

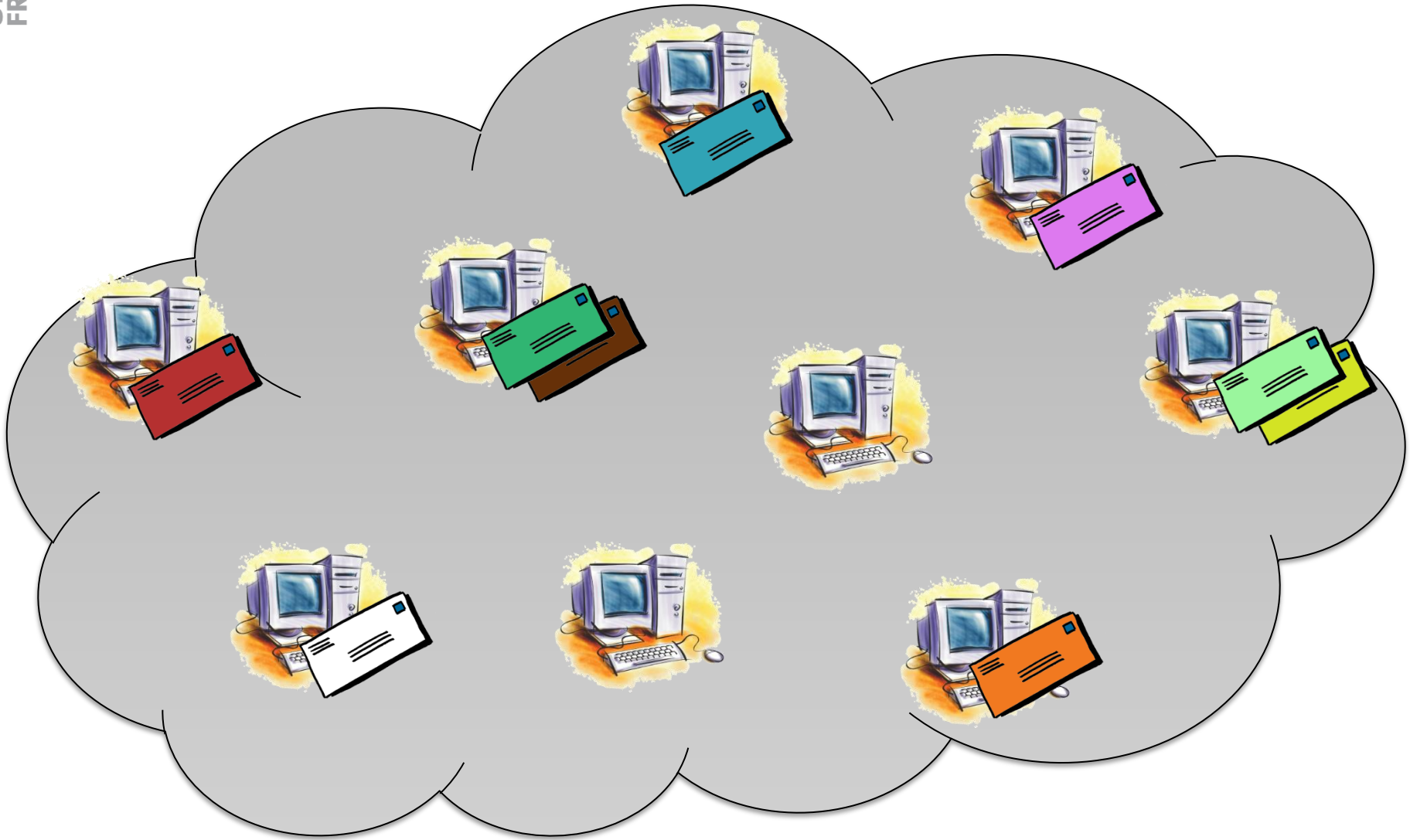
# Decomposing Vertex Connectivity and the Cost of Multiple Broadcasts

