



# Peer-to-Peer Networks

## 08 Kelips and Epidemic Algorithms

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  - Cornell University, Ithaca, New York
- Kelip-kelip
  - malay name for synchronizing fireflies
- P2P Network
  - uses DHT
  - constant lookup time
  - $O(n^{1/2})$  storage size
  - fast and robust update

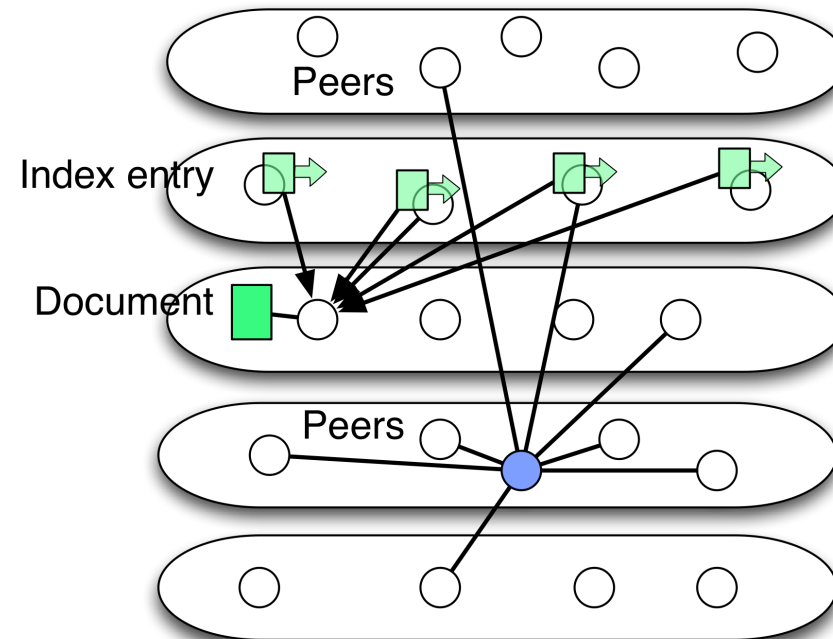


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# Kelips Overview

- Peers are organized in  $k$  affinity groups
  - peer position chosen by DHT mechanism
  - $k$  is chosen as  $n^{1/2}$  for  $n$  peers
- Data is mapped to an affinity group using DHT
  - all members of an affinity group store all data
- Routing Table
  - each peer knows all members of the affinity group
  - each peer knows at least one member of each affinity group
- Updates
  - are performed by epidemic algorithms

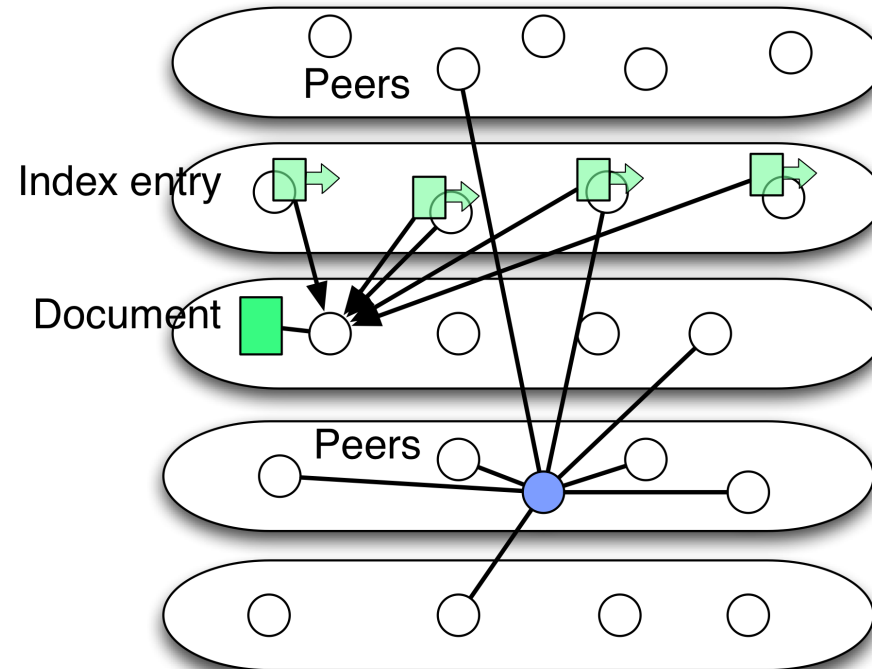
Affinity Groups



# Routing Table

- Affinity Group View
  - Links to all  $O(n/k)$  group members
  - This set can be reduced to a partial set as long as the update mechanism works
- Contacts
  - For each of the other affinity group a small (constant-sized) set of nodes
  - $O(k)$  links
- Filetuples
  - A (partial) set of tuples, each detailing a file name and host IP address of the node storing the file
  - $O(F/k)$  entries, if  $F$  is the overall number of files
- Memory Usage:  $O(n/k + k + F/k)$ 
  - for  $k = O(\sqrt{n + F})$

