

# Peer-to-Peer Networks

## 10 Random Graphs for Peer-to-Peer-Networks

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# Peer-to-Peer Networking Facts

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- Hostile environment
  - Legal situation
  - Egoistic users
  - Networking
    - ISP filter Peer-to-Peer Networking traffic
    - User arrive and leave
    - Several kinds of attacks
    - Local system administrators fight peer-to-peer networks
- Implication
  - Use stable robust network structure as a backbone
  - Napster: star
  - CAN: lattice
  - Chord, Pastry, Tapestry: ring + pointers for lookup
  - Gnutella, FastTrack: chaotic “social” network
- Idea: Use a Random d-regular Network

# Why Random Networks ?

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- Random Graphs ...

- Robustness
- Simplicity
- Connectivity
- Diameter
- Graph expander
- Security



gnutella.com

- Random Graphs in Peer-to-Peer networks:

- Gnutella
- JXTApose



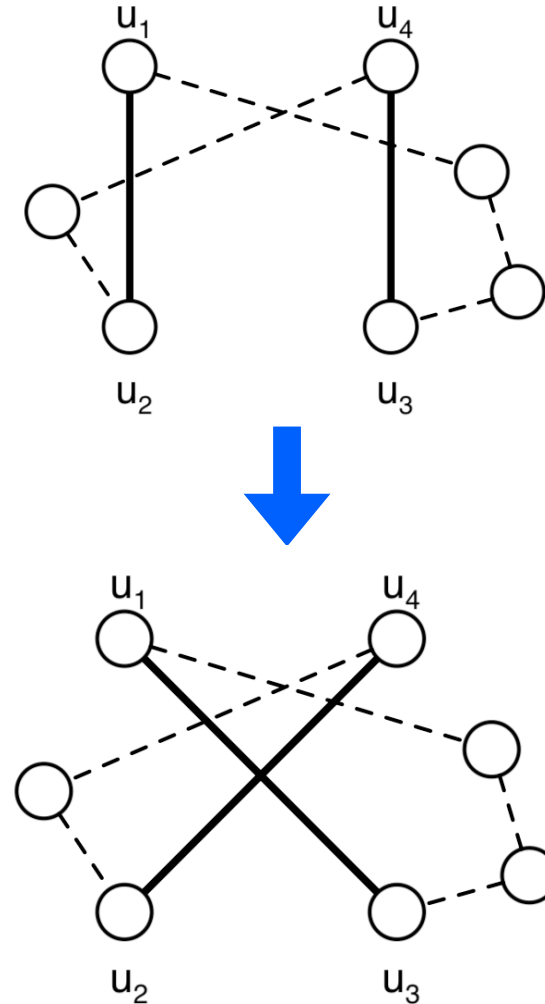
- Peer-to-Peer networks are highly dynamic ...
  - maintenance operations are needed to preserve properties of random graphs
  - which operation can maintain (repair) a random digraph?

Desired properties:

<b>Soundness</b>	Operation remains in domain (preserves connectivity and out-degree)
<b>Generality</b>	every graph of the domain is reachable does not converge to specific small graph set
<b>Feasibility</b>	can be implemented in a P2P-network
<b>Convergence Rate</b>	probability distribution converges quickly

# Simple Switching

- Simple Switching
  - choose two random edges
    - $\{u_1, u_2\} \in E, \{u_3, u_4\} \in E$
  - such that  $\{u_1, u_3\}, \{u_2, u_4\} \notin E$ 
    - add edges  $\{u_1, u_3\}, \{u_2, u_4\}$  to  $E$
    - remove  $\{u_1, u_2\}$  and  $\{u_3, u_4\}$  from  $E$
- McKay, Wormald, 1990
  - Simple Switching converges to uniform probability distribution of random network
  - Convergence speed:
    - $O(nd^3)$  for  $d \in O(n^{1/3})$
- Simple Switching cannot be used in Peer-to-Peer networks
  - Simple Switching disconnects the graph with positive probability
  - No network operation can re-connect disconnected graphs



# Necessities of Graph Transformation

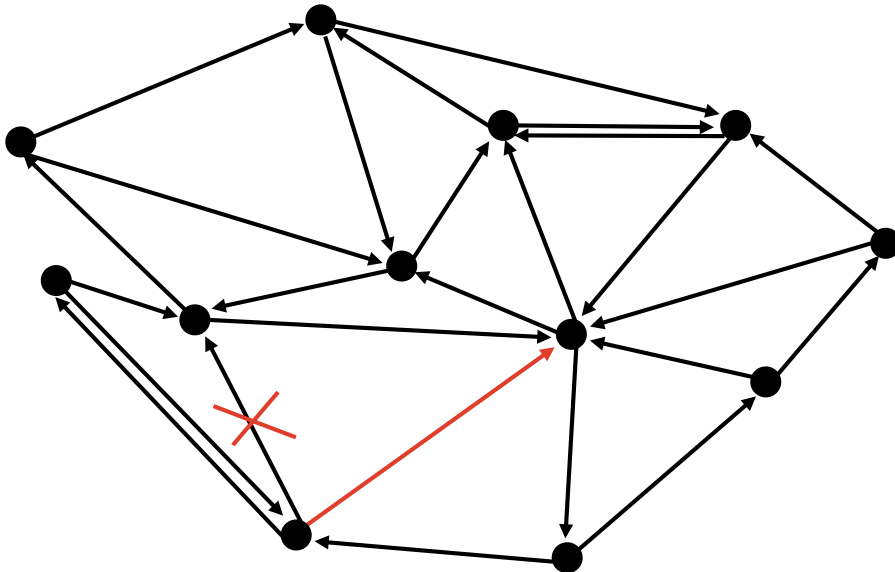
	Simple-Switching
Graphs	Undirected Graphs
Soundness	?
Generality	<
Feasibility	✓
Convergence	✓

- Problem: Simple Switching does not preserve connectivity
- Soundness
  - Graph transformation remains in domain
  - Map connected d-regular graphs to connected d-regular graphs
- Generality
  - Works for the complete domain and can lead to any possible graph
- Feasibility
  - Can be implemented in P2P network
- Convergence Rate
  - The probability distribution converges quickly

- Peter Mahlmann, Christian Schindelhauer
  - Distributed Random Digraph Transformations for Peer-to-Peer Networks, 18th ACM Symposium on Parallelism in Algorithms and Architectures, Cambridge, MA, USA. July 30 - August 2, 2006

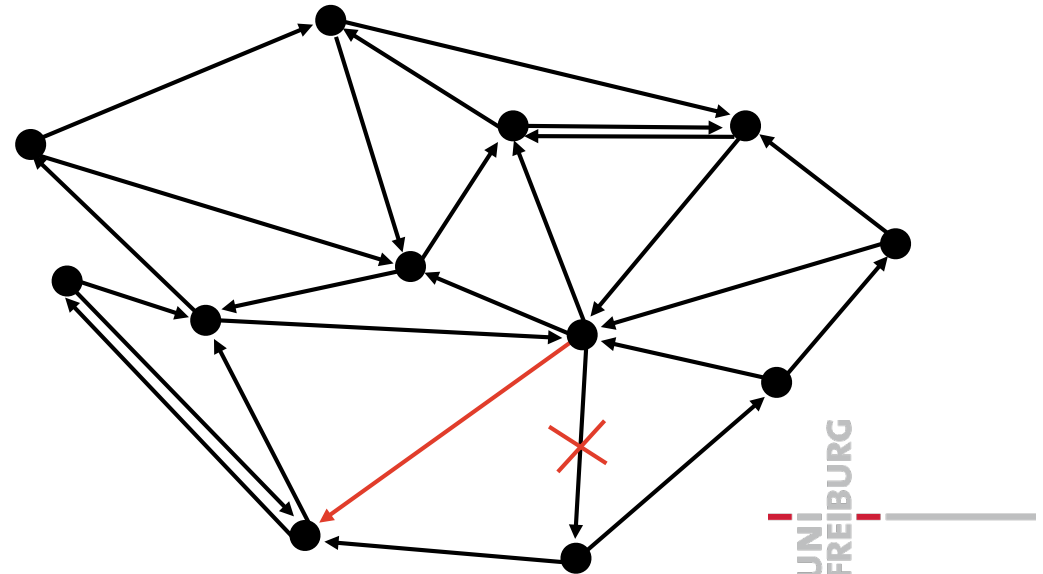
## Push Operation:

1. Choose random node  $u$
2. Set  $v$  to  $u$
3. While a random event with  $p = 1/h$  appears
  - a) Choose random edge starting at  $v$  and ending at  $v'$
  - b) Set  $v$  to  $v'$
3. Insert edge  $(u, v)$
4. Remove random edge starting at  $v$



## Pull Operation:

1. Choose random node  $u$
2. Set  $v$  to  $u$
3. While a random event with  $p = 1/h$  appears
  - a) Choose random edge starting at  $v$  and ending at  $v'$
  - b) Set  $v$  to  $v'$
3. Insert edge  $(v, u)$
4. Remove random edge starting at  $v'$