**Fabian Kuhn**

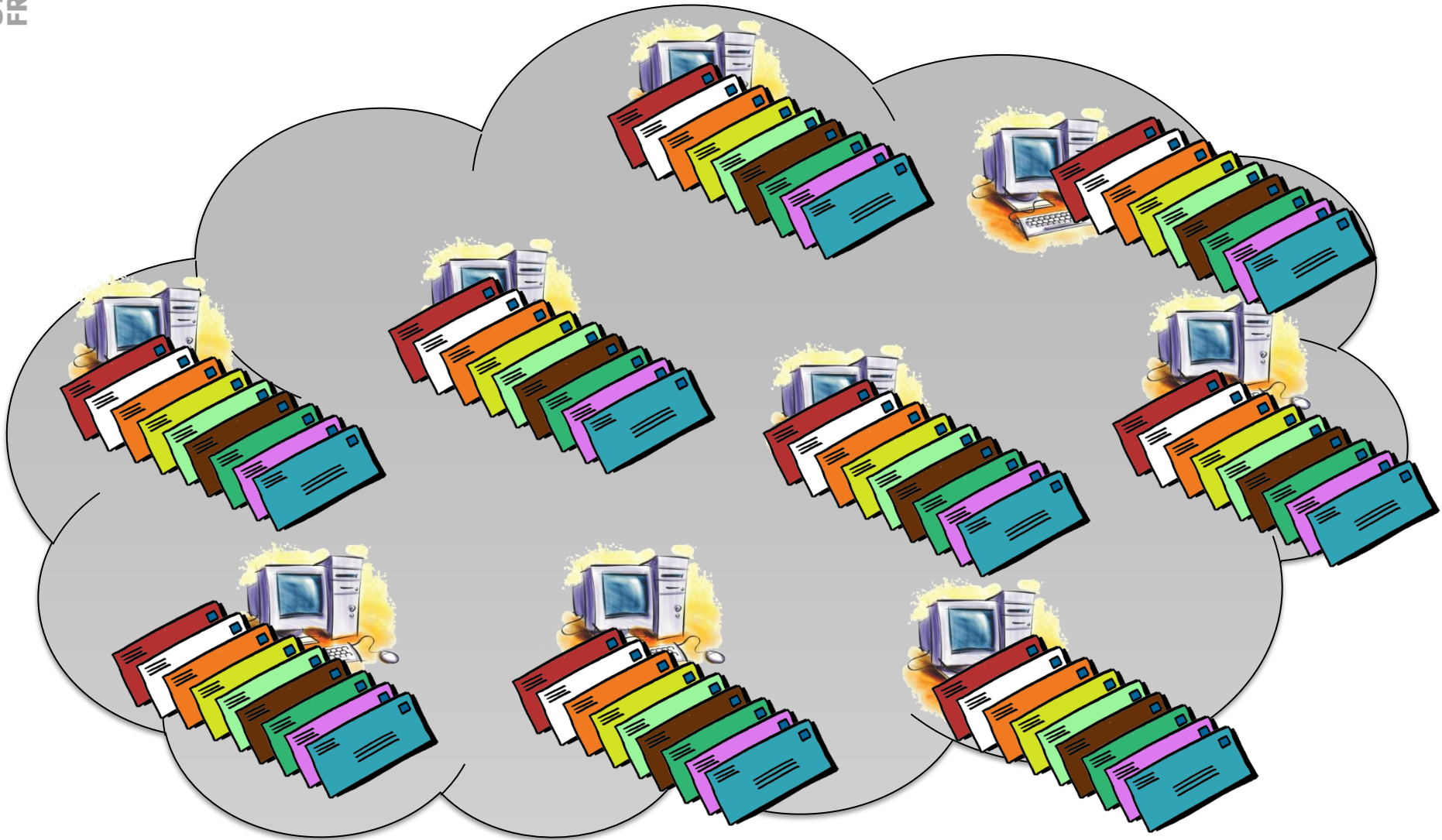
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Based on joint work with  
Mohsen Ghaffari (MIT) and Keren Censor-Hillel (Technion)

# Multi-Message Broadcast



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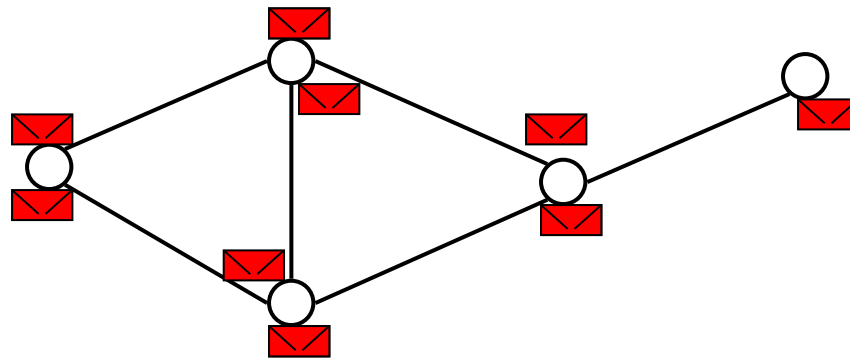


- a.k.a. gossip, token dissemination, ...

# Multi-Message Broadcast

## Communication Assumptions

- For simplicity: synchronous model
- **In each round:**  
Each node can send a message to each neighbor



- **Message size:**  $O(\log n)$  bits,  $O(1)$  broadcast messages
  - a.k.a. CONGEST model [Peleg 2000]

# Broadcasting Multiple Messages

**Goal:** (Globally) broadcast  $N$  messages

**Strategy:** In **each round**, each node forwards an  
“**unforwarded**” message to its neighbors

Which message should be forwarded to neighbors?

- It doesn't matter...

**Total time for  $N$  broadcasts  $\leq D + N$**  [Topkis '85]

- $D$ : diameter
- Optimal pipelining on a path of length  $d$  gives  $O(d + N)$ 
  - $D + N$  is **asymptotically optimal in general**
- What about networks with better connectivity?

# Communication Model

Two natural variants...

