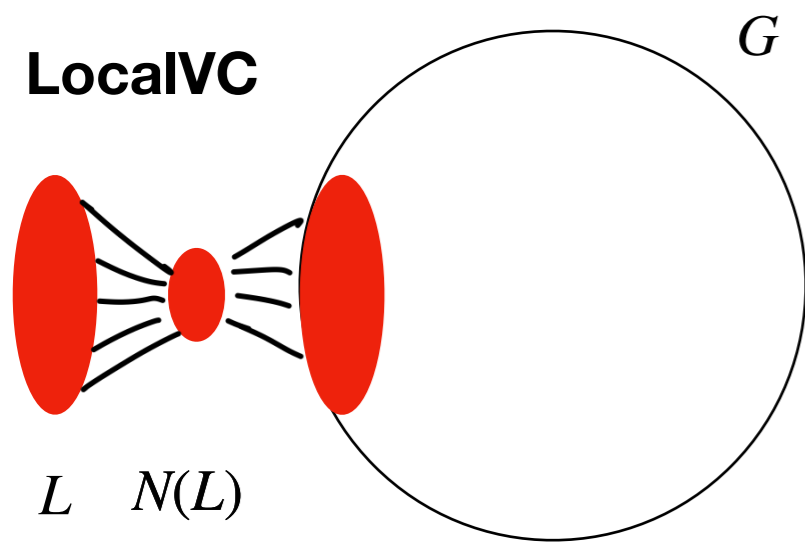
Reading

$O(\nu k)$

edges

possible

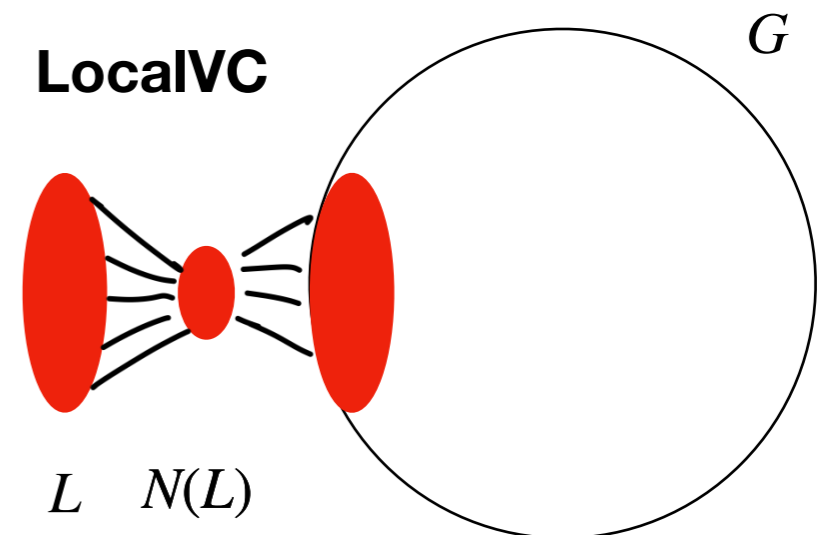
# History



	LocalVC	Approximate LocalVC	Deterministic
<b>This work (STOC '19)</b>	$\nu^{1.5}k$	$\frac{\nu^{1.5}}{\epsilon^{1.5}\sqrt{k}}$	Yes
Adaptation of (Chechik, Hansen, Italiano, Loitzenbauer, Parotsidis SODA'17)	$\nu k^k$	-	Yes
<b>Forster Young'19</b>	$\nu k^2$	-	No
<b>Our follow-up'19</b>	$\nu k^2$	$\frac{\nu k}{\epsilon}$	No