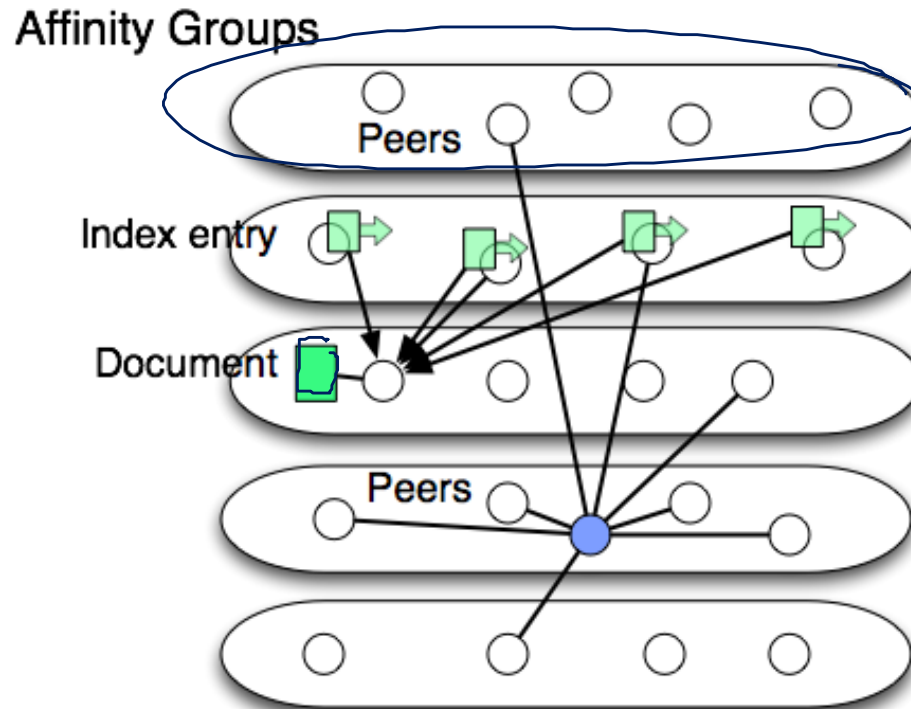
## Affinity Groups



$$O(\sqrt{n + F})$$

$n$        $\sqrt{n}$   
 100      10  
 10,000      100

- Lookup-Algorithm
  - compute index value
  - find affinity group using hash function
  - contact peer from affinity group
  - receive index entry for file (if it exists)
  - contact peer with the document
  
- Kelips needs four hops to retrieve a file



# How to Add a Document

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- Start an Epidemic Algorithm to Spread the news in the affinity group
- Such an algorithm uses  $O(n/k)$  messages and needs  $O(\log n)$  time
- We introduce Epidemic Algorithms later on

- Kelips has lookup time  $O(1)$ , but needs  $O(n^{1/2})$  sized Routing Table
  - not counting the  $O(F/n^{1/2})$  file tuples
- Chord, Pastry & Tapestry use lookup time  $O(\log n)$  but only  $O(\log n)$  memory units
- Kelips is a reasonable choice for medium sized networks
  - up to some million peers and some hundred thousands index entries