# Simulation of Push-Operations

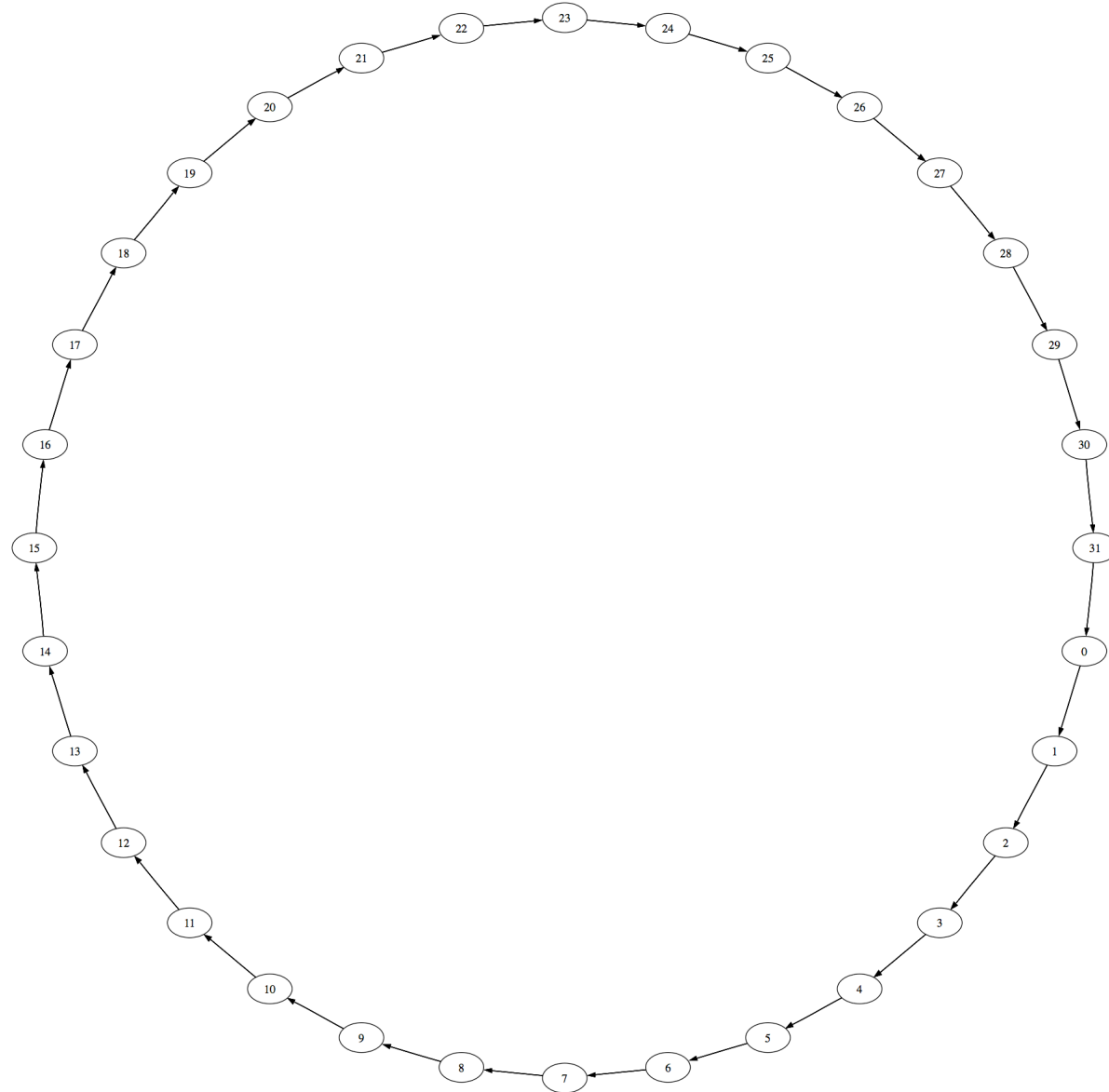
Start situation

**Parameter:**

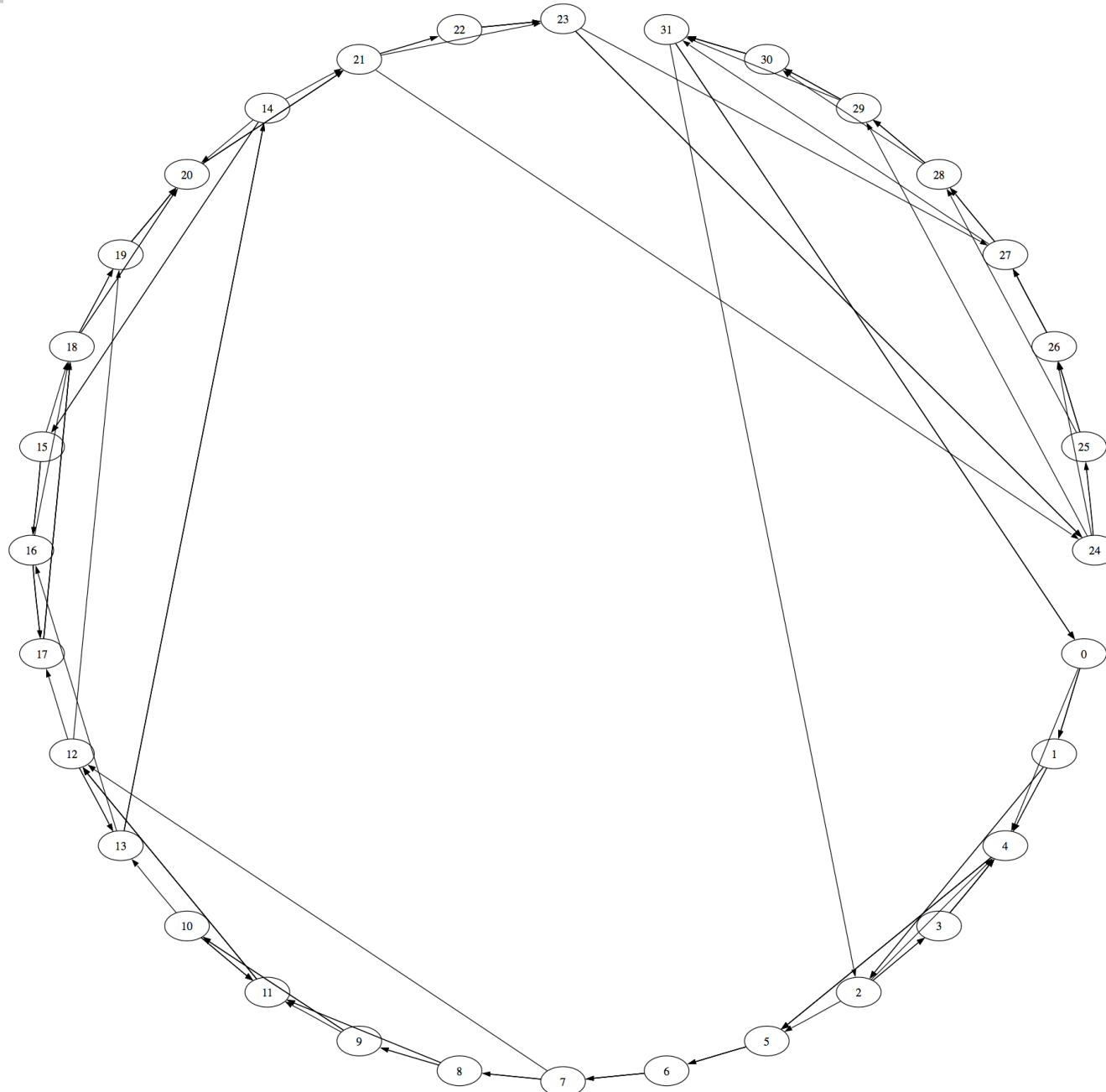
$n = 32$  Knoten

out-degree  $d = 4$

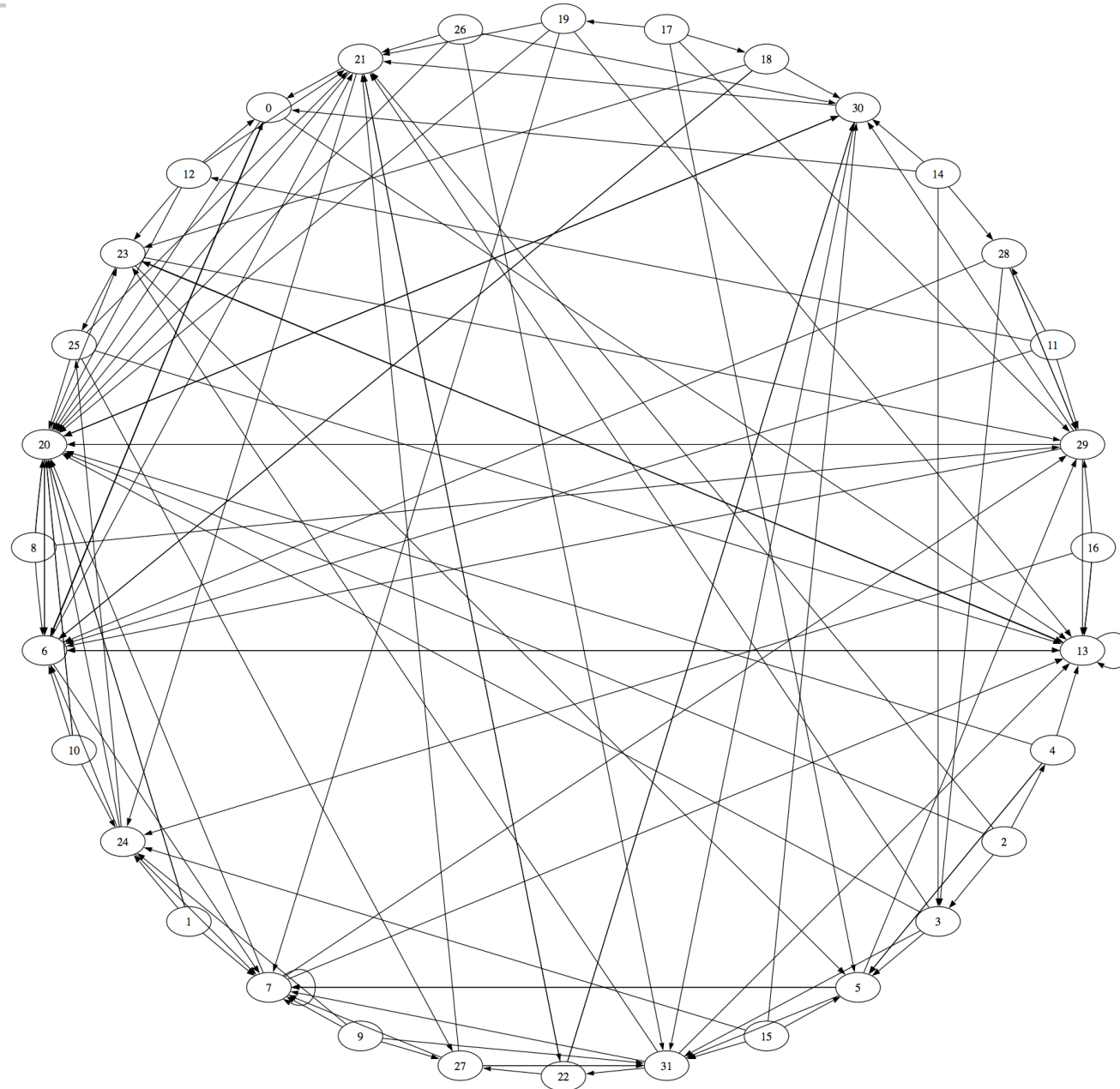
Hop-distance  $h = 3$



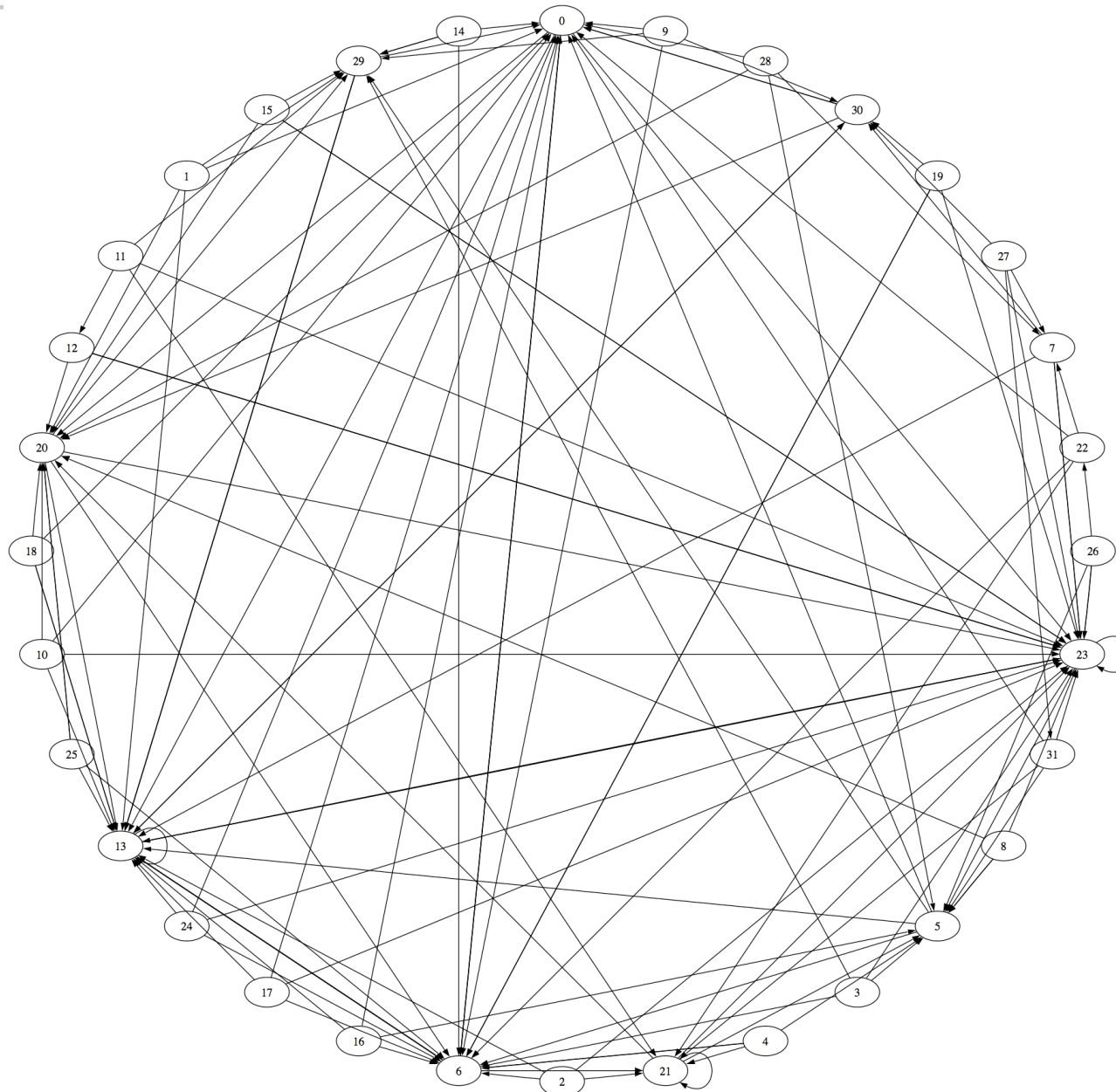
# 1 Iteration Push ...



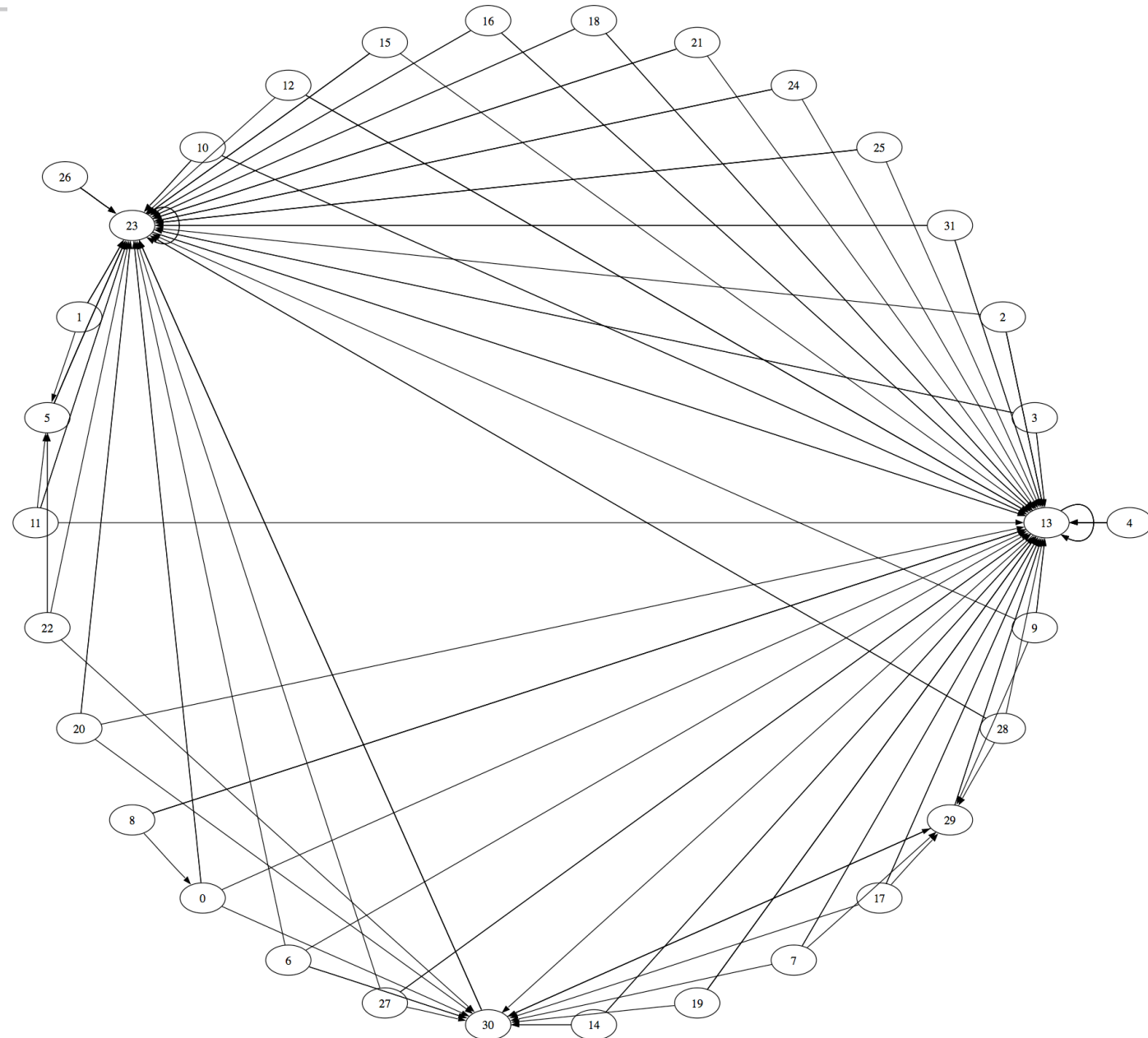
# 10 Iterations Push ...



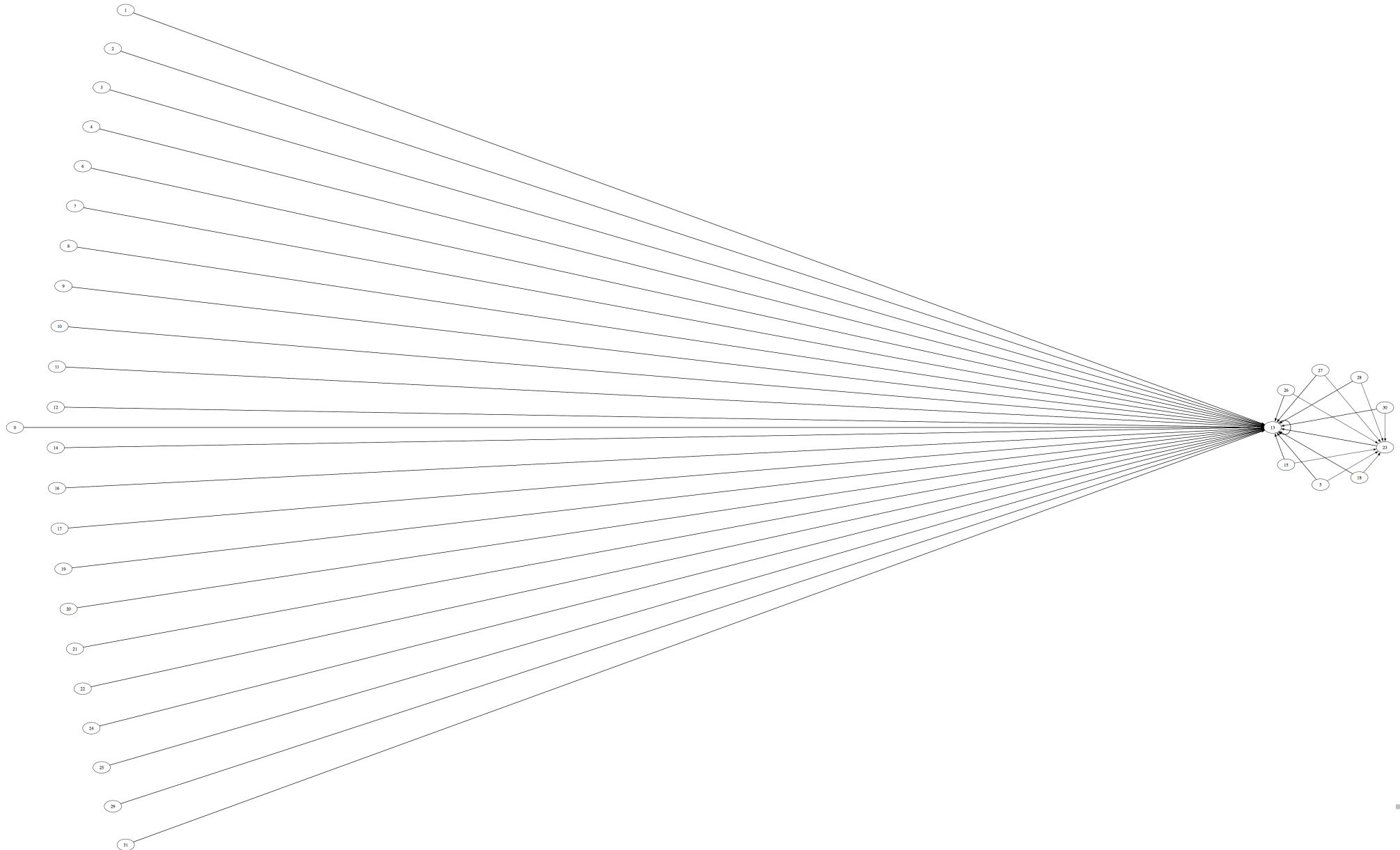
# 20 Iterations von Push ...



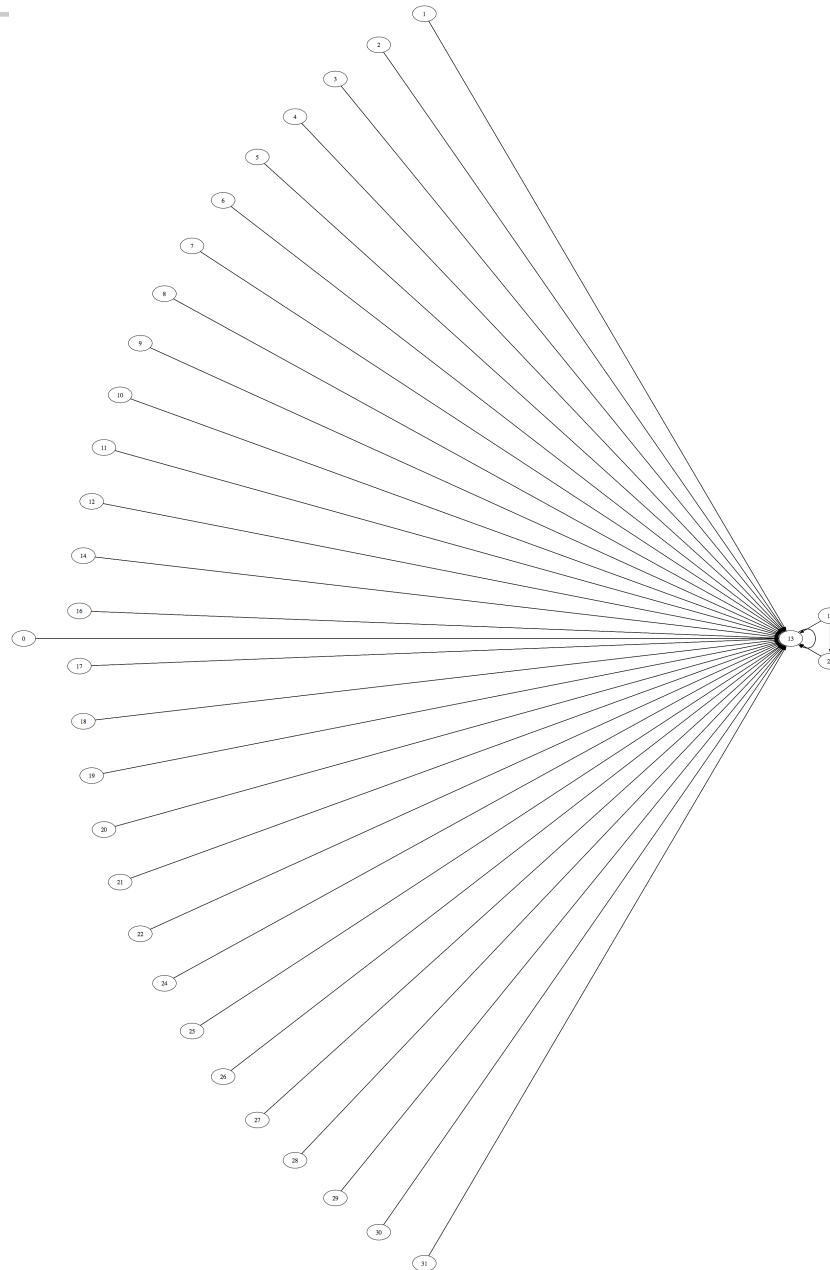
# 30 Iterations Push ...