## Edge-Capacitated Model

- Message size  $O(\log n)$
- Nodes can send different messages to different neighbors
- **Classic CONGEST model**

## Node-Capacitated Model

- Message size  $O(\log n)$
- Have to send the same message to all neighbors
- **Communication by local broadcasts**

# Multi-Broadcast with Edge Capacities

## Basic assumption:

- store-and-forward algorithms

## Each message $M$ :

- Edges on which  $M$  is forwarded induce a **spanning tree!**

## Throughput ( $N$ messages):

- $N$  spanning trees, one for each message
- Optimize throughput:
  - try to use each edge as few times as possible

# Packing Spanning Trees

**Spanning Tree Packing:** set of edge-disjoint spanning trees

Spanning tree packing of size  $s \implies$  throughput  $\Omega(s)$

- sp. tree packing of size  $s \iff s$  edge-disjoint sp. trees

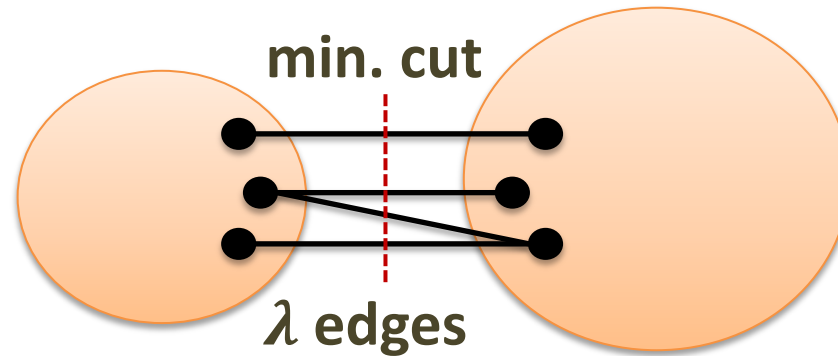
## Proof sketch:

- Each spanning tree gets  $\approx N/s$  messages
- Spanning trees don't interfere with each other
- Use pipelining on each spanning tree



# Edge Connectivity

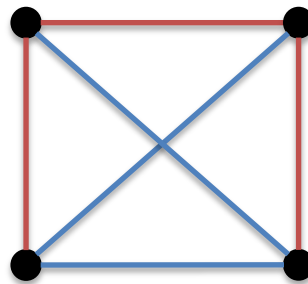
$G$  has edge connectivity  $\lambda$ :



**Thm:**  $G$  has  $\leq \lambda$  edge-disjoint spanning trees.

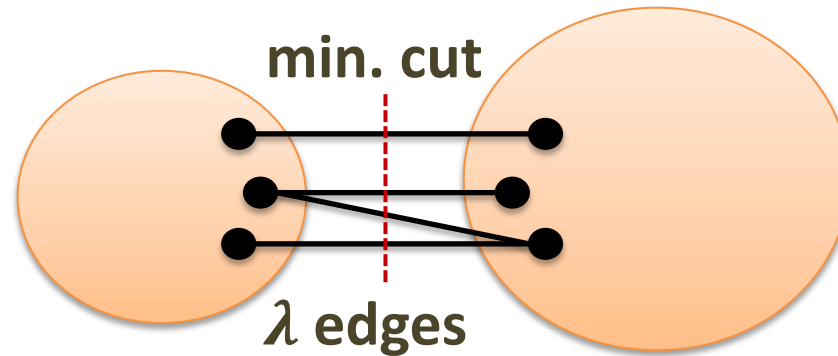
**Thm:**  $G$  has  $\geq \lambda/2$  edge-disjoint spanning trees.

[Tutte '61, Nash-Williams '61]



# Edge Connectivity

$G$  has edge connectivity  $\lambda$ :

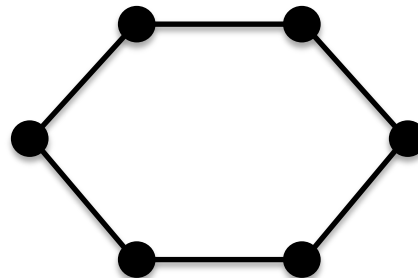


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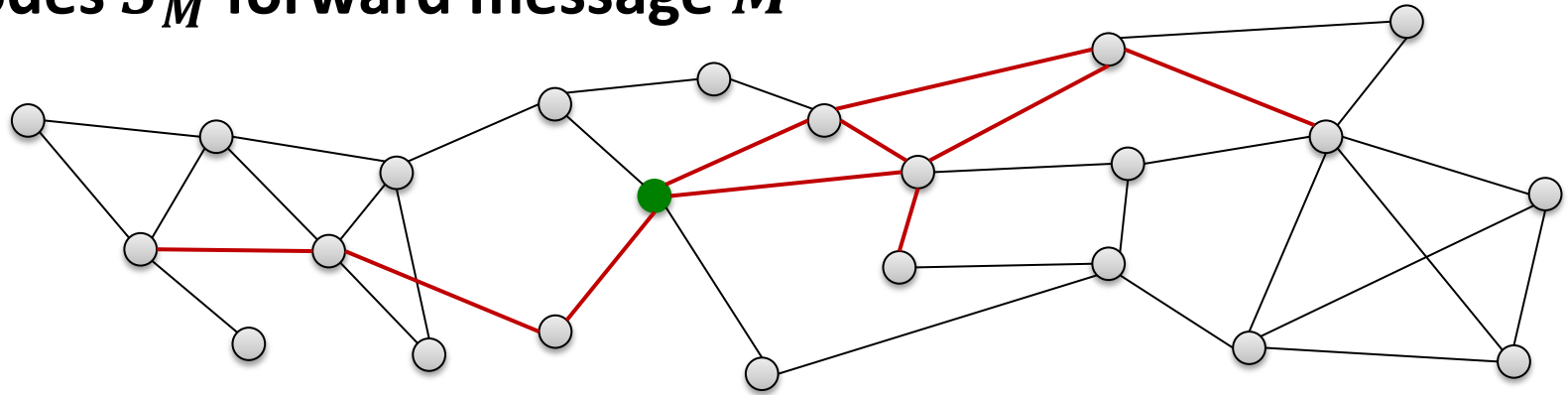
[Tutte '61, Nash-Williams '61]