- What is an Epidemic Algorithm



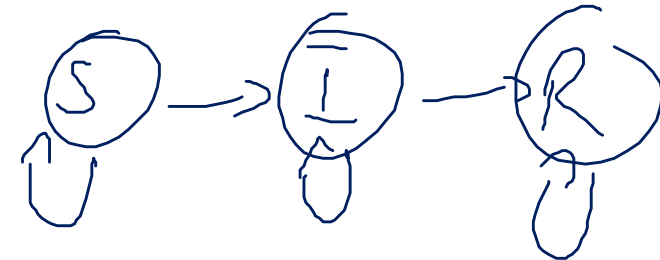
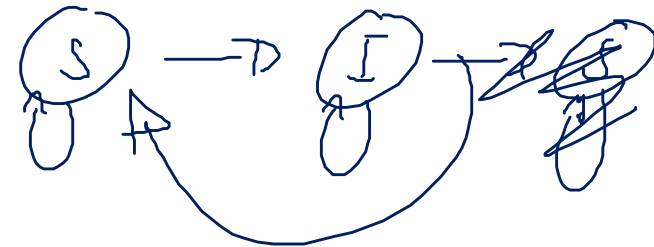
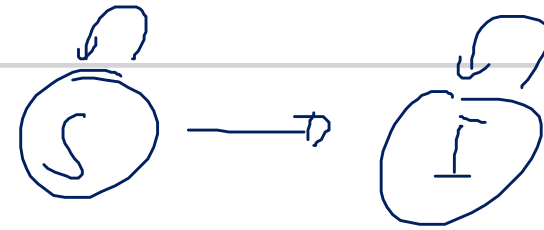
# Epidemic Spread of Viruses

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- Observation
  - most viruses do not prosper in real life
  - other viruses are very successful and spread fast
- How fast do viruses spread?
- How many individuals of the population are infected?
- Problem
  - social behavior and infection risk determine the spread
  - the reaction of a society to a virus changes the epidemic
  - viruses and individuals may change during the infection

# Mathematical Models

- SI-Model (rumor spreading)
  - susceptible → infected
- SIS-Model (birthrate/deathrate)
  - susceptible → infected → susceptible
- SIR-Model
  - susceptible → infected → recovered



Continuous models

- deterministic
- or stochastic

— ■ Lead to differential equations

- Discrete Models
  - graph based models
  - random call based

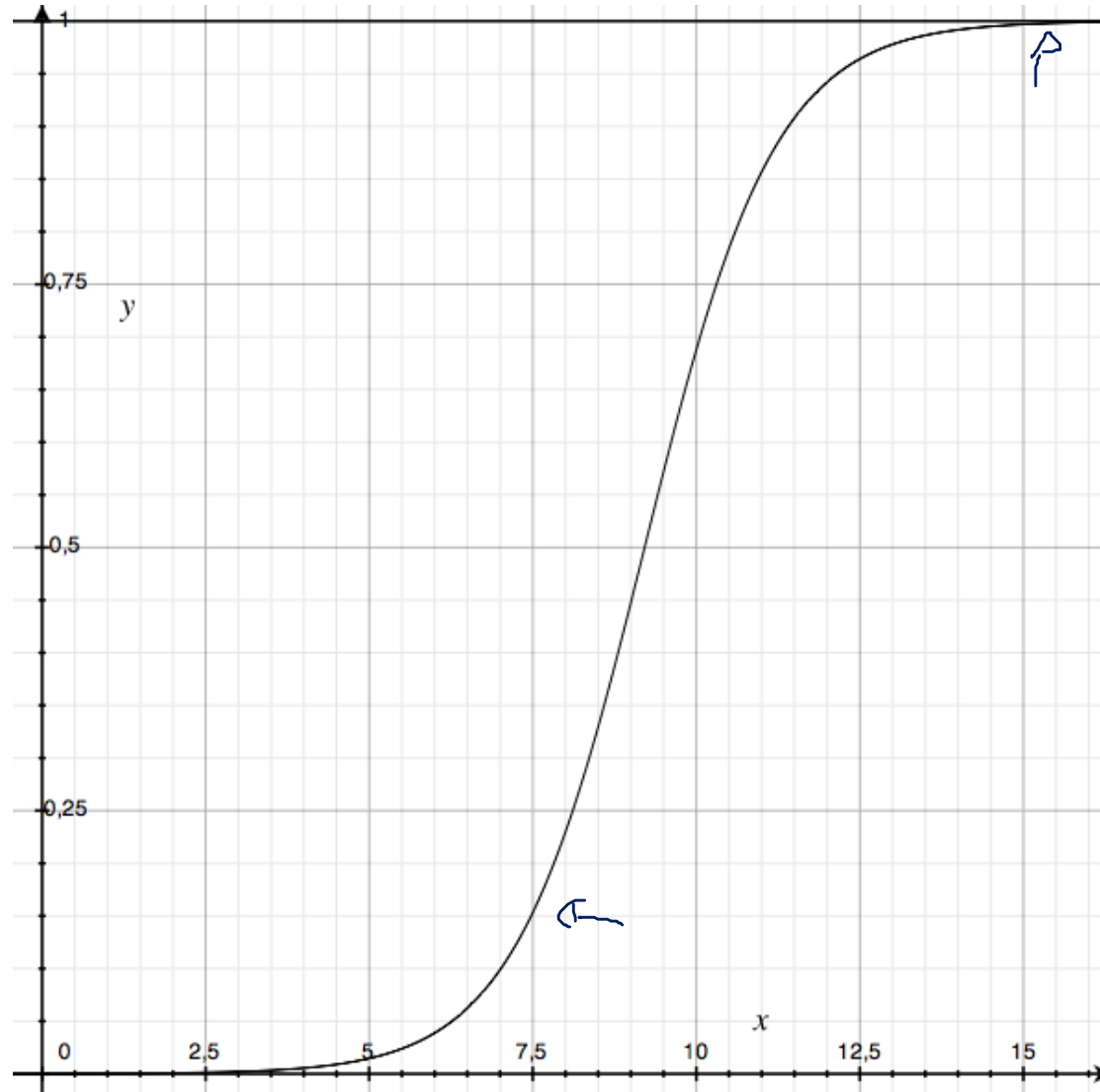
■ Lead to the analysis of Markov Processes