# 40 Iterations Push ...

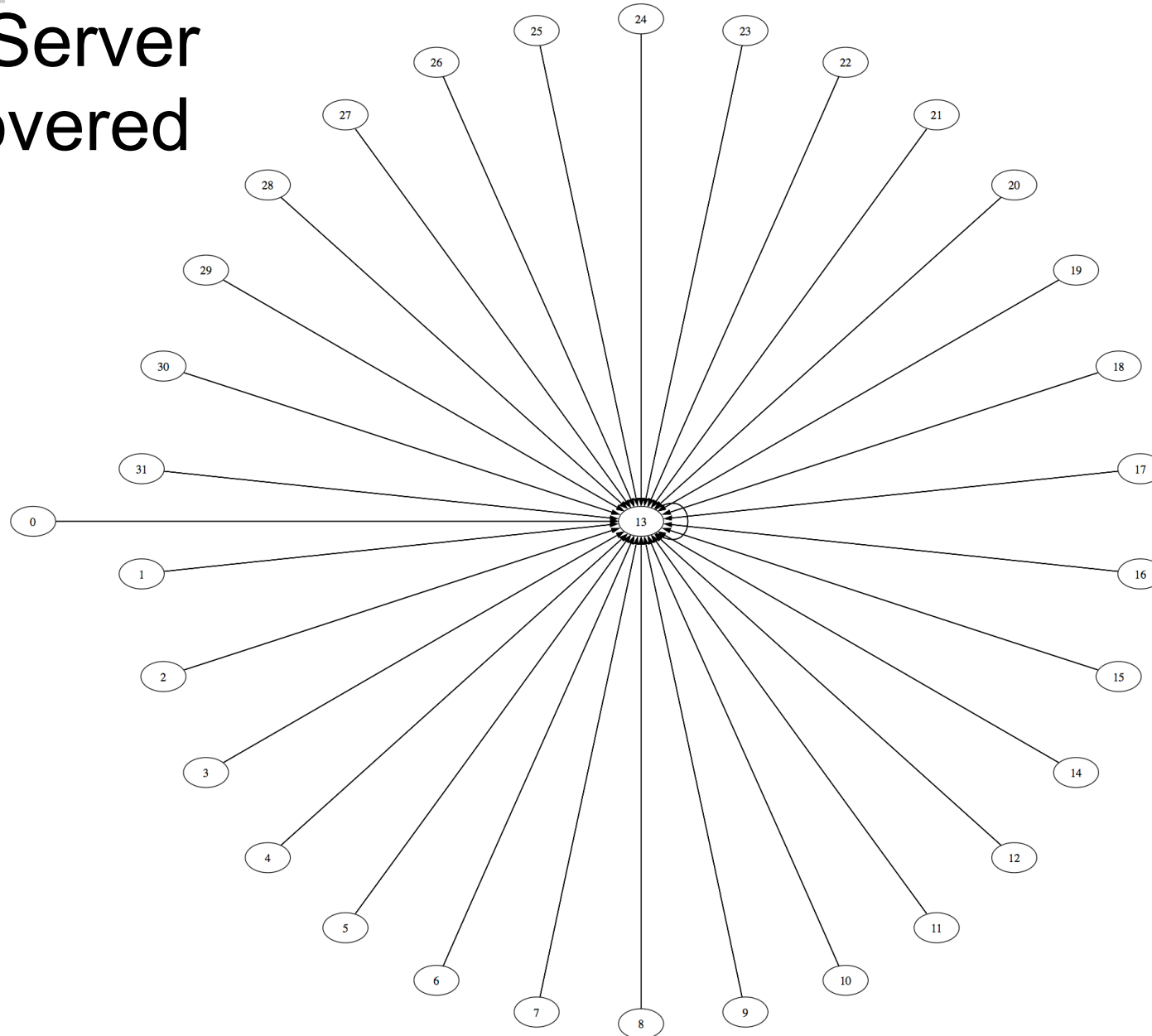


# 50 Iterations Push ...



# 70 Iterations Push ...

Client-Server  
rediscovered



# Simulation of Pull-Operation ...

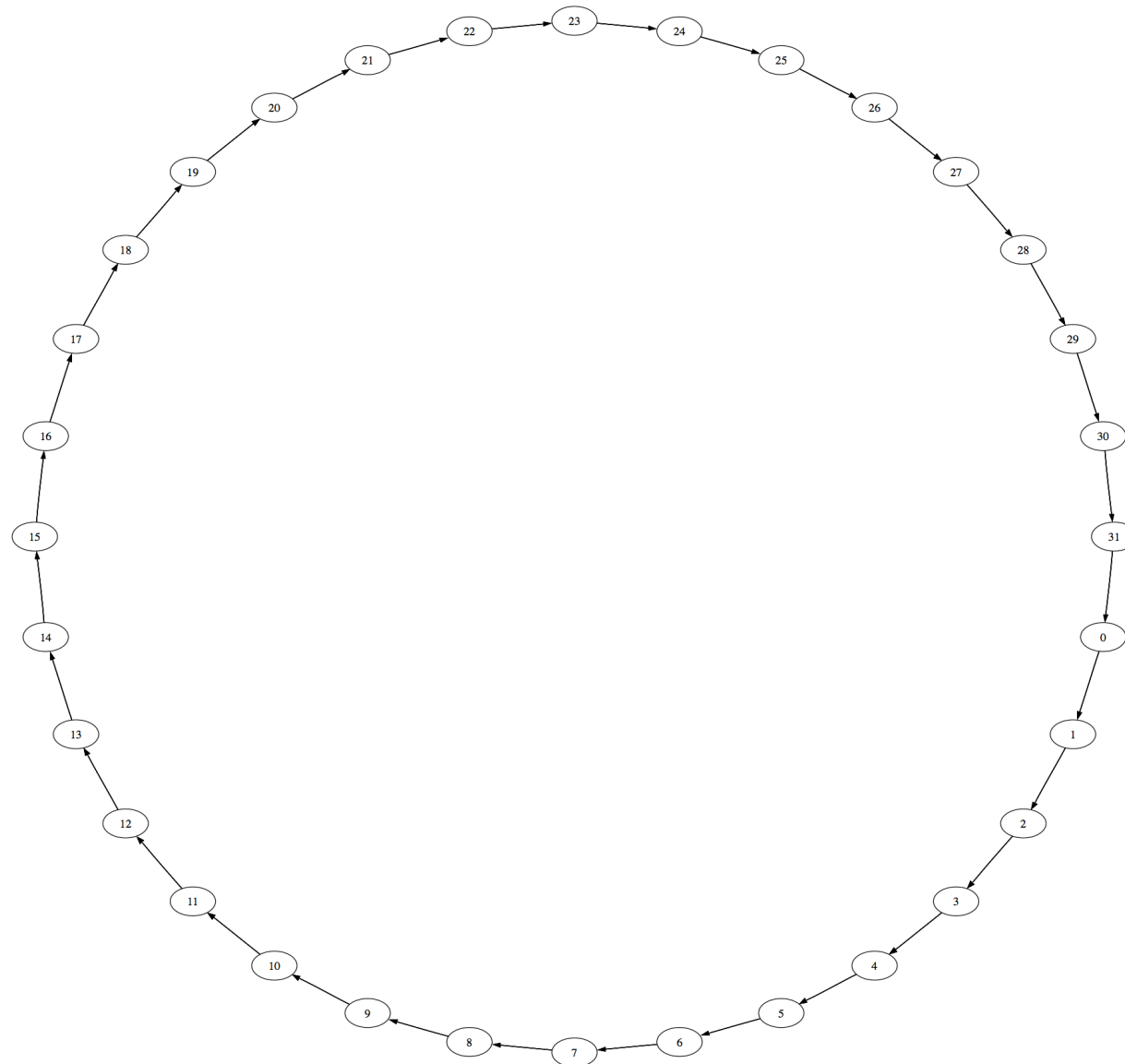
Start situation

**Parameter:**

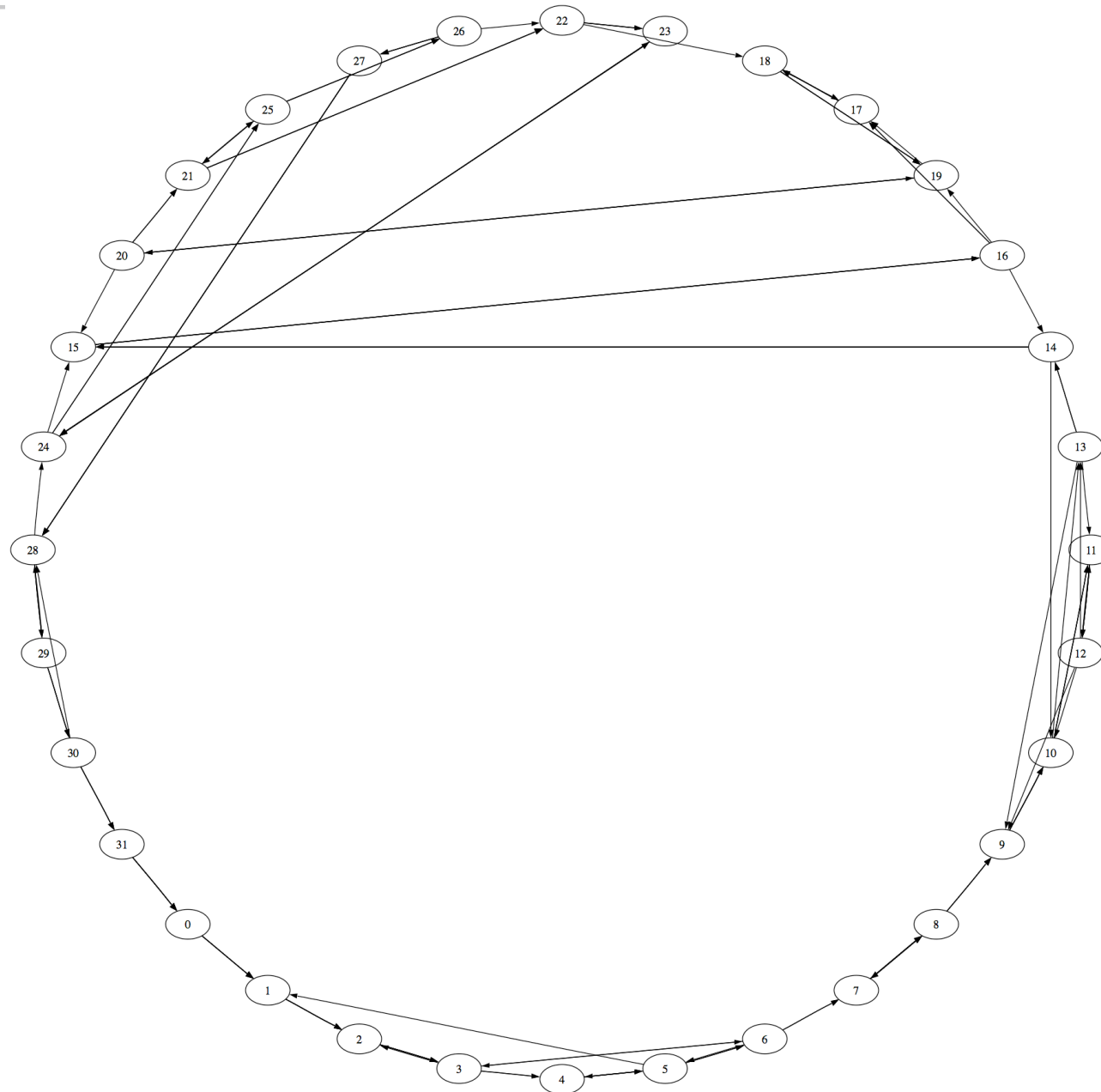
$n = 32$  nodes

outdegree  $d = 4$

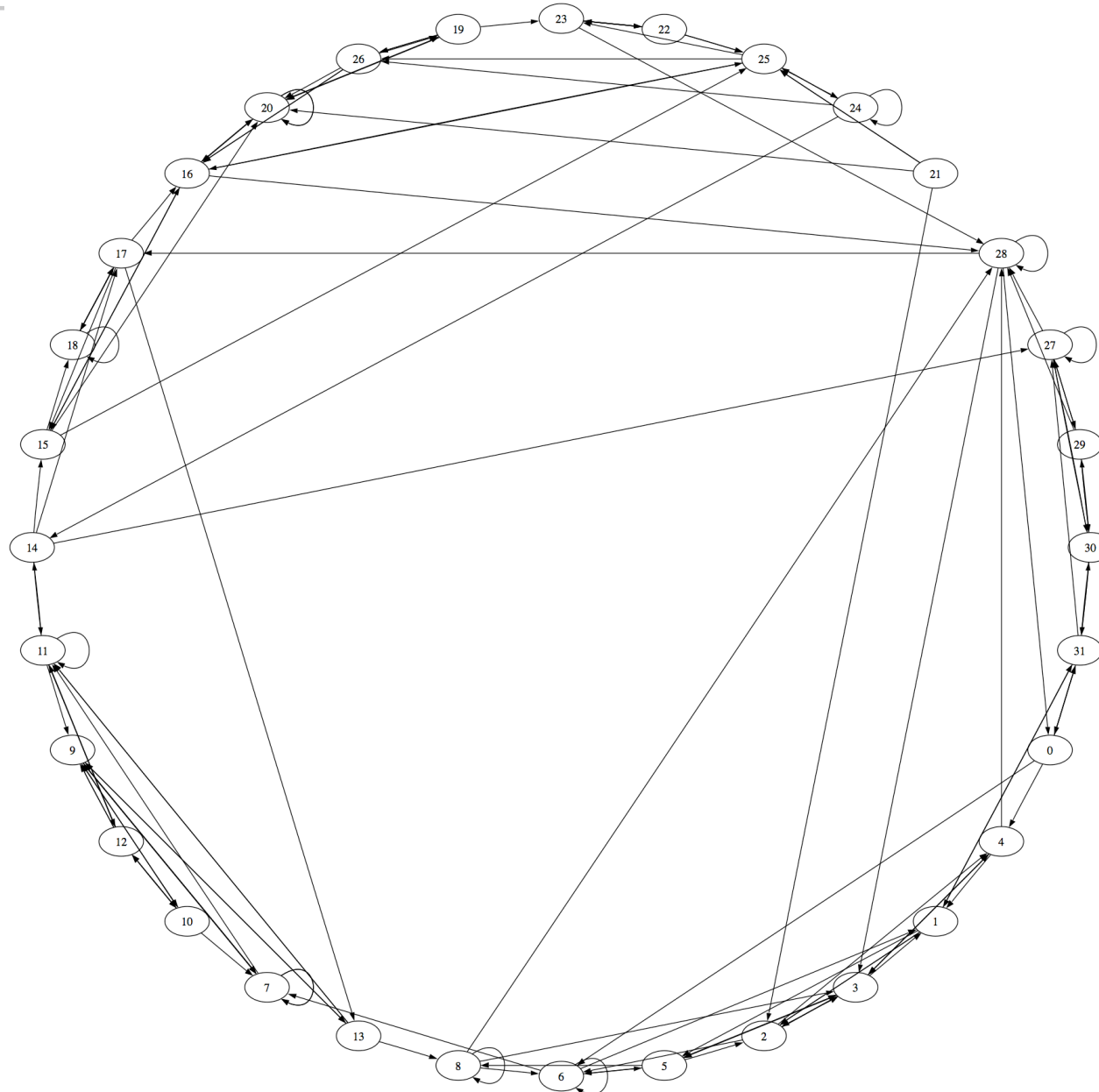
hop distance  $h = 3$



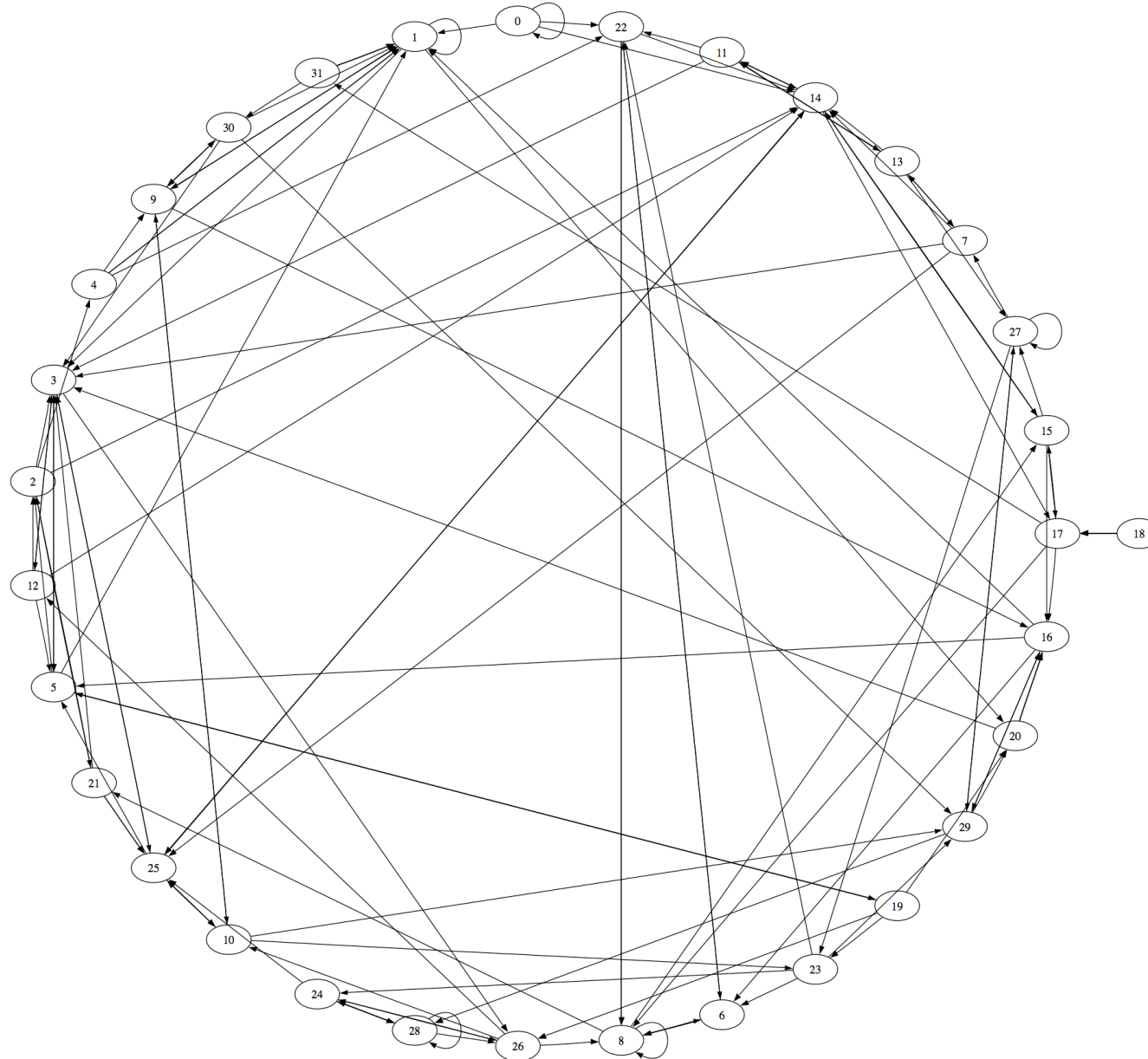
# 1 Iteration Pull ...