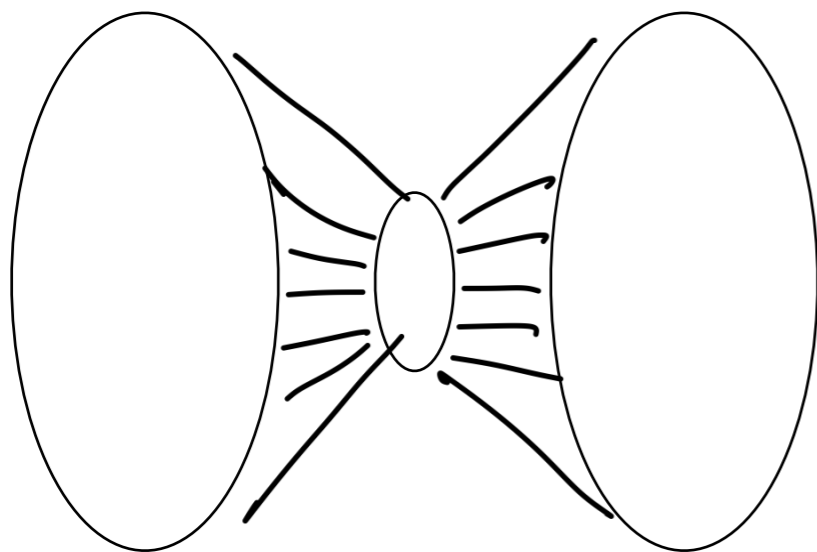


# Part 2.2: Vertex Connectivity via LocalVC



# Suppose $G$ has a vertex cut of size less than $k$

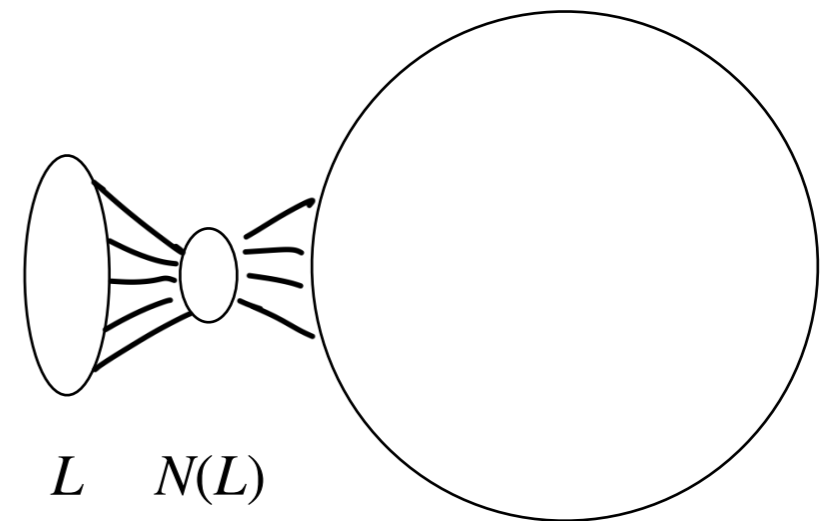
**Highly balanced**



$$|L| \geq n/10$$

$$|R| \geq n/10$$

**Highly lopsided**

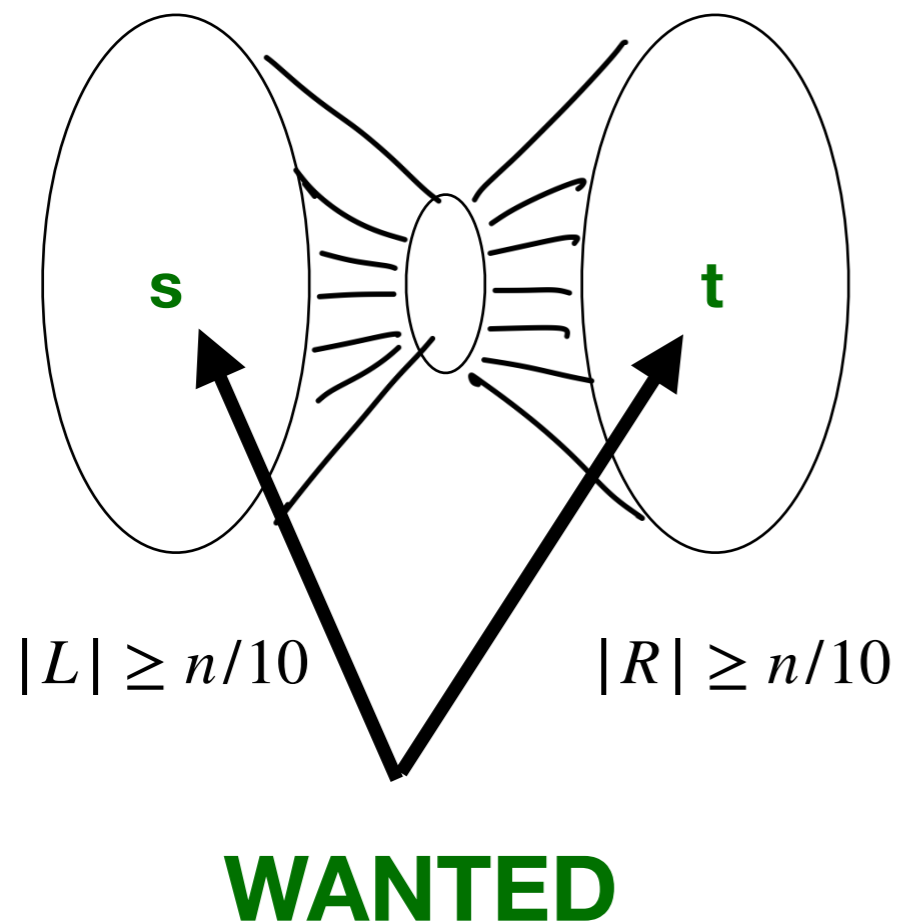