- This is tight:



# Vertex-Capacitated Networks?

Nodes  $S_M$  forward message  $M$



Every other node needs to get the message:

- $S_M$  is a **dominating set**

One source  $\Rightarrow$  nodes in  $S_M$  are connected to each other

- $S_M$  is a **connected dominating set (CDS)**

One CDS for each message  $M$

- Use each node in as few CDSs as possible

# Packing Connected Dominating Sets

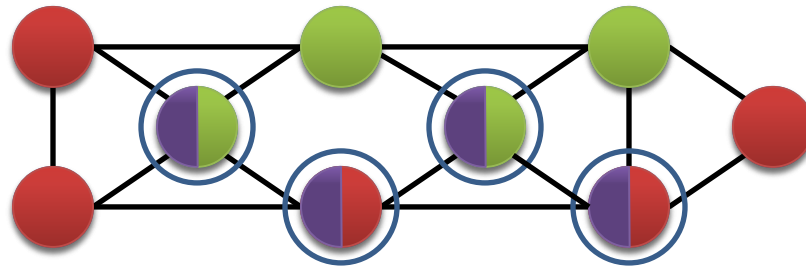
## CDS packing of size $c$

- $c$  vertex-disjoint connected dominating sets

## Fractional CDS packing of size $c$

- CDSs  $S_1, \dots, S_t$  and weights  $\lambda_1, \dots, \lambda_t$  such that

$$\sum_{i=1}^t \lambda_i = c, \quad \forall v \in V(G): \sum_{i:v \in S_i} \lambda_i \leq 1$$



# CDS Packings and Throughput

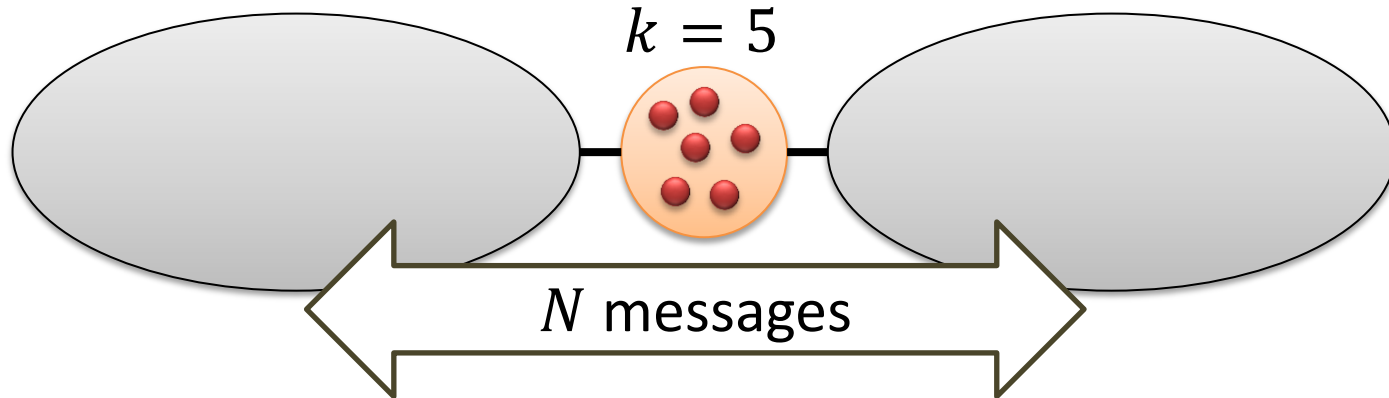
**Fractional CDS packing of size  $c \iff$  throughput  $\Omega(c)$**

~~Proof sketch:~~ Some Intuition

- Distribute msg. among CDSs (according to weight)
  - Time-share between CDSs according to weight
- Use pipelining on each CDS (optimal throughput)
- Throughput  $\Omega(c)$ :
  - Tracking routes gives CDS for each message
  - Each nodes used at most  $O(N/c)$  times
  - CDS  $S$  used by  $\ell$  messages  $\implies$  weight of  $S$  is  $\Theta(\ell c/N)$

# Vertex Connectivity

$G$  has vertex connectivity  $k$ :



- Vertex cut  $C \subseteq V(G)$ 
  - Each msg. needs to be forwarded by some node in  $C$   
throughput  $\leq k$

**Thm:** Size of largest fractional CDS packing  $\leq k$

- Can we find a (fractional) CDS packing of size  $\Omega(k)$ ?

# CDS Packing Results

- Joint work with Mohsen Ghaffari and Keren Censor-Hillel

**Thm:** There is a family of graphs with vertex connectivity  $k$  and **maximum fractional CDS packing size  $O(k/\log n)$ .**

**Thm:** Every graph with vertex connectivity  $k \geq 1$  has a **fractional CDS packing of size  $\Omega(1 + k/\log n)$ .**

**Thm:** Every graph with vertex connectivity  $k \geq 1$  has a **CDS packing of size  $\Omega(1 + k/\log^5 n)$ .**

# Vertex Sampling Results

CDS results/techniques lead to other interesting results

**Thm:** If each node of a  $k$ -vertex connected graph is indep. sampled with probability  $p$ , the **vertex connectivity of the induced sub-graph is  $\Omega(kp^2 / \log^3 n)$ .**

- Proof idea: Fractional CDS packing construction can also be applied to sampled sub-graph.