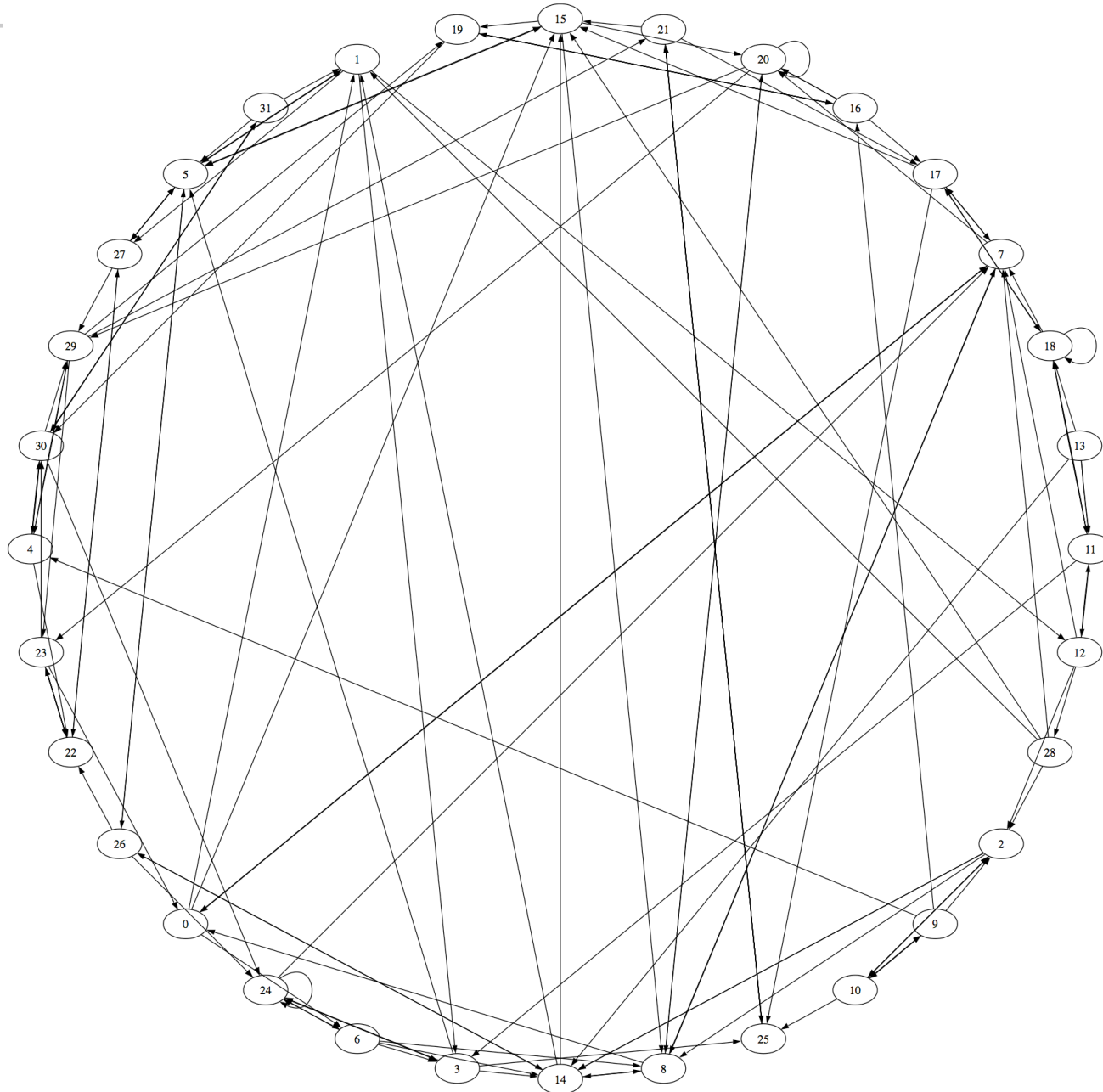
# 10 Iterations Pull ...



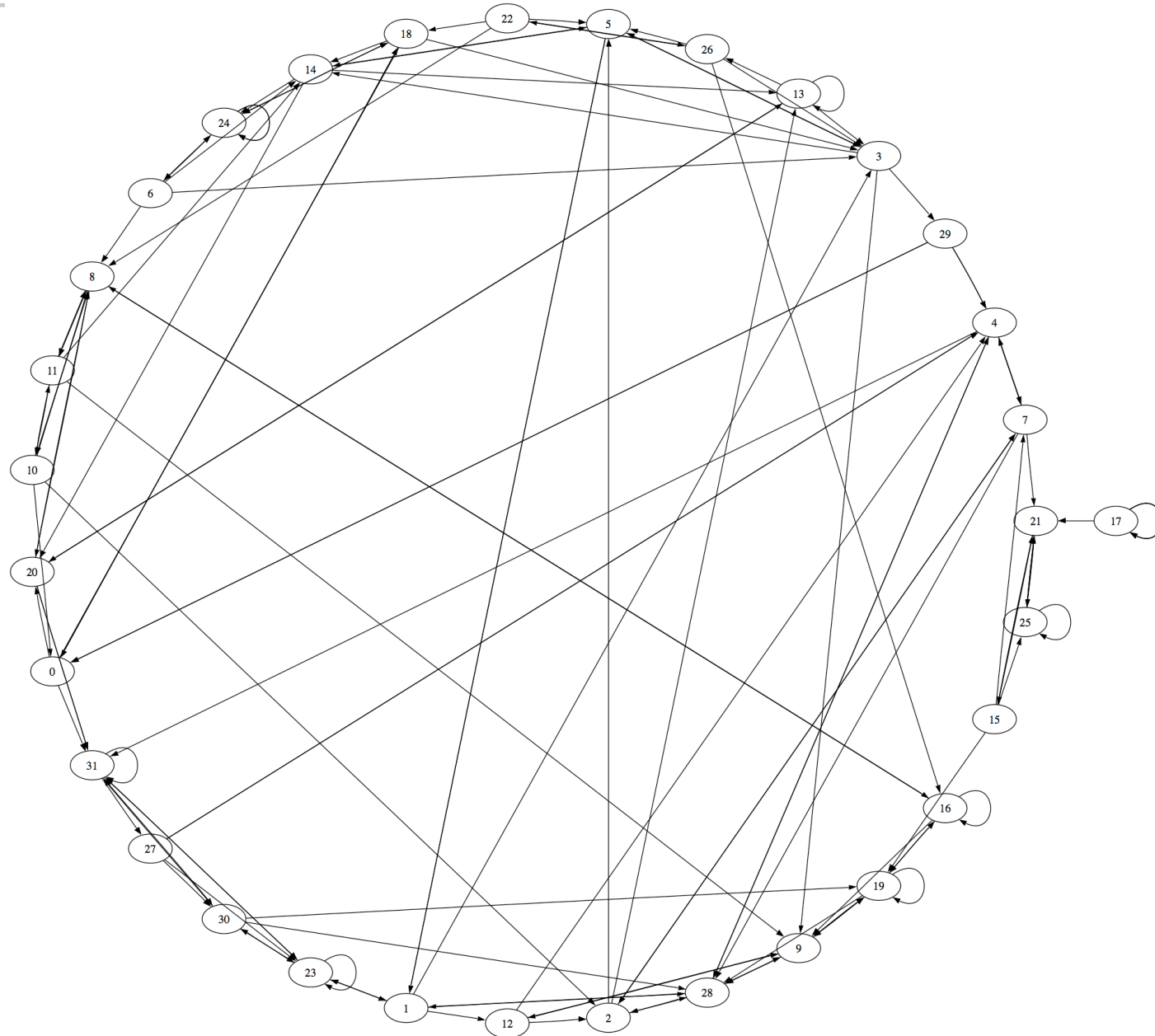
# 20 Iterations Pull ...



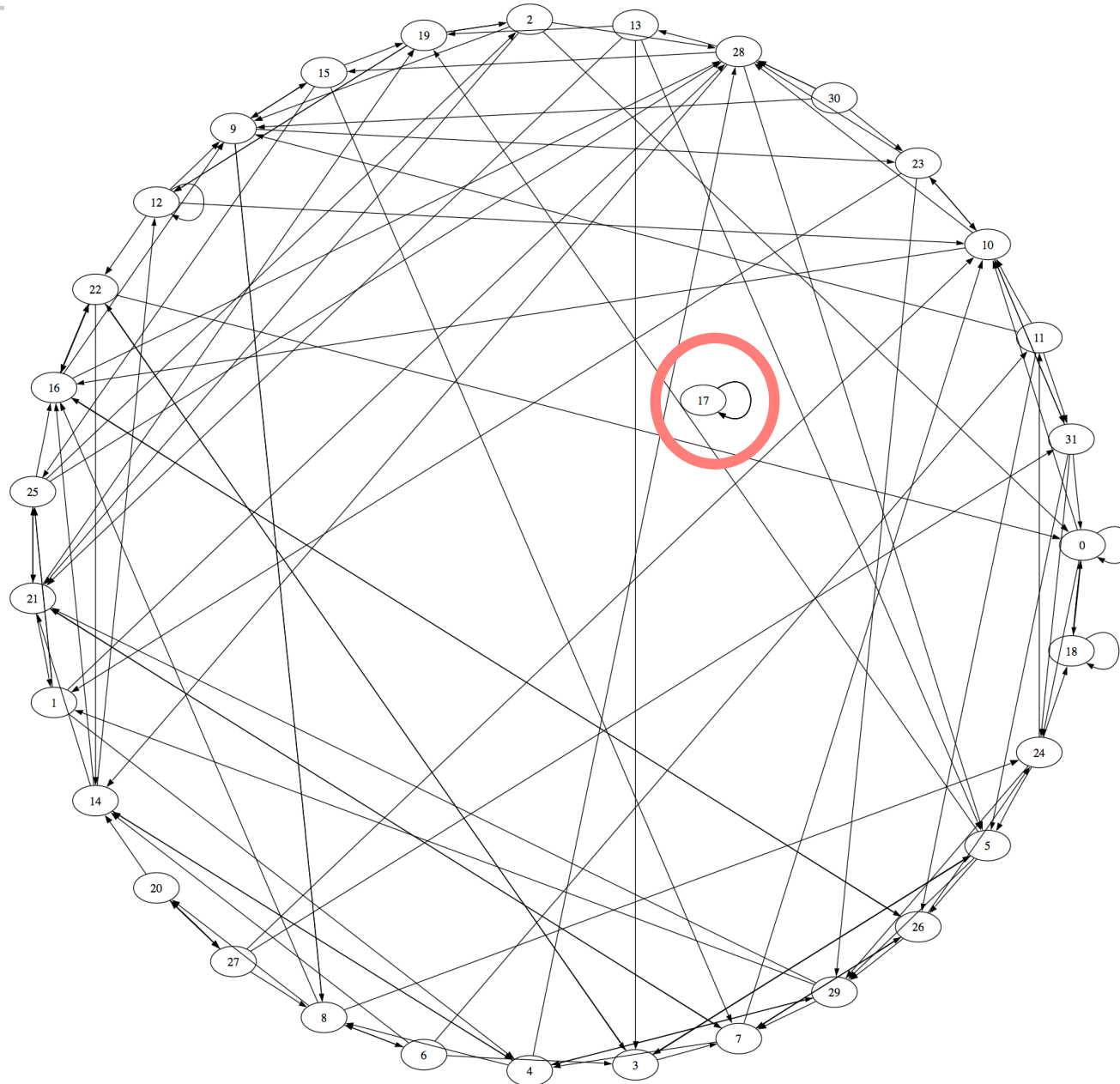
# 30 Iterations Pull ...



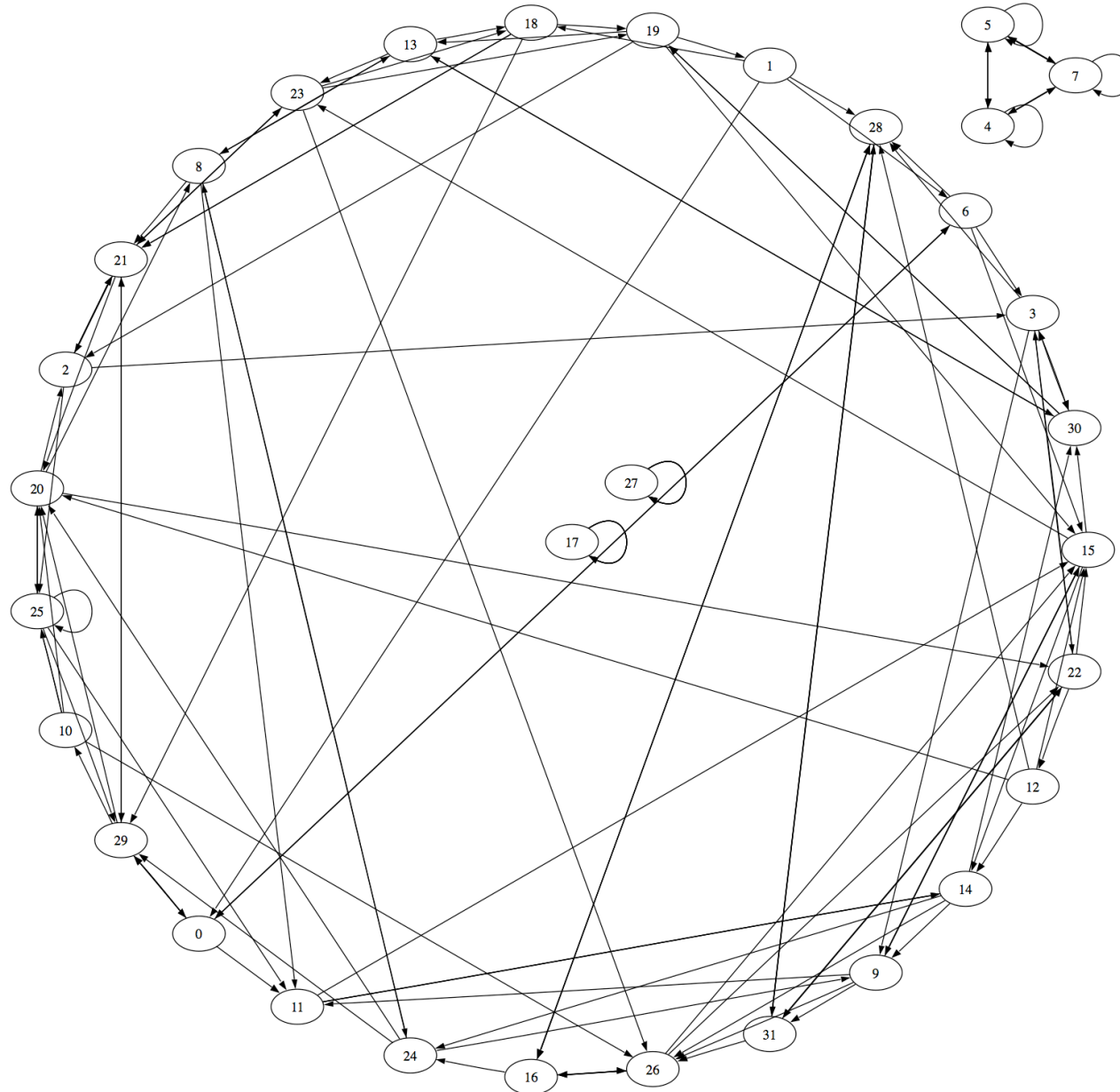
# 40 Iterationen Pull ...