$L$   $N(L)$

$$|L| = \sqrt{n}$$

# Suppose $G$ has a vertex cut of size less than $k$

Highly balanced



**Fact: Compute  $s, t$ -connectivity**  
by  $s, t$ -Max-Flow in  $O(mk) = O(n)$

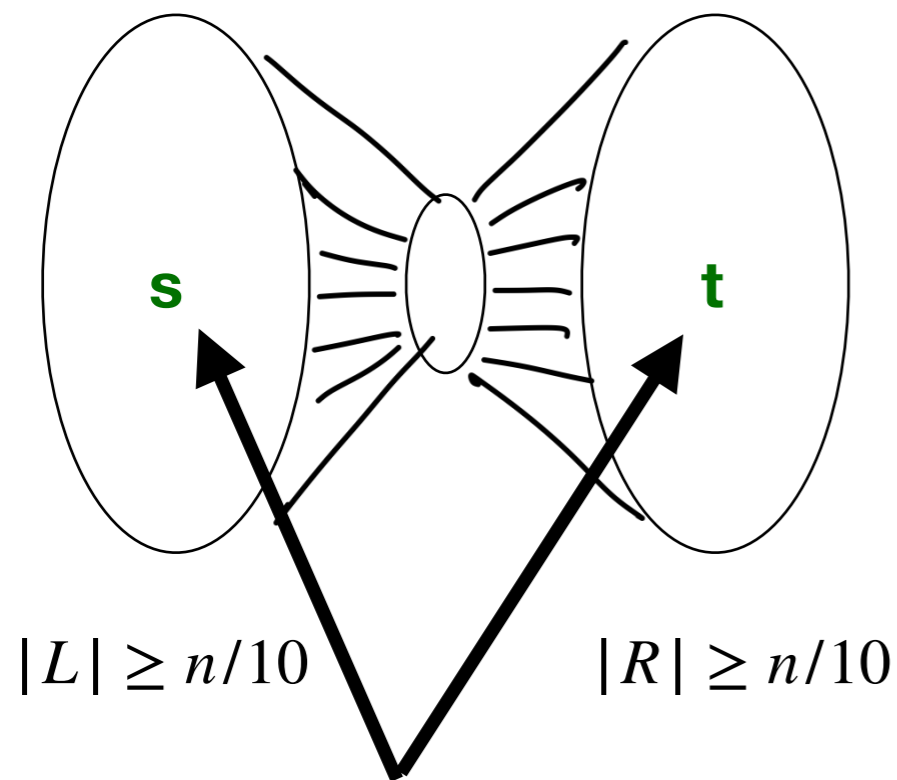
(e.g. Ford Fulkerson)