**Thm:** When sampling with prob.  $p = \gamma \cdot \log(n) / \sqrt{k}$ , the induced sub-graph is **connected w.h.p.**

- Tight up to factor  $O(\sqrt{\log n})$ .
- No non-trivial results of this kind were known before!



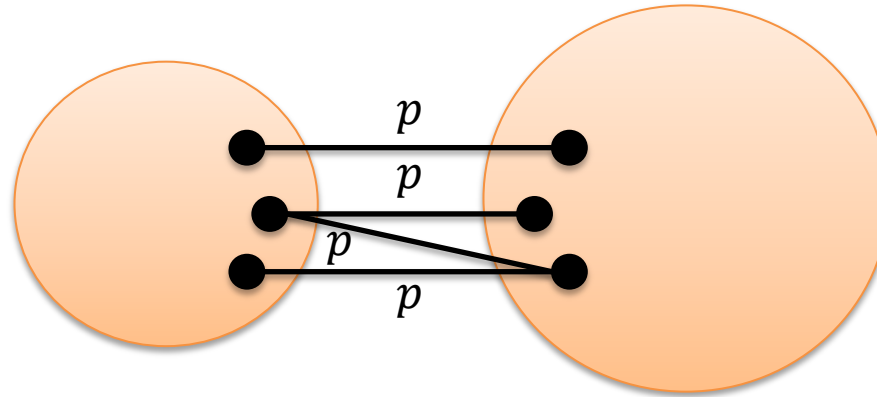
# Edge Sampling

Graph  $G$  is  $\lambda$ -edge connected:

- $H$ : sub-graph induced when independently **sampling each edge** with **probability  $p = \Omega(\log(n)/\lambda)$** .
- $H$  is a connected graph, w.h.p. [Lomonosov and Poleskii '71]
- The edge connectivity of  $H$  is  $\Omega(\lambda p)$ , w.h.p. [Karger '94]
- Both results are tight

# Cuts After Sampling

- A cut with value  $\alpha\lambda$  in  $G$  has expected value  $p \cdot \alpha\lambda$  in  $H$



- Chernoff bound: the probability that the value is far by a factor  $\geq (1 + \varepsilon)$  is  $e^{-\Theta(\varepsilon^2 p \alpha \lambda)}$
- Union bound: values of **all** cuts are close to expectation
- **Main tool:** number of edge cuts of size  $\leq \alpha\lambda$  is  $O(n^{2\alpha})$

# Number of Cuts

## $G$ is $\lambda$ -edge connected:

- Number of edges cuts of size  $\leq \alpha\lambda$  is  $O(n^{2\alpha})$  [Karger '94]
- Number of min. edge cuts is  $O(n^2)$

## $G$ is $k$ -vertex connected:

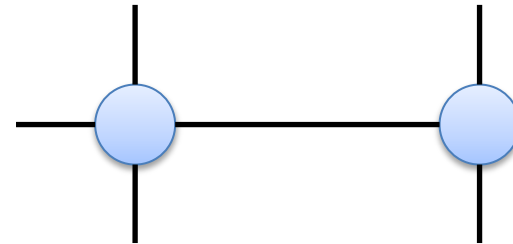
- Number of min. vertex cuts can be  $\Theta(2^k (n/k)^2)$ .

**Our results:** Tools for analyzing vertex connectivity

# Vertex Sampling Proof

$H \subseteq G$ : Sub-graph with nodes sampled independently with probability  $p \geq \beta \log(n)/\sqrt{k} \Rightarrow H$  connected, w.h.p.

Proof Sketch:

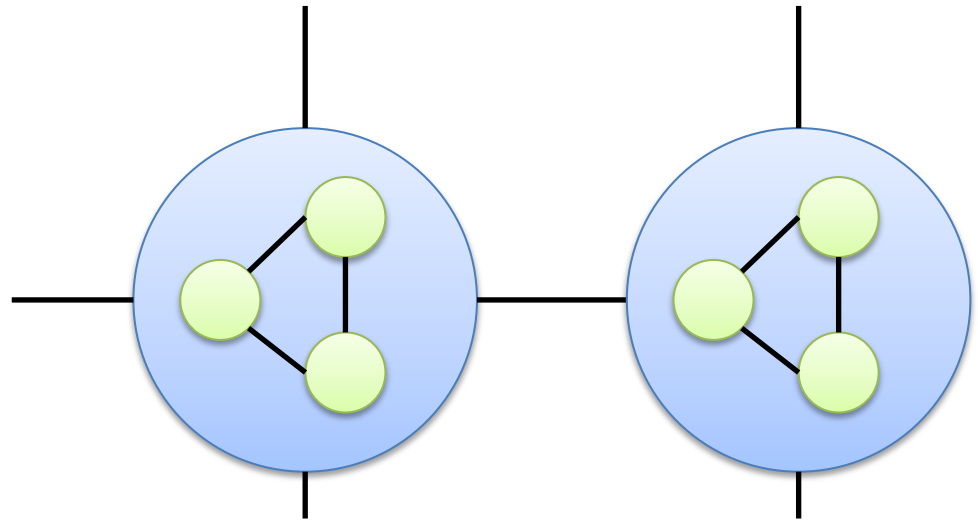


# Vertex Sampling Proof

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Proof Sketch:

Virtual graph  $G'$  with  
 $L = \Theta(\log n)$  layers



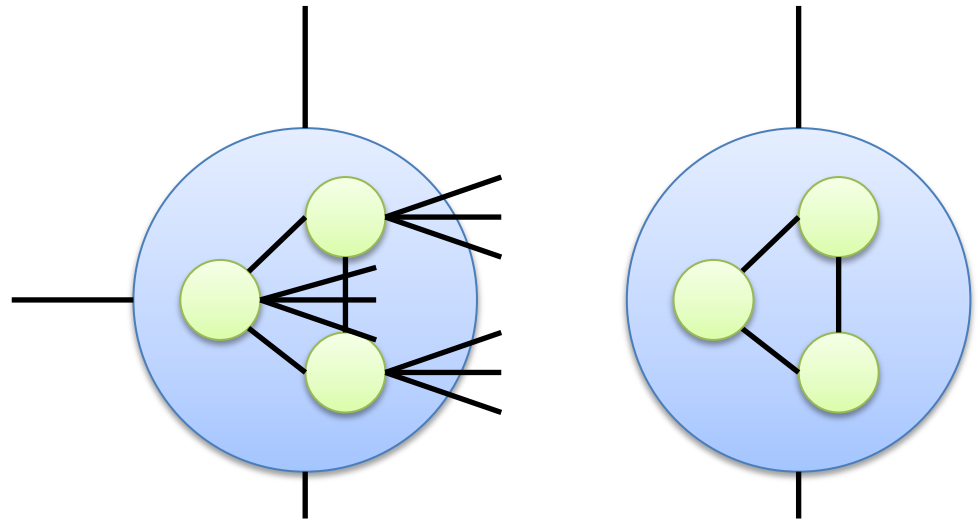
Edge between copies of same node or of neighboring nodes

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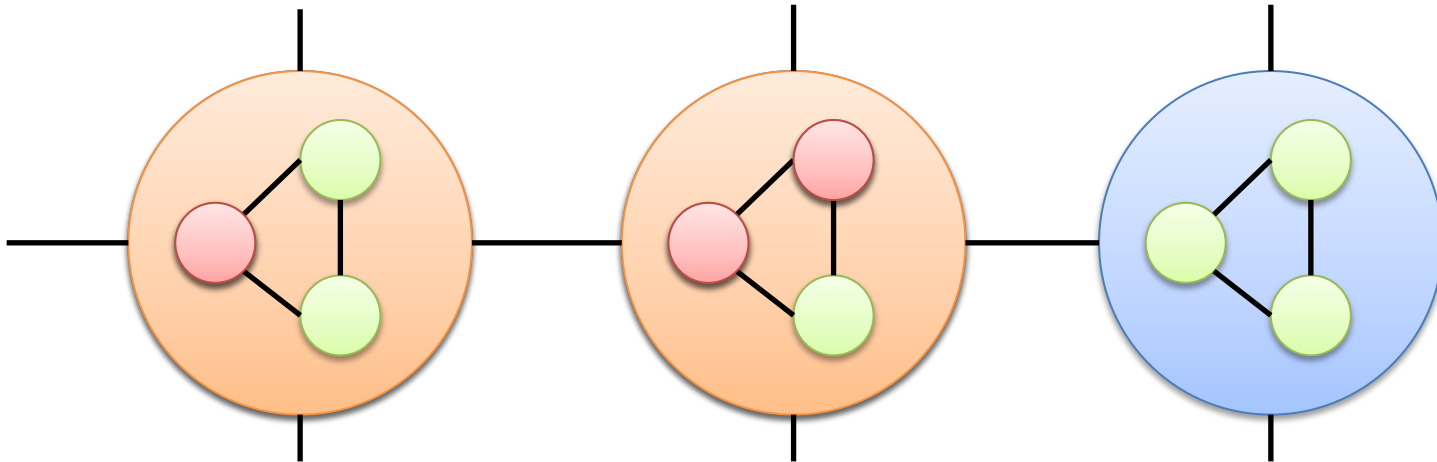


Edge between copies of same node or of neighboring nodes

# Virtual Graph

Node set  $W' \subseteq V'$  is projected to  $W \subseteq V$ :

$w \in W \iff W'$  contains a copy of  $w$



**$W'$  connected  $\iff W$  connected**

**$W'$  dominating  $\iff W$  dominating**

# Coupling Argument

- Sample virtual nodes with probability

$$q = 1 - (1 - p)^{1/L} \approx \frac{p}{L}$$

- Sample real node  $v$  iff  $v$  is in the projection of the sampled virtual nodes (at least one copy of  $v$  sampled in  $G'$ )

Happens with **probability**  $1 - (1 - q)^L = p$

- Show that **sampling in  $G'$  gives a CDS**

**Idea: sample layer by layer and study progress**



# Domination

**Claim:** After sampling  $L/2$  layers, the sampled nodes form dominating set.

Proof Sketch:

- Sampling probability in  $G$  after  $L/2 = \Theta(\log n)$  layers is

$$\frac{\Theta(\log n)}{\sqrt{k}}$$

- Domination follows directly because every node in  $G$  has degree  $\geq k$

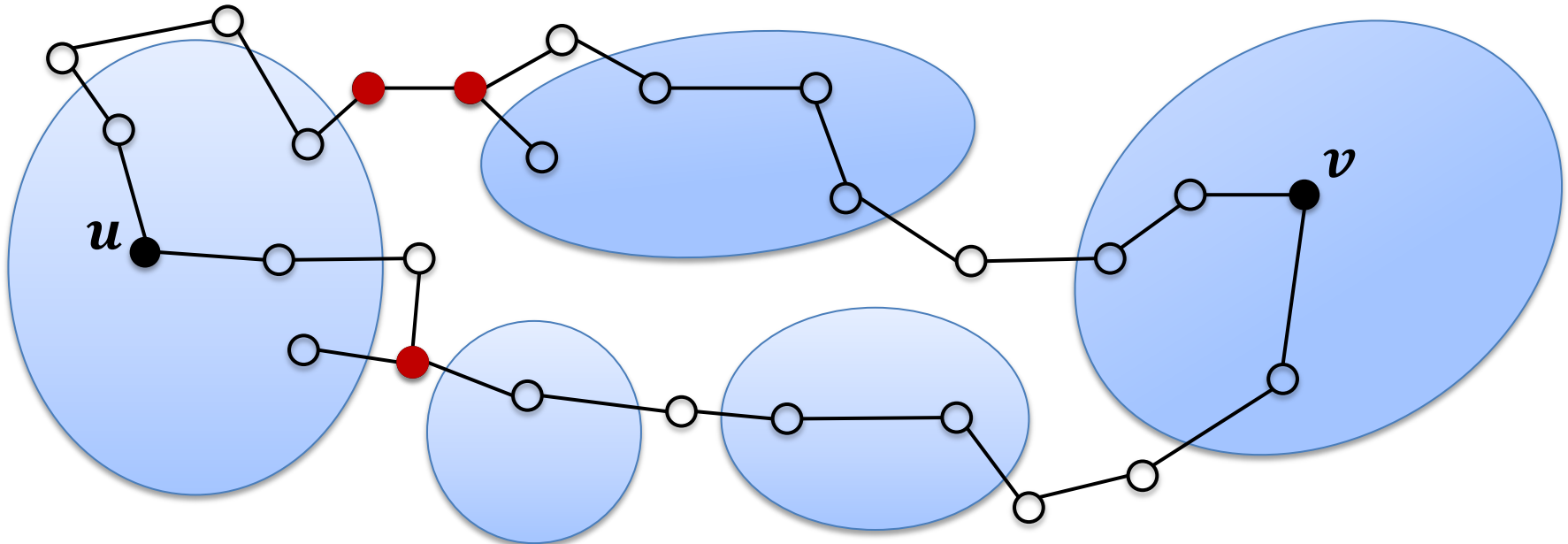
# Connectivity

## Recall Menger's theorem:

- In a  $k$ -vertex connected graph  $G = (V, E)$ , any two nodes are connected by  $k$  internally vertex-disjoint paths

**Assume:**  $G$  is  $k$ -vertex connected,  $S \subseteq V$  is a dominating set

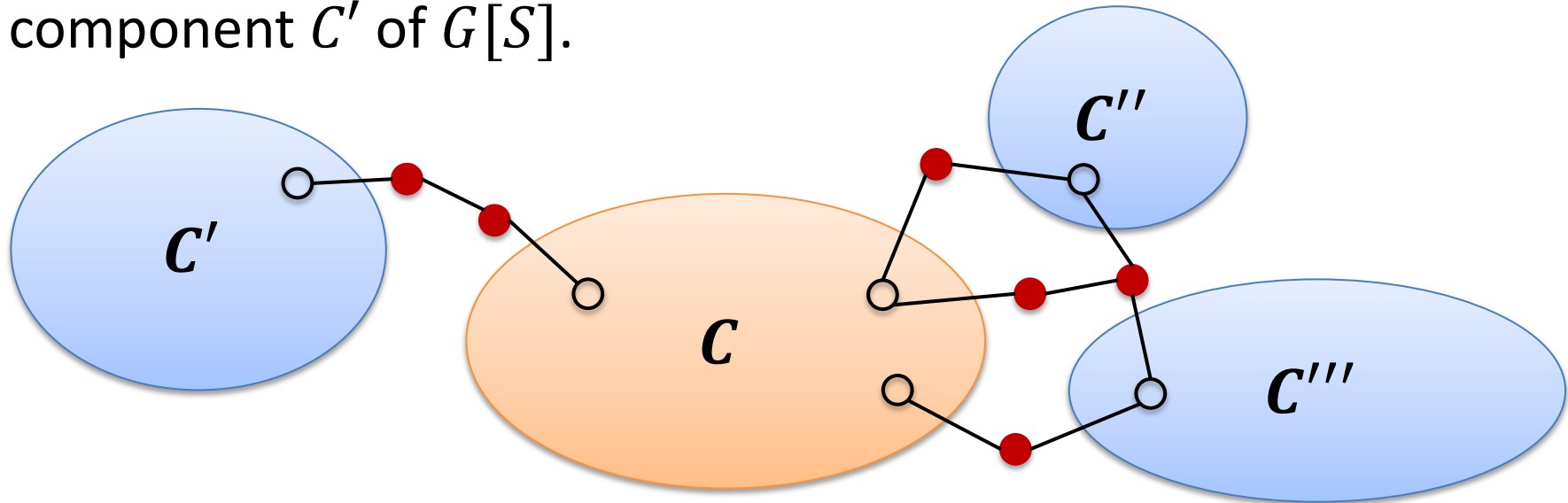
## Components of $G[S]$ :



# Connector Paths

**Assume:**  $G = (V, E)$ ,  $S \subseteq V$  a dominating set

**Definition:** For a component  $C$  of  $G[S]$ , a *connector path* is a path with  $\leq 2$  internal nodes connecting  $C$  to another component  $C'$  of  $G[S]$ .