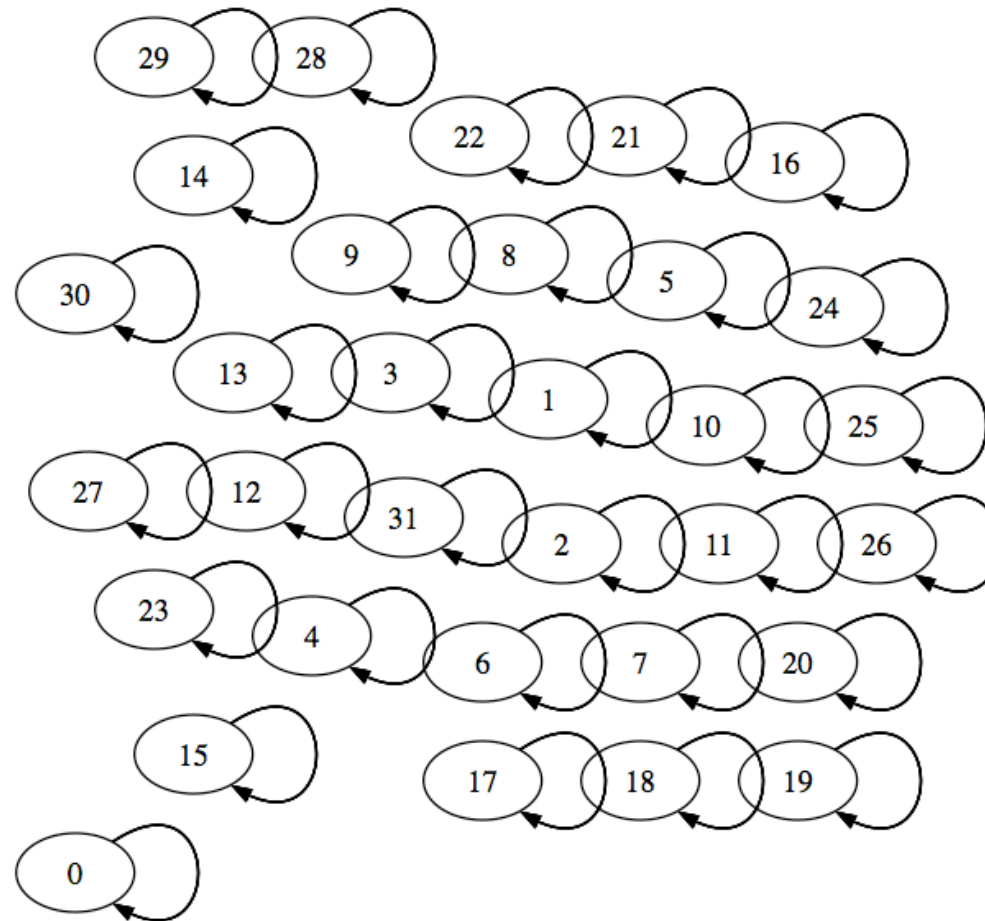
# 50 Iterations Pull ...



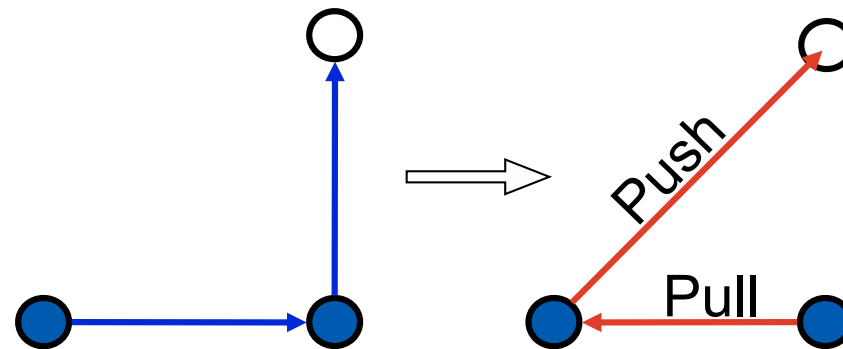
# 500 Iterations Pull ...



# 5000 Iterations Pull ...



# Combination of Push and Pull



# Simulation of Push&Pull-Operations ...

Same start situation

Parameters

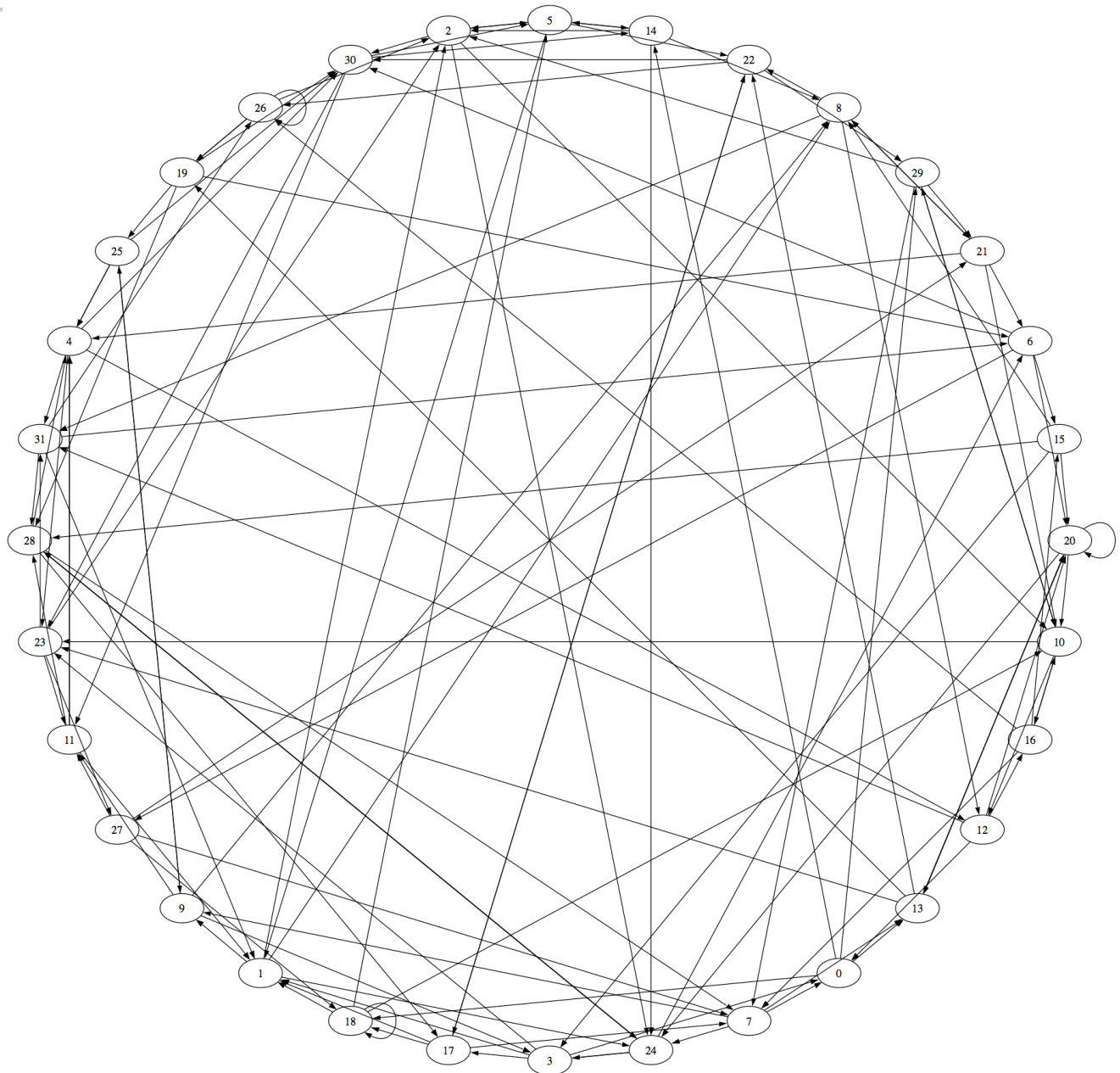
$n = 32$  nodes

degree  $d = 4$

hop-distance  $h = 3$

but

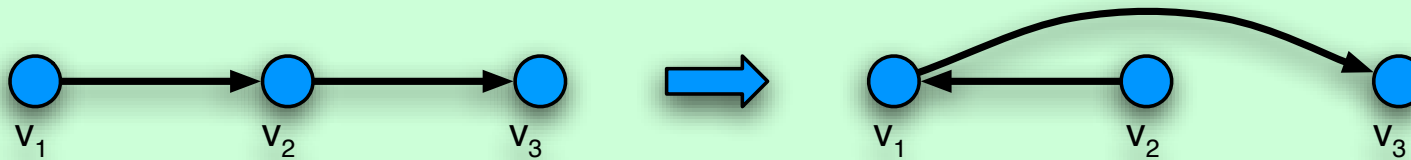
1.000.000 iterations



# Pointer-Push&Pull for Multi-Digraphs

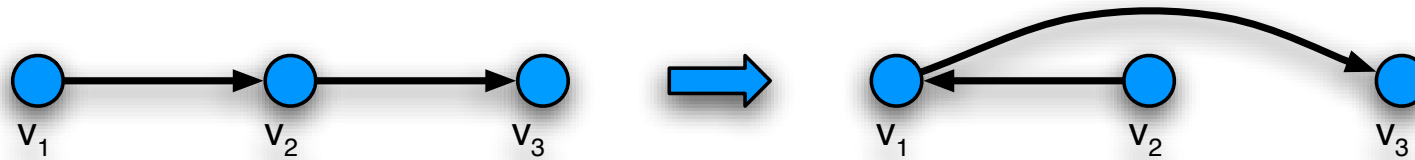
## *Pointer-Push&Pull:*

- choose random node  $v_1 \in V$
- do random walk  $v_1, v_2, v_3$
- delete edges  $(v_1, v_2)$  and  $(v_2, v_3)$
- add edges  $(v_2, v_1)$  and  $(v_1, v_3)$

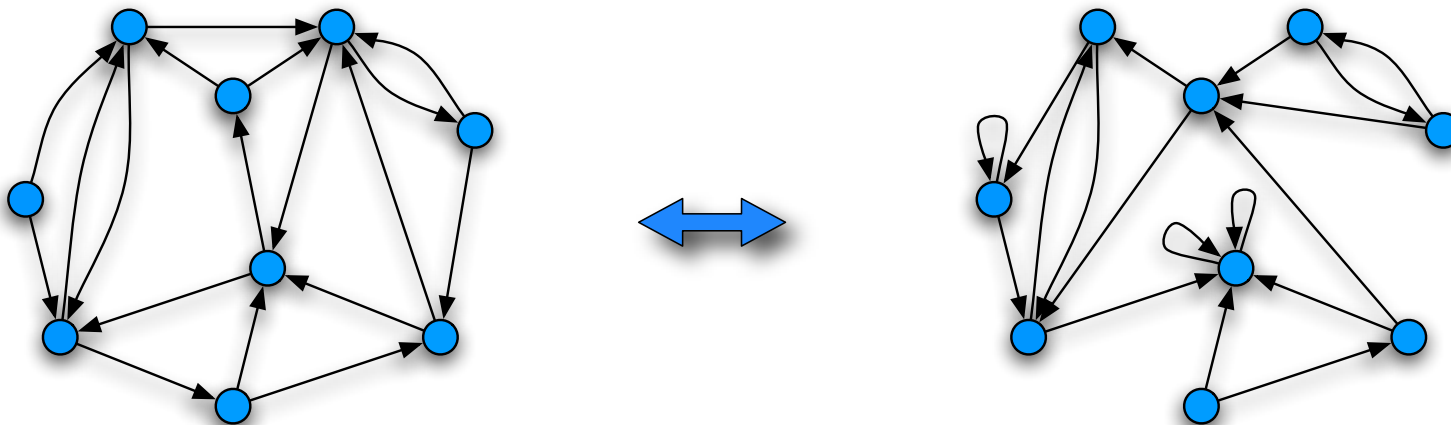


- obviously:
    - preserves connectivity of  $G$
    - does not change out-degrees
- ➔ Pointer-Push&Pull is **sound** for the domain of out-regular connected multi-digraphs

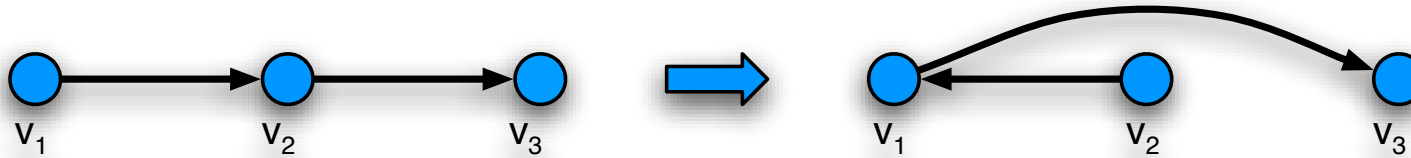
# Pointer-Push&Pull: Reachability



**Lemma** *A series of random Pointer-Push&Pull operations can transform an arbitrary connected out-regular multi-digraph, to every other graph within this domain*



# Pointer-Push&Pull: Uniformity



What is the stationary prob. distribution generated by Pointer-Push&Pull?

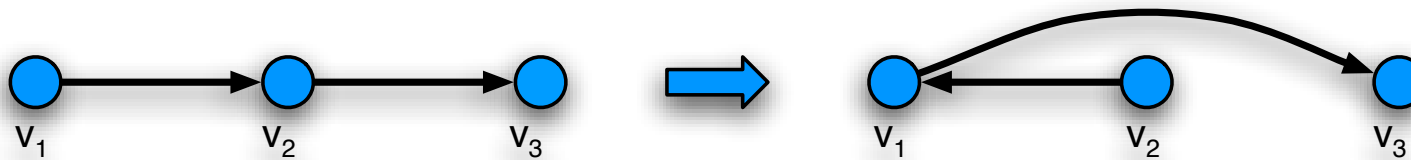
- depends on random walk

example: *node oriented random walk*

- choose random neighboring node with  $p=1/d$  respectively
- due to multi-edges possibly less than  $d$  neighbors
- if no node was chosen operation is canceled

$$P[G \xrightarrow{\mathcal{PP}} G'] = P[G' \xrightarrow{\mathcal{PP}} G]$$

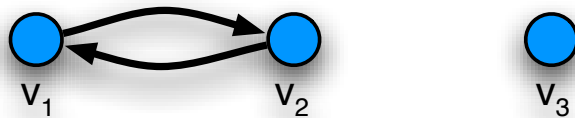
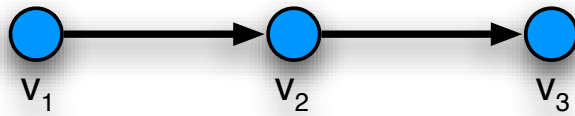
# Uniform Generality



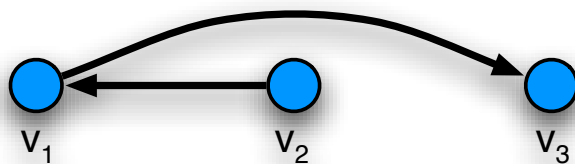
**Theorem:** Let  $G'$  be a  $d$ -out-regular connected multi-digraph with  $n$  nodes. Applying *Pointer-Push&Pull* operations repeatedly will construct every  $d$ -out-regular connected multi-digraph with the same probability in the limit, i.e.

$$\lim_{t \rightarrow \infty} P[G' \xrightarrow{t} G] = \frac{1}{|\mathcal{MDG}_{n,d}|}$$

## A Pointer-Push&Pull operation in the network ...



(2)  $v_2$  replaces  $(v_2, v_3)$  by  $(v_2, v_1)$  and sends ID of  $v_3$  to  $v_1$



- only 2 messages between two nodes, carrying the information of one edge only
- verification of neighborhood is mandatory in dynamic networks

⇒ **combine neighbor-check with Pointer-Push&Pull**

# Properties of Pointer-Push&Pull

Pointer-Push&Pull	
Graphs	Directed Multigraphs
Soundness	✓
Generality	✓
Feasibility	✓
Convergence	?

- strength of Pointer-Push&Pull is its **simplicity**
- generates truly random digraphs
- the price you have to pay: multi-edges

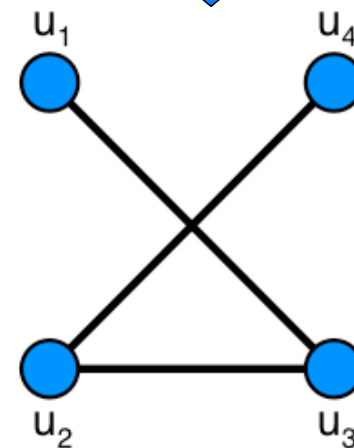
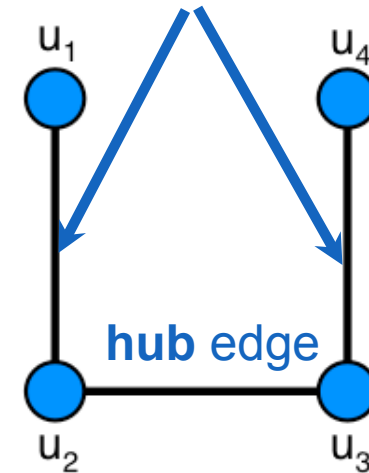
## Open Problems:

- convergence rate is unknown, conjecture  $O(dn \log n)$
- is there a similar operation for simple digraphs?