Suppose  $|L| \geq n/10, |R| \geq n/10$

**Compute  $s, t$ -connectivity**

# Suppose $G$ has a vertex cut of size less than $k$

Highly balanced



**WANTED**

**Fact:** **Compute  $s, t$ -connectivity**  
by  $s, t$ -Max-Flow in  $O(mk) = O(n)$

**Suppose**  $|L| \geq n/10, |R| \geq n/10$

**Sample**  $O(1)$  pairs of nodes

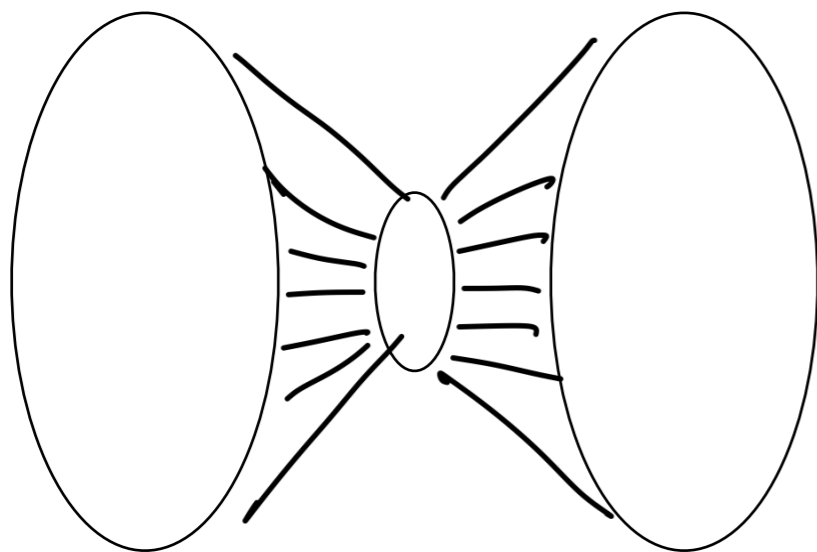
**For each pair,**

**Compute  $s, t$ -connectivity**

**Total Time** =  $O(1) \times O(n) = O(n)$

# Suppose $G$ has a vertex cut of size less than $k$

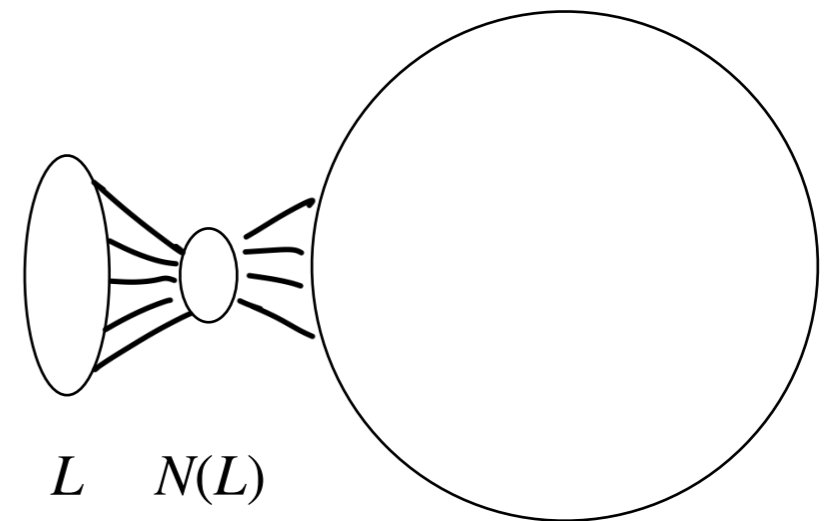