**Menger & Domination of  $S$ :**

- $G$   $k$ -vertex connected  $\implies$  there are  $\geq k$  such paths!

# Connectivity

## Consider a layer $\ell > L/2$

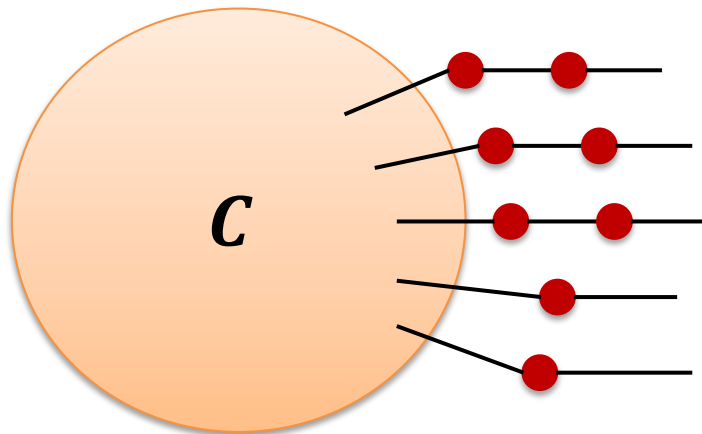
- Nodes  $S_{<\ell}$  sampled by layers  $< \ell$  form a dominating set

## Sampling of layer $\ell$ :

- Virtual nodes sampled with probability

$$q \approx \frac{p}{L} = \frac{1}{L} \cdot \frac{\beta \log n}{\sqrt{k}} = \Theta\left(\frac{1}{\sqrt{k}}\right)$$

## Component of $G[S_{<\ell}]$ :



- $\geq k$  connector paths
- each of them sampled with prob  $\Omega(1/k)$  in layer  $\ell$
- $C$  connected to another component with const. prob.

## Fast Merging:

- On each layer  $\ell > L/2$ , each component is connected to at least one other component with at least constant prob.
- With at least constant probability, the number of connected components of the induced sub-graph is reduced by a constant factor
- **After  $O(\log n)$  layers, we have connectivity, w.h.p.**
  - Initially, #components is  $O(n)$

# (Fractional) CDS Packing

- Sampling directly gives CDS packing of size  $\Omega(\sqrt{k}/\log n)$

## From size $\tilde{\Omega}(\sqrt{k})$ to $\tilde{\Omega}(k)$ ...

- also based on virtual graph and layering
- construct all the CDSs at the same time
- carefully choose / assign connector paths
  - make progress for all CDSs (reduce overall # of components)
- Gives **fractional CDS packing**
  - different virtual copies of the same node in  $G$  can go to different CDSs
  - Each node is in at most  $O(\log n)$  CDSs
- **CDS packing:**  
Use random layers of real nodes instead of virtual nodes

# Distributed Construction

(Fractional) CDS packings of the same quality can be computed in a distributed way in time  $\tilde{O}(D + \sqrt{n})$ .

- Algorithm works in the CONGEST model with
  - Messages of size  $O(\log n)$
  - Capacities at nodes (comm. by local broadcast)

## Lower bound

- If  $k$  is not known,  $\tilde{\Omega}\left(D + \sqrt{n/k}\right)$  rounds needed
- Proof based on techniques from [Das Sarma et al. '12]

# Network/Graph Decompositions

## Classic Locality Decompositions

- Decompose graph into clusters of small diameter
- Preserve locality, cluster graph sparse, low chrom. #, ...
  - e.g., [Awerbuch,Goldberg,Luby,Plotkin '89], [Awerbuch,Peleg '90], [Linial,Saks '93]
  - leads to efficient algorithms in the LOCAL model

## (Fractional) CDS and Spanning Tree Packings

- Decompose nodes / edges of a graph  $G$  into components
- Components are connected and they “span”  $G$
- Also useful as a generic tool to build distributed alg.?
  - if we want to exploit the inherent parallelism in networks
  - for CONGEST algorithms...



# Approximating Vertex Connectivity

Fractional CDS packing construction gives  $O(\log n)$ -approximation of the **vertex connectivity**  $k$  of  $G$ .

- Time to construct fractional CDS packing:  $\tilde{O}(m)$
- Fastest known non-trivial approximation of vertex conn.
- Best known algorithms:
  - compute  $k$  exactly [Gabow '00]:  $O(n^2k + \min\{nk^{3.5}, n^{1.75}k^2\})$
  - 2-approximation [Henzinger '97]:  $O(\min\{n^{2.5}, n^2k\})$
- Distributed algorithm:  $\tilde{O}\left(\min\left\{\frac{n}{k}, D + \sqrt{n}\right\}\right)$

# Open Problems

- Close the log / polylog gaps!
- CDS packings as a useful primitive (e.g., for distr. alg.)?
- Other applications of the techniques in distr. algorithms?
- Other uses of the layering / virtual graph idea?
  - In particular, when dealing with graph connectivity...
  - Idea also appears in the context of edge sampling in [Alon '95]

Thanks for your attention!

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Questions, Comments?