# The 1-Flipper (F1)

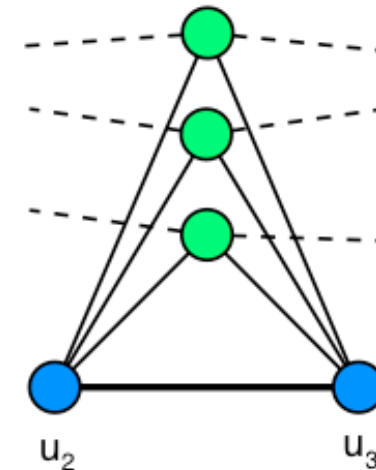
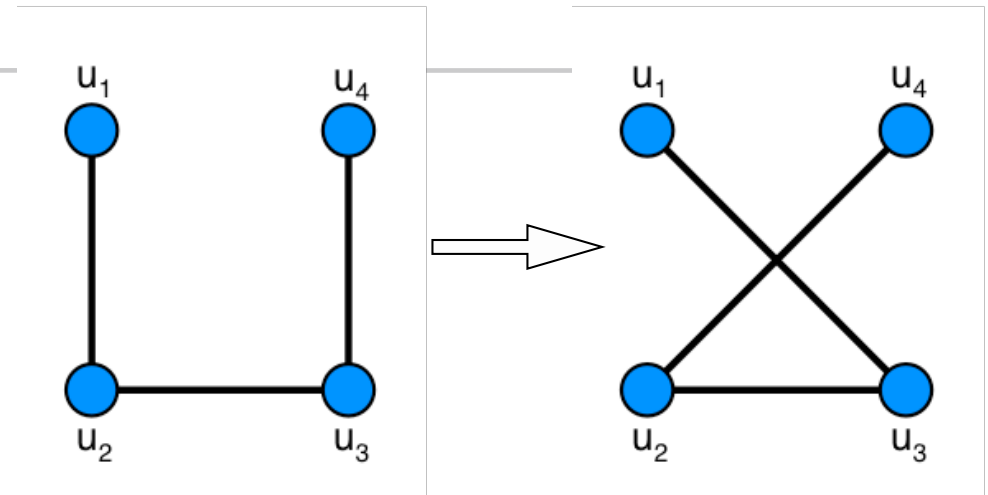
- The operation
  - choose random edge  $\{u_2, u_3\} \in E$ ,
    - hub edge
  - choose random node  $u_1 \in N(u_2)$ 
    - 1st flipping edge
  - choose random node  $u_4 \in N(u_3)$ 
    - 2nd flipping edge
  - if  $\{u_1, u_3\}, \{u_2, u_4\} \notin E$ 
    - flip edges, i.e.
    - add edges  $\{u_1, u_3\}, \{u_2, u_4\}$  to  $E$
    - remove  $\{u_1, u_2\}$  and  $\{u_3, u_4\}$  from  $E$

flipping edges



# 1-Flipper is sound

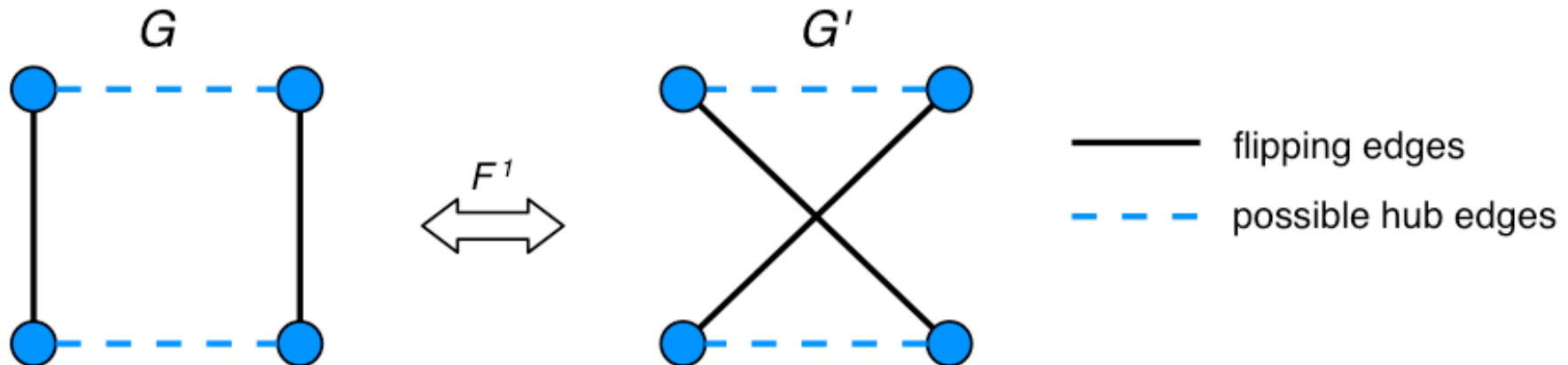
- Soundness:
  - 1-Flipper preserves  $d$ -regularity
    - follows from the definition
  - 1-Flipper preserves connectivity
    - because of the hub edge
- Observation:
  - For all  $d > 2$  there is a connected  $d$ -regular graph  $G$  such that  $P[G \xrightarrow{F^1} G] \neq 0$
  - For all  $d \geq 2$  and for all  $d$ -regular connected graphs at least one 1-Flipper-operation changes the graph with positive probability
    - This does not imply generality



# 1-Flipper is symmetric

- Lemma (symmetry):
  - For all undirected regular graphs  $G, G'$ :

$$P[G \xrightarrow{F^1} G'] = P[G' \xrightarrow{F^1} G]$$



# 1-Flipper provides generality

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- Lemma (reachability):
  - For all pairs  $G, G'$  of connected  $d$ -regular graphs there exists a sequence of 1-Flipper operations transforming  $G$  into  $G'$ .

# 1-Flipper properties: uniformity

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- Theorem (uniformity):
  - Let  $G_0$  be a  $d$ -regular connected graph with  $n$  nodes and  $d > 2$ . Then in the limit the 1-Flipper operation constructs all connected  $d$ -regular graphs with the same probability:

$$\lim_{t \rightarrow \infty} P[G_0 \xrightarrow{t} G] = \frac{1}{|\mathcal{C}_{n,d}|}$$

# 1-Flipper properties: Expansion

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- Definition (edge boundary):
  - The edge boundary  $\delta S$  of a set  $S \subset V$  is the set of edges with exactly one endpoint in  $S$ .
  
- Definition (expansion):

A graph  $G=(V,E)$  has expansion  $\beta > 0$

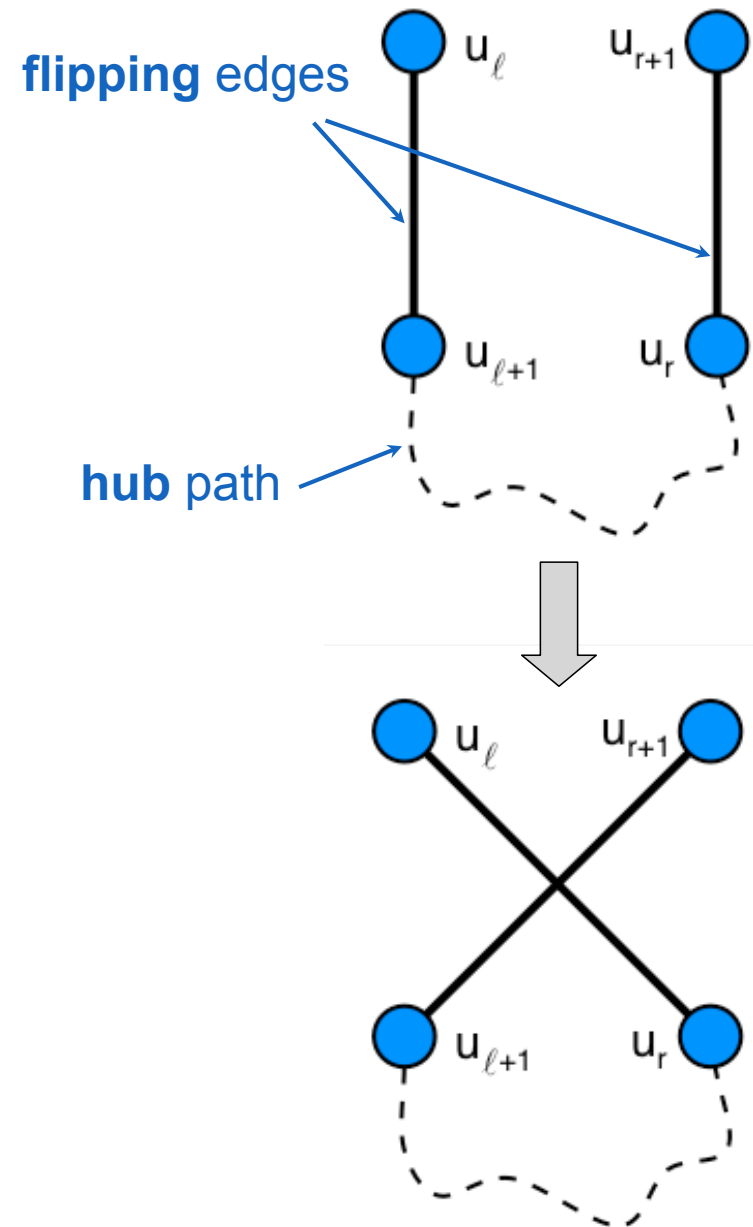
  - if for all node sets  $S$  with  $|S| \leq |V|/2$ :
  - $|\delta S| \geq \beta |S|$
  
- Since for  $d \in \omega(1)$  a random connected  $d$ -regular graph is a  $\theta(d)$  expander asymptotically almost surely (a.a.s: in the limit with probability 1), we have
  
- Theorem:
  - For  $d > 2$  consider any  $d$ -regular connected Graph  $G_0$ . Then in the limit the 1-Flipper operation establishes an expander graph after a sufficiently large number of applications a.a.s.

Flipper	
Graphs	Undirected Graphs
Soundness	✓
Generality	✓
Feasibility	✓
Convergence	?

- ▶ Flipper involves 4 nodes
- ▶ Generates truly random graphs
- ▶ Open Problems:
  - convergence rate is unknown, conjecture  $O(dn \log n)$

# The k-Flipper (Fk)

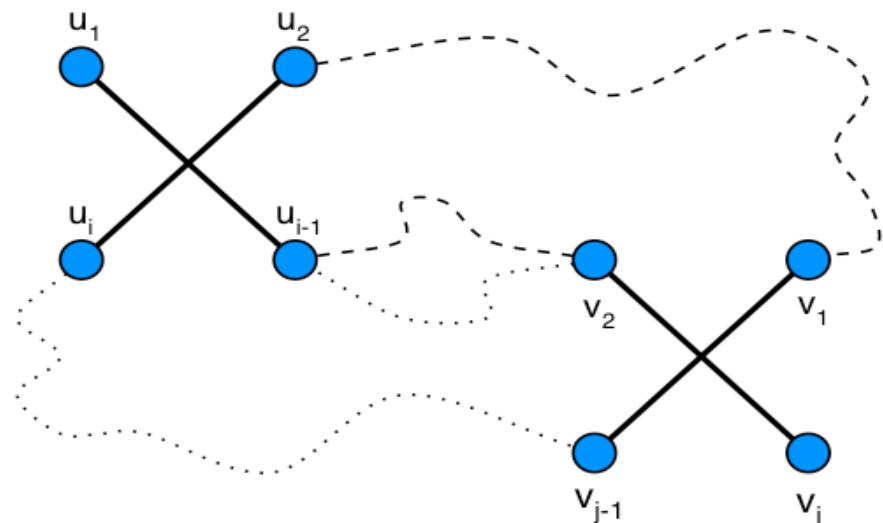
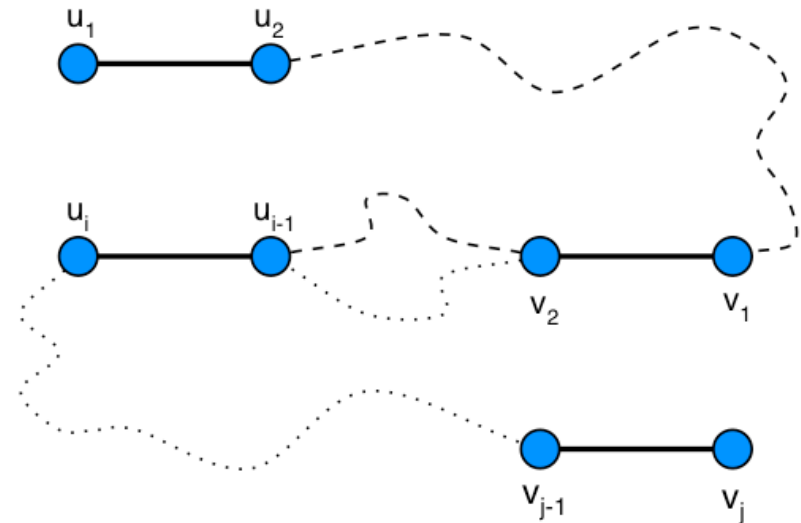
- The operation
  - choose random node
  - random walk  $P'$  in  $G$
  - choose hub path with nodes
    - $\{u_l, u_r\}, \{u_{l+1}, u_{r+1}\}$  occur only once in  $P'$
  - if  $\{u_l, u_r\}, \{u_{l+1}, u_{r+1}\} \notin E$ 
    - add edges  $\{u_l, u_r\}, \{u_{l+1}, u_{r+1}\}$  to  $E$
    - remove  $\{u_l, u_{l+1}\}$  and  $\{u_r, u_{r+1}\}$  from  $E$



- k-Flipper preserves connectivity and d-regularity
  - proof analogously to the 1-Flipper
- k-Flipper provides reachable,
  - since the 1-Flipper provides reachability
  - k-Flipper can emulate 1-Flipper
- But: k-Flipper is not symmetric:
  - a new proof for expansion property is needed

# Concurrency ...

- In a P2P-network there are concurrent Flipper operations
  - No central coordination
  - Concurrent Flipper operations can speed up the convergence process
  - However concurrent Flipper operations can disconnect the network



# k-Flipper

	k-Flipper large k	k-Flipper small k
Graphs	Undirected Graphs	Undirected Graphs
Soundness	✓	✓
Generality	✓	✓
Feasibility	<	✓
Convergence	✓	?

- Convergence only proven for too long paths
  - Operation is not feasible then.
  - Does k-Flipper quickly converge for small k?
- Open problem:
  - Which k is optimal?