**Highly balanced**



$$|L| \geq n/10$$

$$|R| \geq n/10$$

**Highly lopsided**

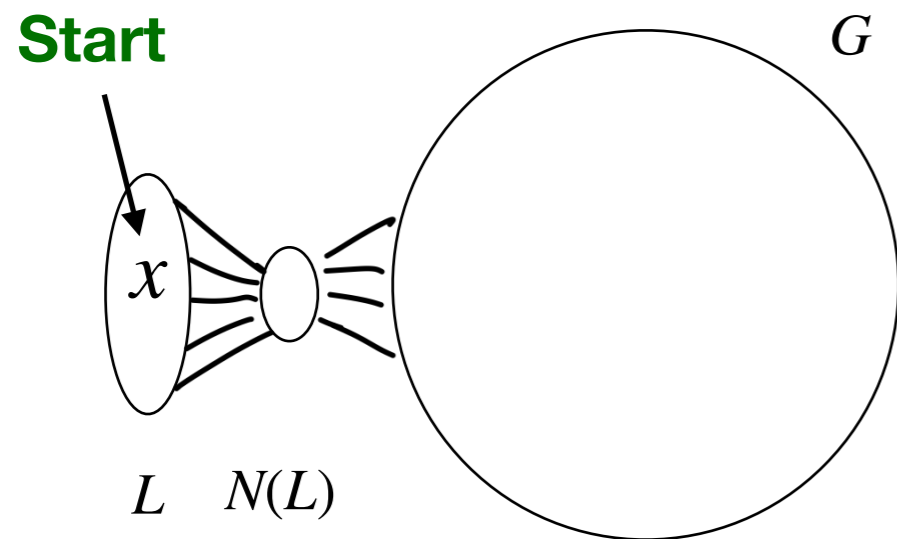


$$|L| = \sqrt{n}$$

# Suppose $G$ has a vertex cut of size less than $k$

New

Highly lopsided



Theorem: **Local Vertex Connectivity**

$$|L| \leq \nu, |N(L)| < k \quad \text{in } O(\nu k^2)$$

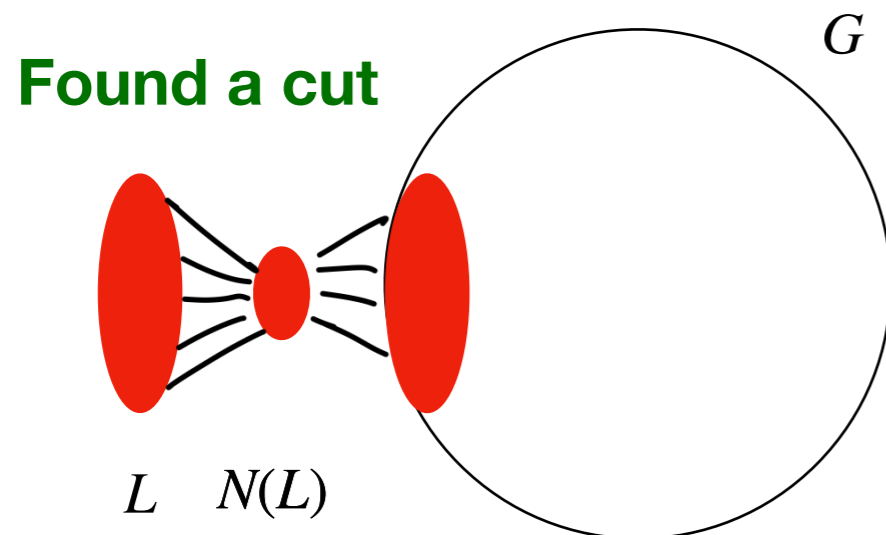
Suppose  $|L| = \sqrt{n}$

Compute **LocalVC** $(x, \nu := \sqrt{n}, k)$

# Suppose $G$ has a vertex cut of size less than $k$

New

Highly lopsided



Theorem: **Local Vertex Connectivity**