# All Graph Transformation

	Simple-Switching	Flipper	Pointer-Push&Pull	k-Flipper small k	k-Flipper large k
Graphs	Undirected Graphs	Undirected Graphs	Directed Multigraphs	Undirected Graphs	Undirected Graphs
Soundness	?	✓	✓	✓	✓
Generality	↪	✓	✓	✓	✓
Feasibility	✓	✓	✓	✓	↪
Convergence	✓	?	?	?	✓

## Open Problems

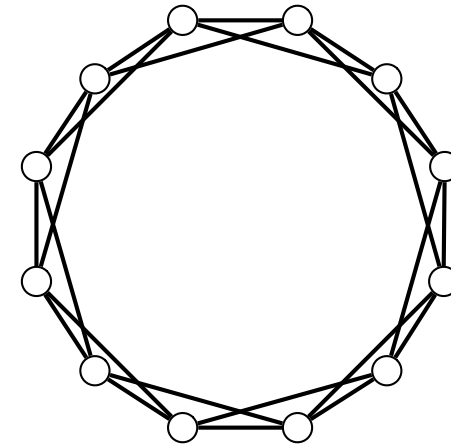
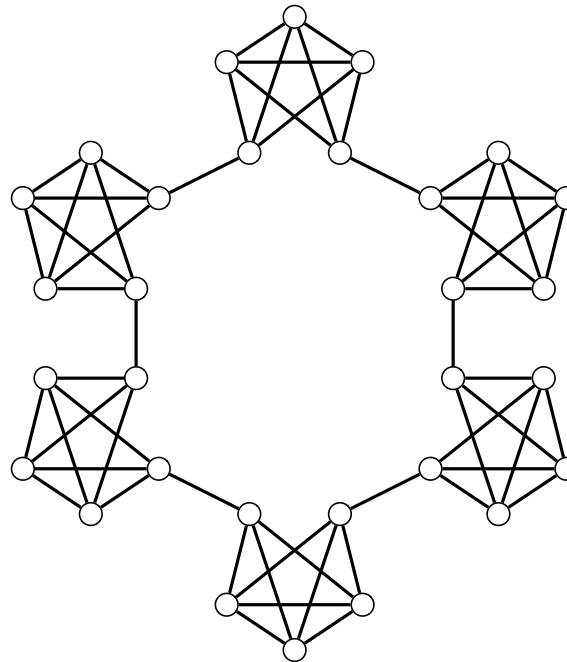
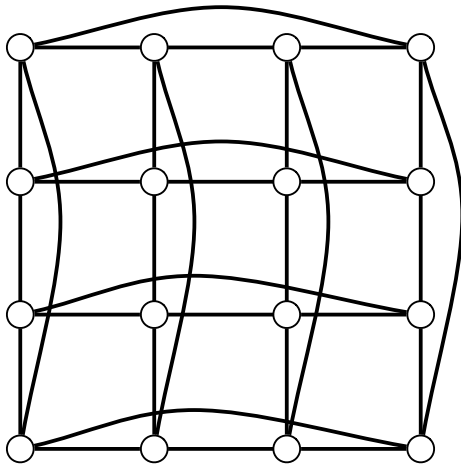
- Conjecture: Flipper converges in after  $O(dn \log n)$  operations to a truly random graph
- Conjecture: k-Flipper converges faster, but involves more nodes and flags
- Conjecture: k-Flipper does not pay out

## Empirical Simulations

- Estimate expansion by eigenvalue gap
- Estimate eigenvalue gap by iterated multiplication of a start vector