$$|L| \leq \nu, |N(L)| < k \quad \text{in } O(\nu k^2)$$

Suppose  $|L| = \sqrt{n}$

Sample  $O(\sqrt{n})$  nodes

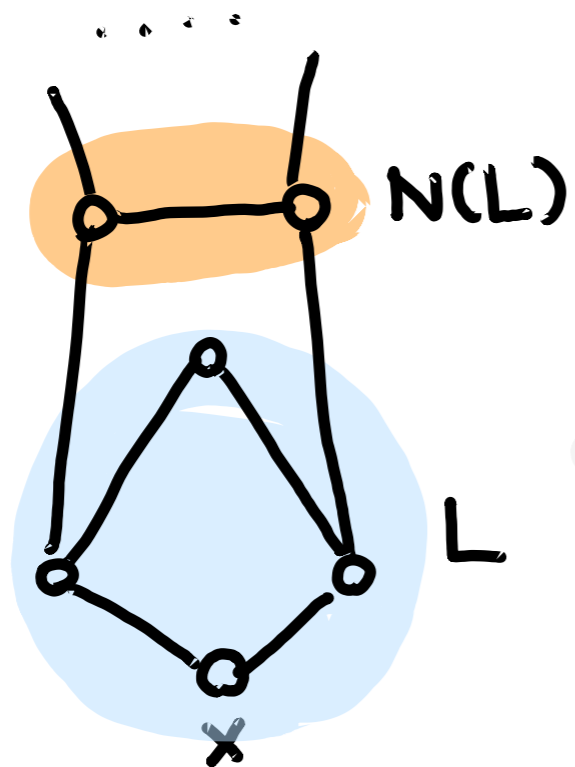
For each node,

**Compute LocalVC** $(x, \nu := \sqrt{n}, k)$

**Total Time** =  $O(\sqrt{n}) \times O(\sqrt{n}k^2) = O(n)$

# Part 3: Local Vertex Connectivity in $O(\nu k^2)$

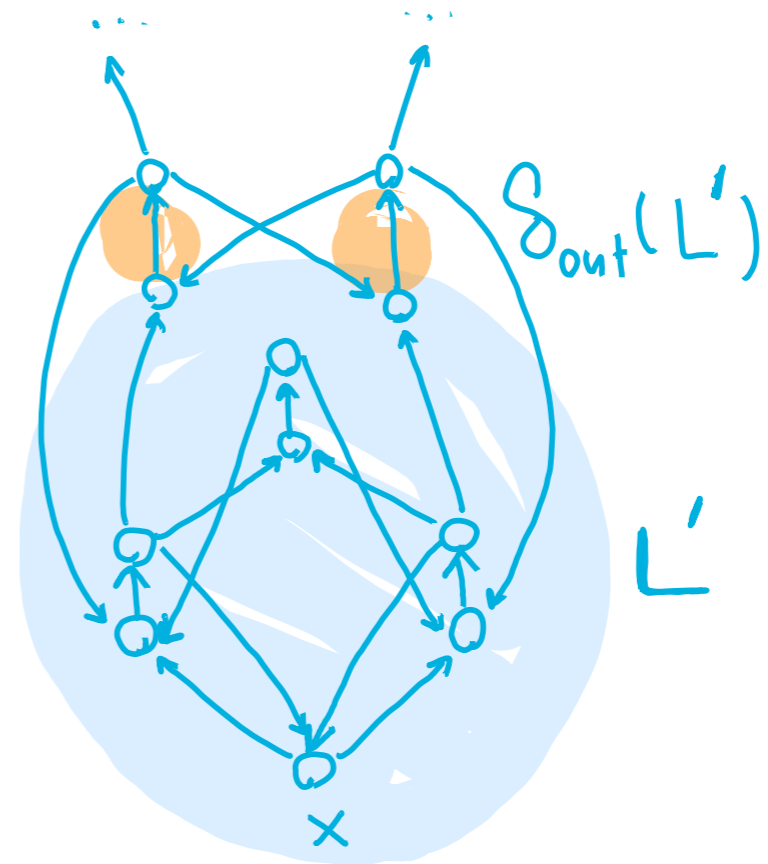




**Vertex Connectivity**



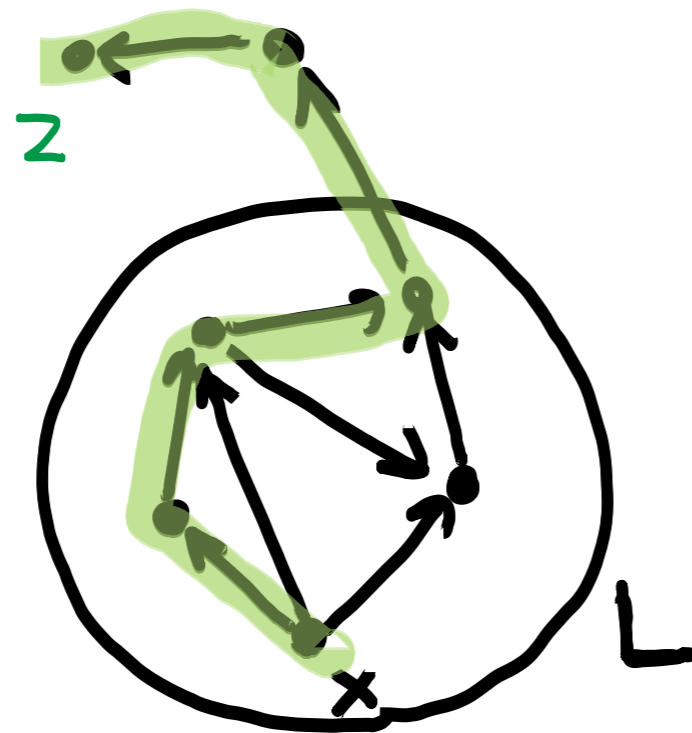
**To**



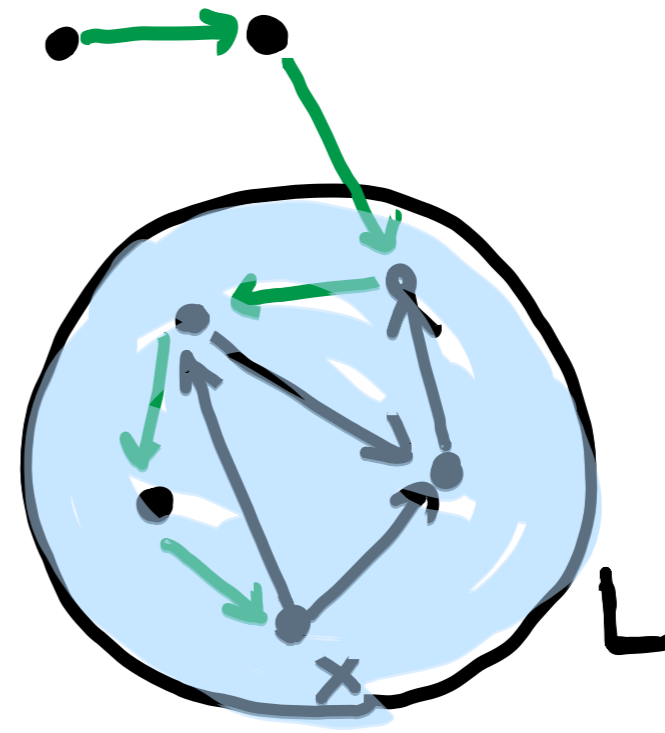
**Directed Edge Connectivity**

# Local Edge Connectivity

Suppose  $L$  has 1 leaving edge