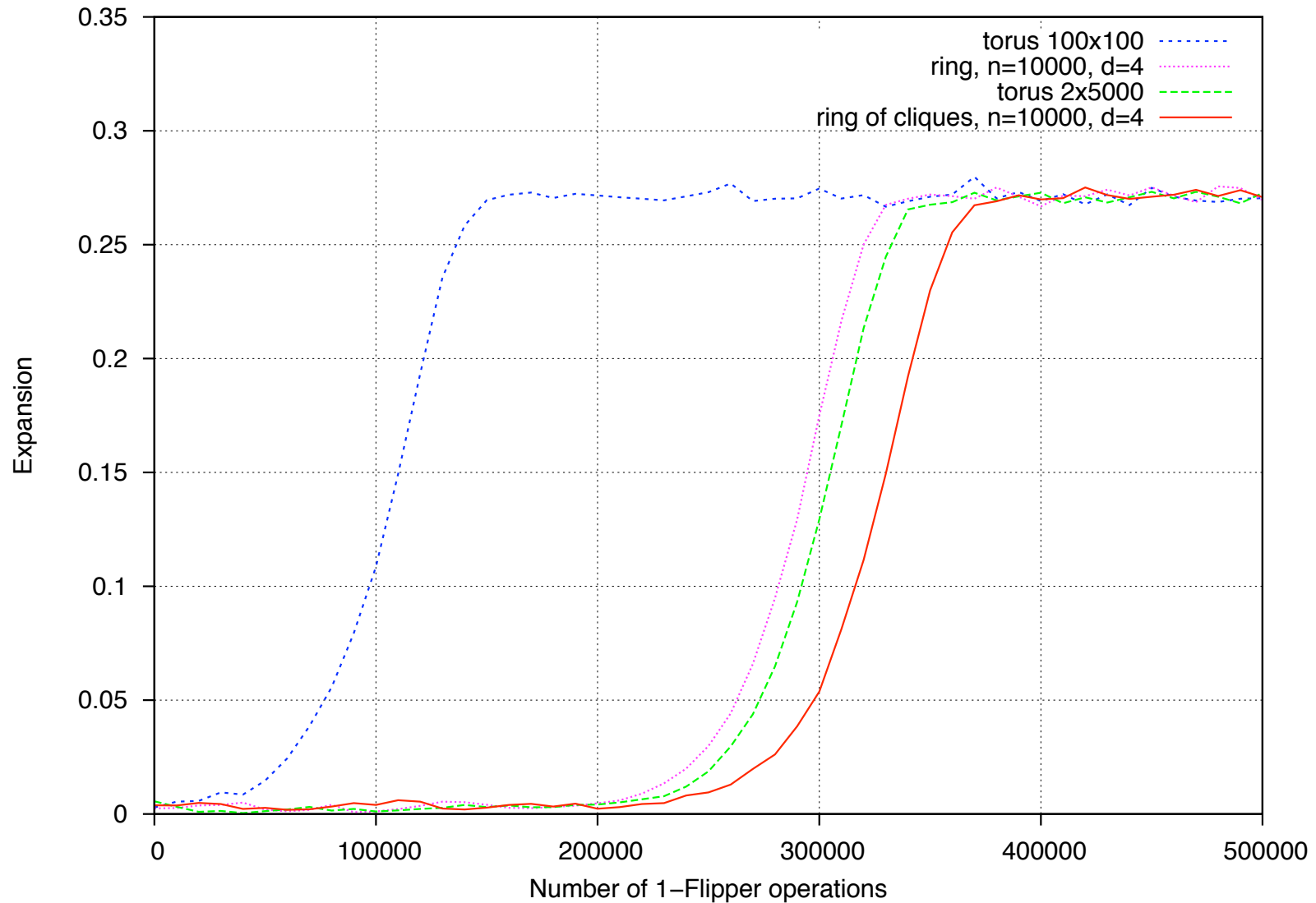
# Start Graphs

- Ring with neighbor edges
- Torus
- Ring of cliques

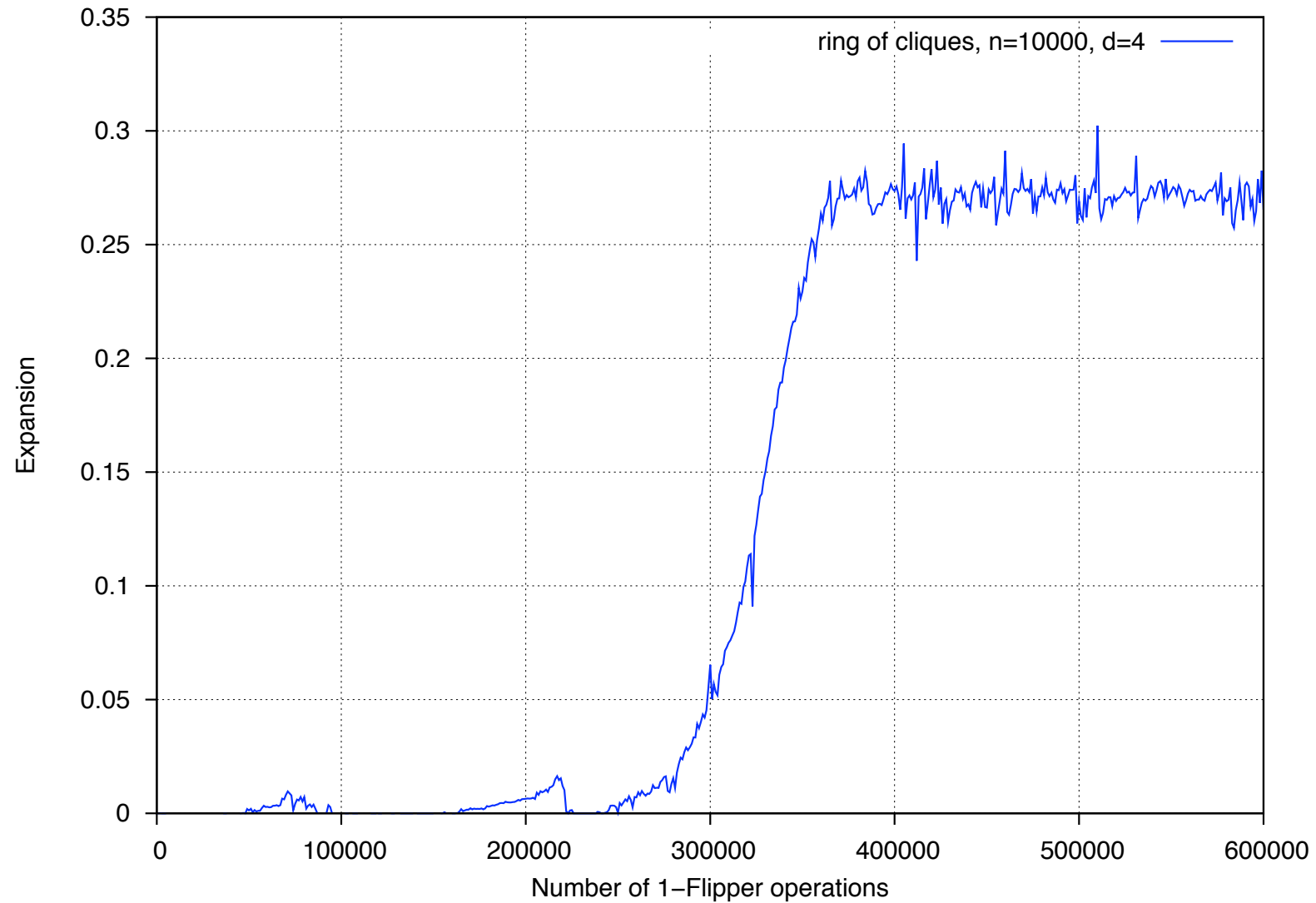


# Flipper

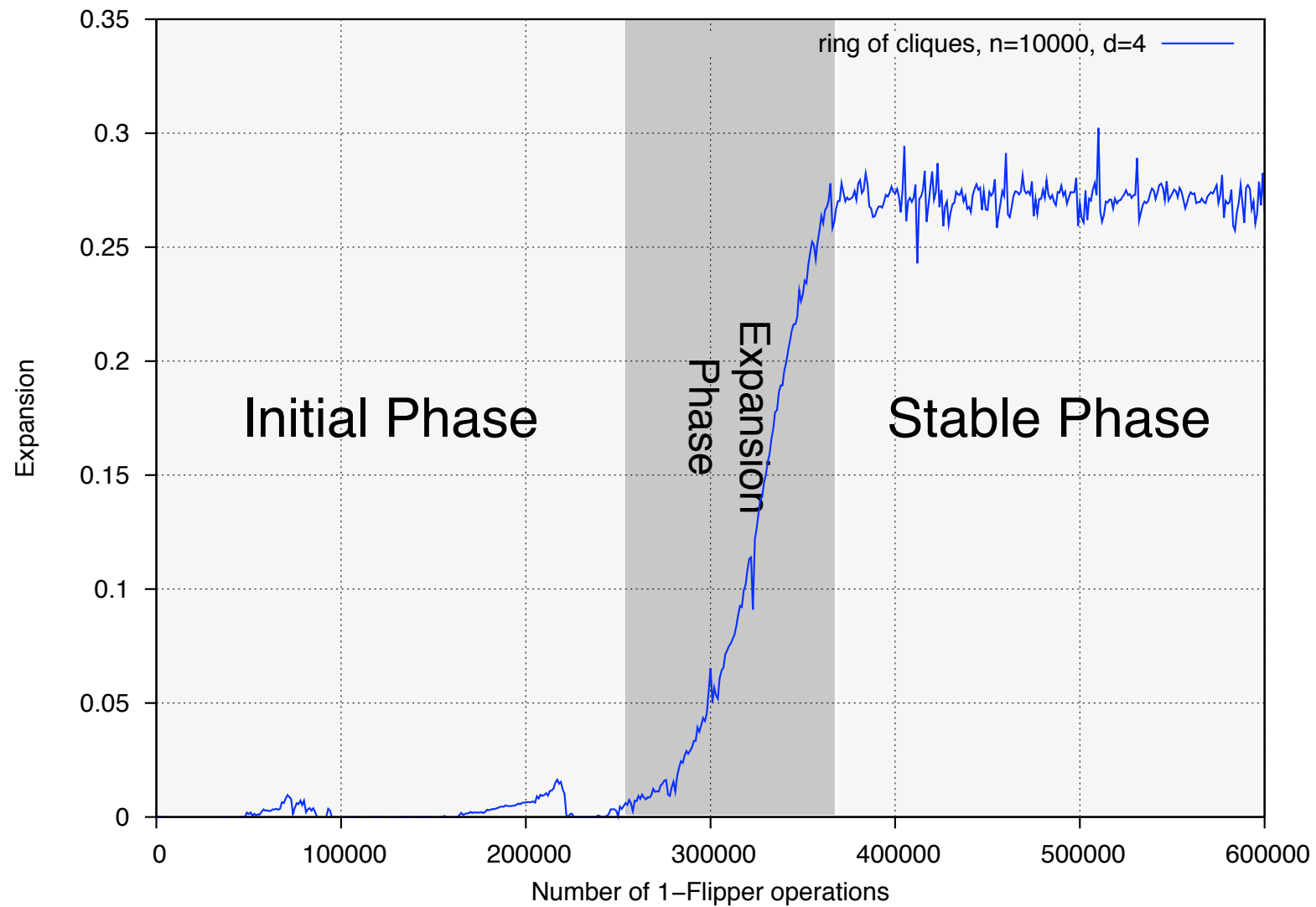
## Influence of the Start Graph



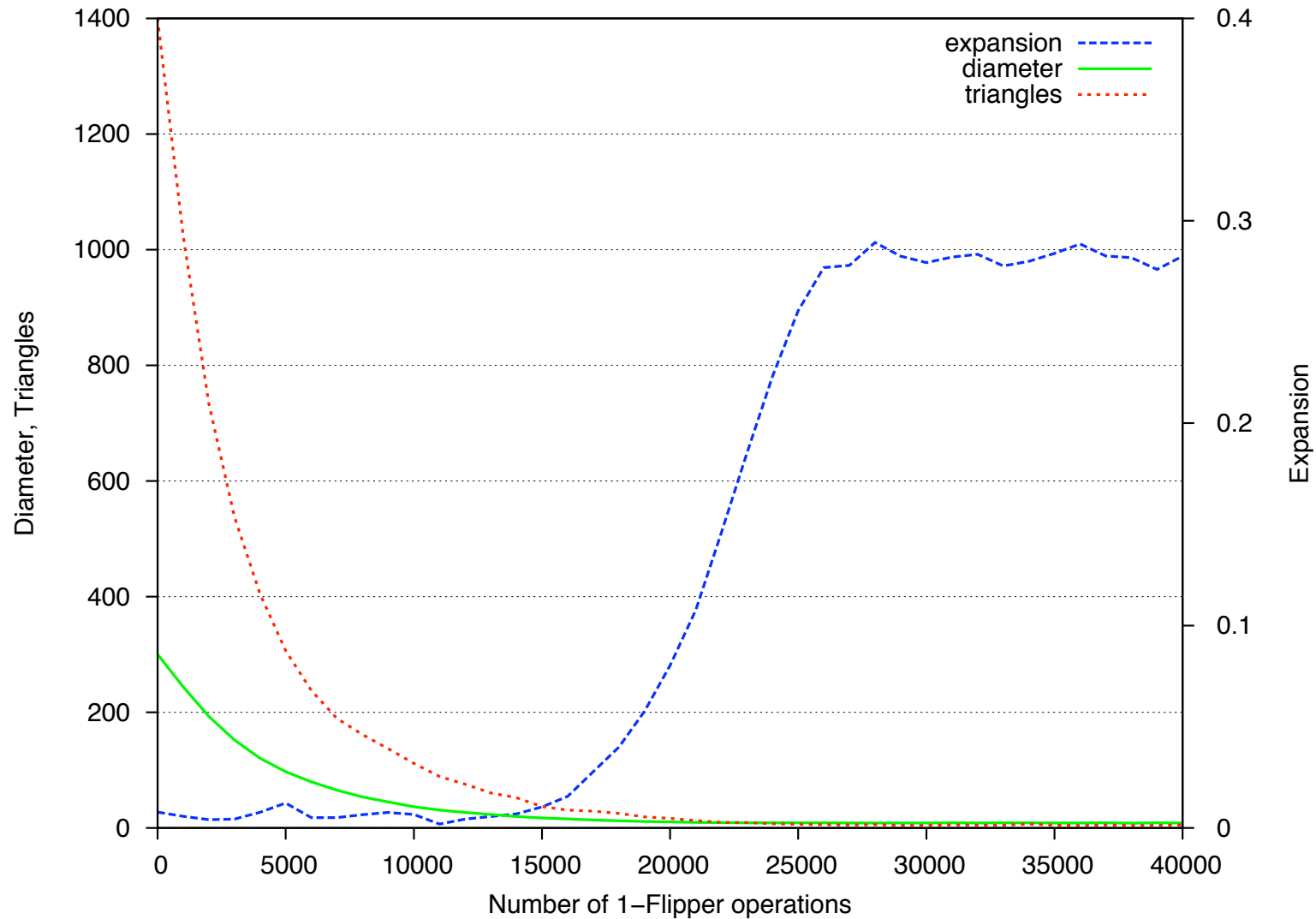
# Development of Expansion



# Development of Expansion

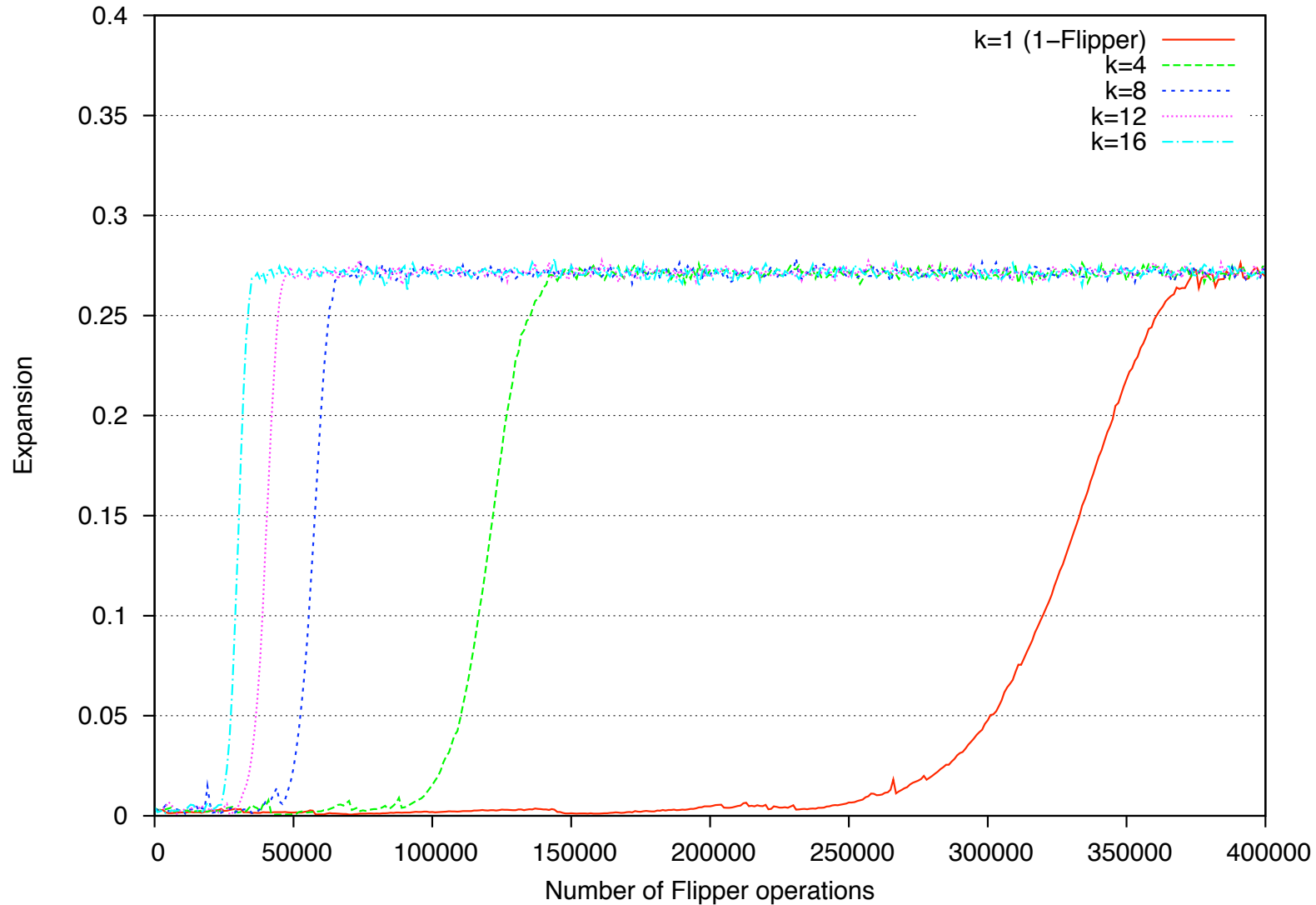


# Expansion, Diameter & Triangles



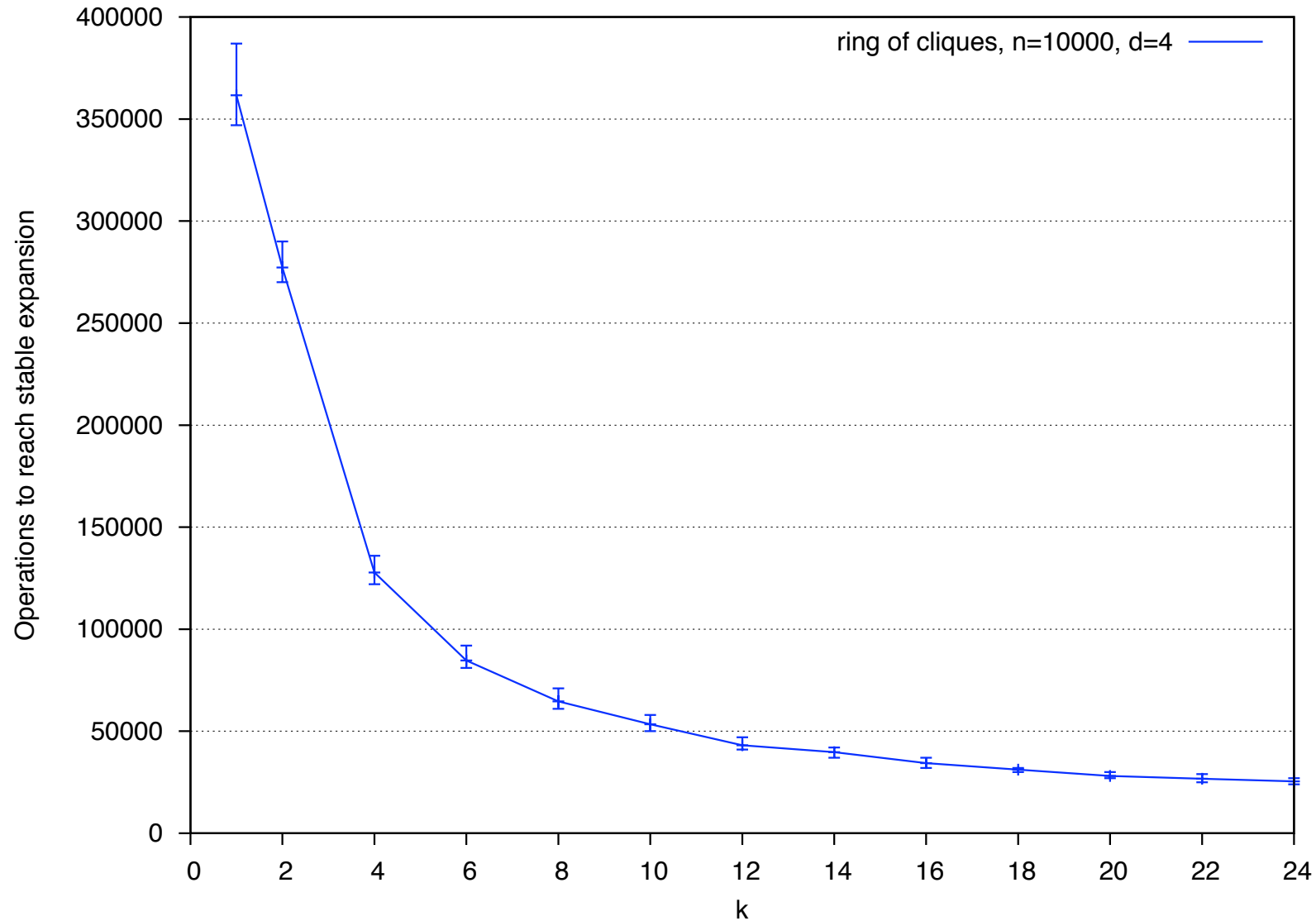
# k-Flipper

## Start Graph: Ring of Cliques

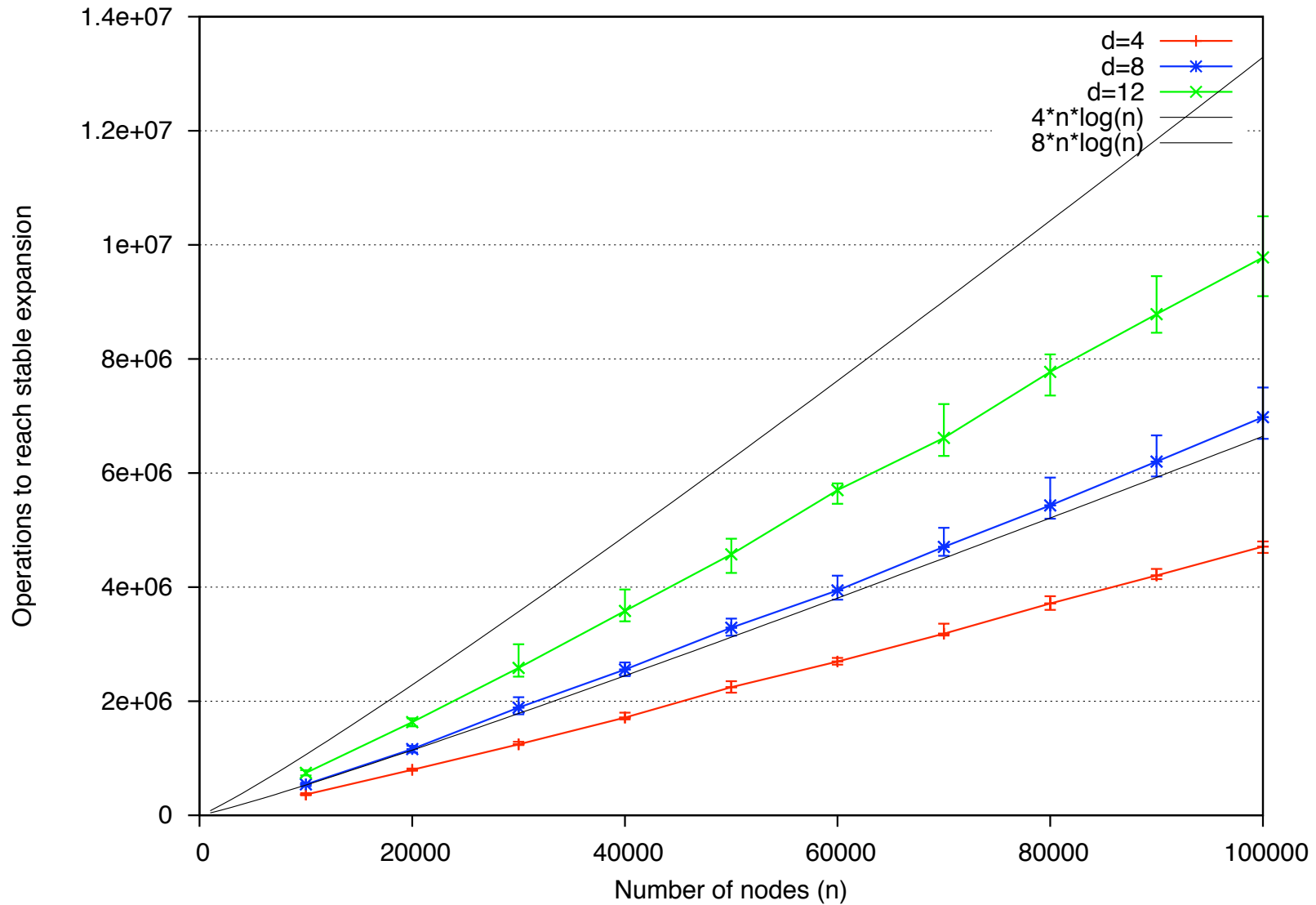


# k-Flipper

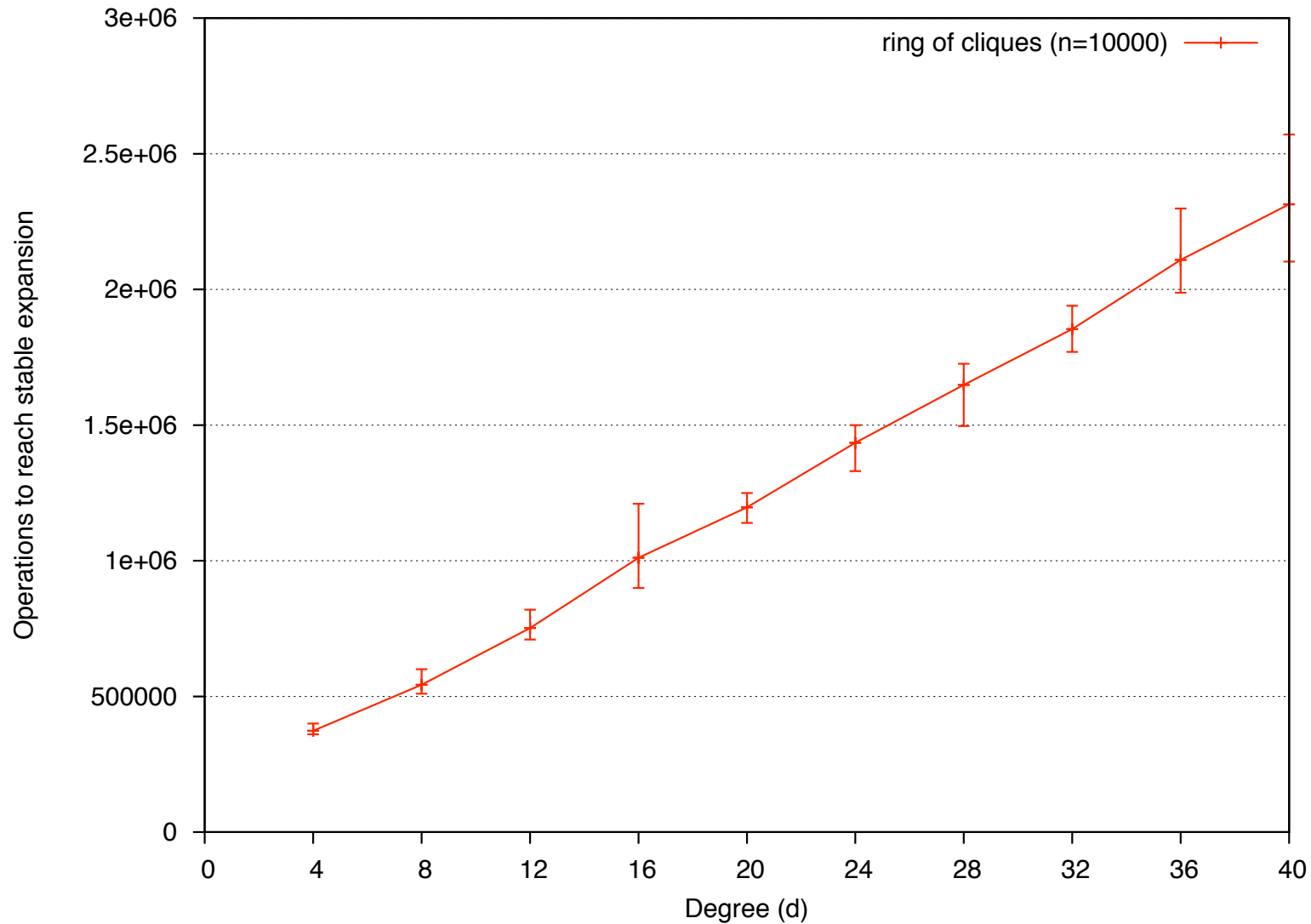
## Start Graph: Ring of Cliques



# Convergence of Flipper



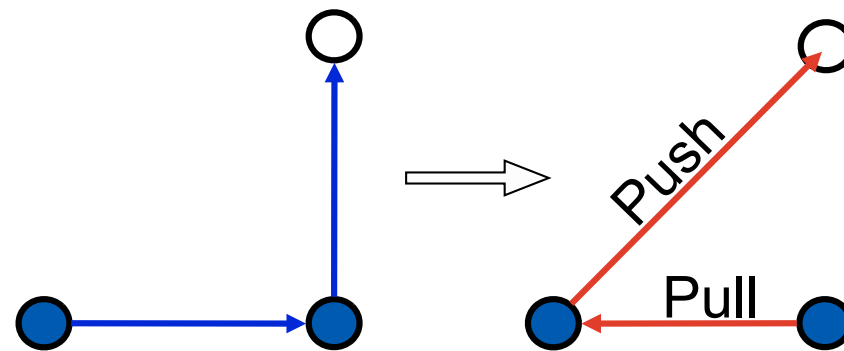
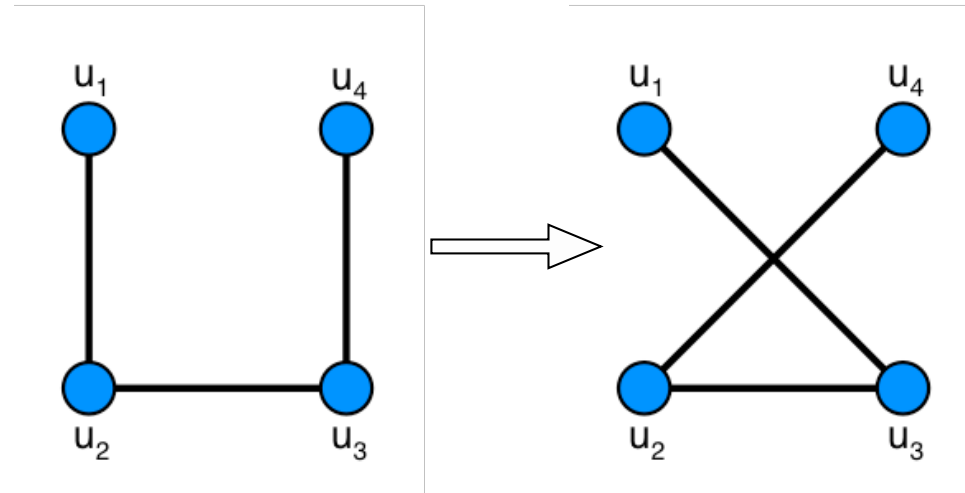
# Convergence of Flipper Varying Degree



# All Graph Transformation

	Simple-Switching	Flipper	Pointer-Push&Pull	k-Flipper small k	k-Flipper large k
Graphs	Undirected Graphs	Undirected Graphs	Directed Multigraphs	Undirected Graphs	Undirected Graphs
Soundness	?	✓	✓	✓	✓
Generality	<	✓	✓	✓	✓
Feasibility	✓	✓	✓	✓	<
Convergence	✓	✓	?	✓	✓

# Good Peer-to-Peer-Operations



# Peer-to-Peer Networks

## 10 Random Graphs for Peer-to-Peer-Networks

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