**DFS exactly**  
 $\nu + 1$   
**edges**



**1. Reverse x,z-path**  
**2. DFS will get stuck**  
**and we get  $L$**

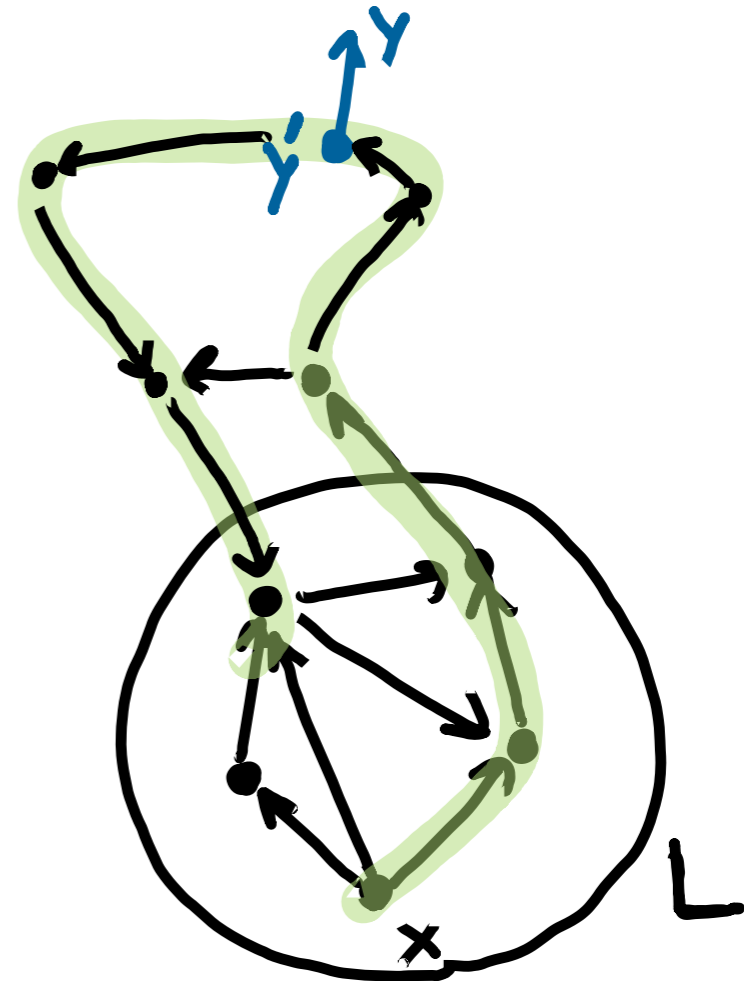
# Local Edge Connectivity

Complete pseudocode:

**Repeat**  $k$  times

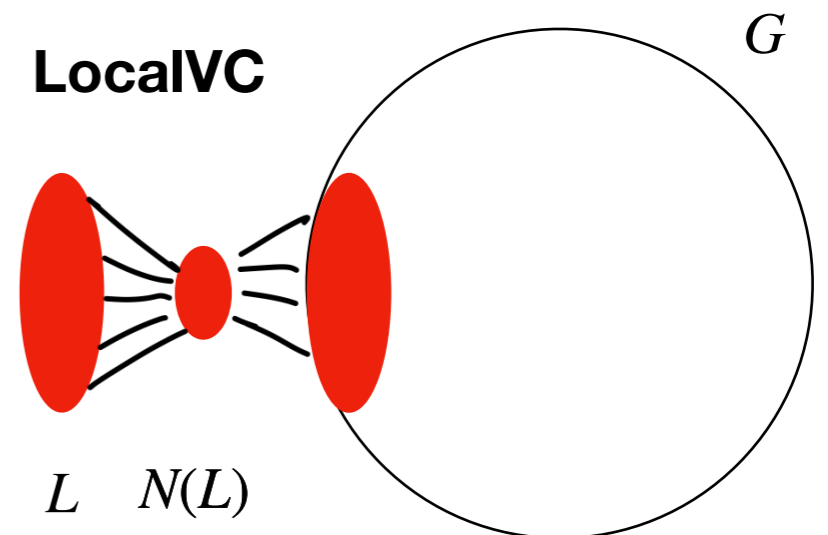
1. Grow DFS tree from  $x$  using exactly  $\nu k$  edges
2. **If** stuck, **return** a cut from DFS
3. Sample an explore edge  $(y', y)$
4. Reverse the  $x, y'$ -path

**Terminate** with no cut.



# Take Home Message:

“Local algorithms are useful for vertex connectivity”



# Open problems

1. **Deterministic** in near-linear time when  $m = O(n)$  ?  
 $O(n^{1.8})$ -time by [LNSY'19] using expander and page rank.
2.  $o(n^3)$  time when  $k = \Omega(n)$  or even in **weighted** graph?  
 $O(mn)$ -time by [Henzinger Rao Gabow'00]
3.  $O(m)$  time better **approx.** algorithm?  
 $O(\log n)$  approx. by [Censor-Hillel, Ghaffari, and Khun'14]
4. **Local vertex/edge connectivity**  
 $O(\nu k)$  time ? More applications?

# Questions?



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