- SI-Model (rumor spreading)
  - susceptible  $\rightarrow$  infected
  - At the beginning one individual is infected
  - Every contact infects another individual
  - In every time unit there are in the expectation  $\beta$  contacts
- SIS-Model (birthrate/deathrate)
  - susceptible  $\rightarrow$  infected  $\rightarrow$  susceptible
  - similar as in the SI-Model, yet a share of  $\delta$  of all infected individuals is healed and can receive the virus again
  - with probability  $\delta$  an individual is susceptible again
- SIR-Model
  - susceptible  $\rightarrow$  infected  $\rightarrow$  recovered
  - like SI-Model, but healed individuals remain immune against the virus and do not transmit the virus again

- Variables
  - n: total number of individuals
    - remains constant
  - $S(t)$ : number of (healthy) susceptible individuals at time  $t$
  - $I(t)$ : number of infected individuals
- Relative shares
  - $s(t) := S(t)/n$
  - $i(t) := I(t)/n$
- At every time unit each individual contacts  $\beta$  partners
- Assumptions:
  - Among  $\beta$  contact partners  $\beta s(t)$  are susceptible
  - All  $I(t)$  infected individuals infect  $\beta s(t) I(t)$  other individuals in each round
- Leads to the following recursive equations:
  - $I(t+1) = I(t) + \beta s(t) I(t)$
  - $i(t+1) = i(t) + \beta i(t) s(t)$
  - $S(t+1) = S(t) - \beta s(t) I(t)$
  - $s(t+1) = s(t) - \beta i(t) s(t)$

# SI-Model

- The number of infected grows exponentially until half of all members are infected
- Then the number of susceptible decrease exponentially



- **Assumptions:**

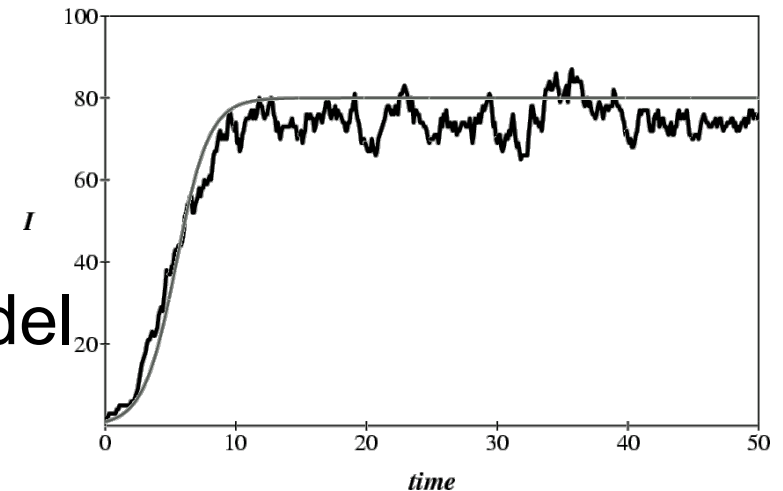
- Among  $\beta$  contact partners  $\beta s(t)$  are susceptible
- All  $I(t)$  infected individuals infect  $\beta s(t) I(t)$  other individuals in each round
- A share of  $\delta$  of all infected individuals is susceptible again

- Leads to the following recursive equations:

- $I(t+1) = I(t) + \beta i(t) S(t) - \delta I(t)$
- $i(t+1) = i(t) + \beta i(t) s(t) - \delta i(t)$
- $S(t+1) = S(t) - \beta i(t) S(t) + \delta I(t)$
- $s(t+1) = s(t) - \beta i(t) s(t) + \delta i(t)$

$$i(t) = \frac{1 - \rho}{1 + \left( \frac{1 - \rho}{i(0)} - 1 \right) e^{-(\beta - \delta)t}} \quad \rho = \frac{\delta}{\beta}$$

- If  $\beta < \delta$ 
  - then  $i(t)$  is strictly decreasing
- If  $\beta > \delta$ 
  - then  $i(t)$  converges against  $1 - \rho = 1 - \delta/\beta$
- Same behavior in discrete model has been observed
  - [Kephart, White'94]



- Variables
  - n: total number of individuals
    - remains constant
  - $S(t)$ : number of (healthy) susceptible individuals at time  $t$
  - $I(t)$ : number of infected individuals
  - $R(t)$ : number of recovered individuals.
- Relative shares
  - $s(t) := S(t)/n$
  - $i(t) := I(t)/n$
  - $r(t) := R(t)/n$
- At every time unit each individual contacts  $\beta$  partners



- Assumptions:
  - Among  $\beta$  contact partners  $\beta s(t)$  are susceptible
  - All  $I(t)$  infected individuals infect  $\beta s(t) I(t)$  other individuals in each round
  - A share of  $\delta$  of all infected individuals is immune (recovered) and never infected again
- Leads to the following recursive equations:
  - $I(t+1) = I(t) + \beta i(t) S(t) - \delta I(t)$
  - $i(t+1) = i(t) + \beta i(t) i(t) - \delta i(t)$
  - $S(t+1) = S(t) - \beta i(t) S(t)$
  - $s(t+1) = s(t) - \beta i(t) s(t)$
  - $R(t+1) = R(t) + \delta I(t)$
  - $r(t+1) = r(t) + \delta i(t)$

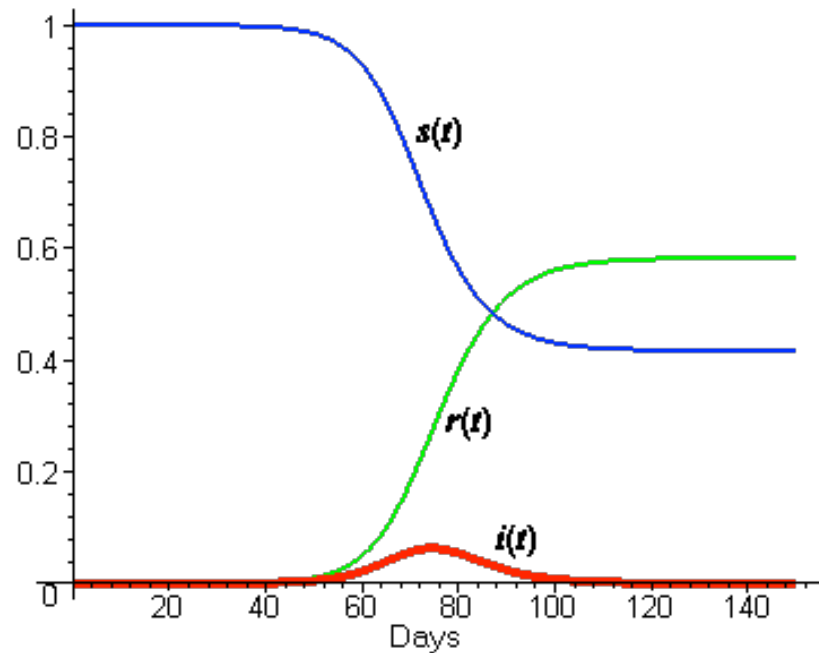
# SIR-Model

- The equations and its differential equations counterpart
  - $i(t+1) = i(t) + \beta i(t) i(t) - \delta i(t)$
  - $s(t+1) = s(t) - \beta i(t) s(t)$
  - $r(t+1) = r(t) + \delta i(t)$
- No closed solution known
  - hence numeric solution
- Example
  - $s(0) = 1$
  - $i(0) = 1.27 \cdot 10^{-6}$
  - $r(0) = 0$
  - $\beta = 0.5$
  - $\delta = 0.3333$

$$\frac{ds(t)}{dt} = -\beta \cdot i(t)s(t)$$

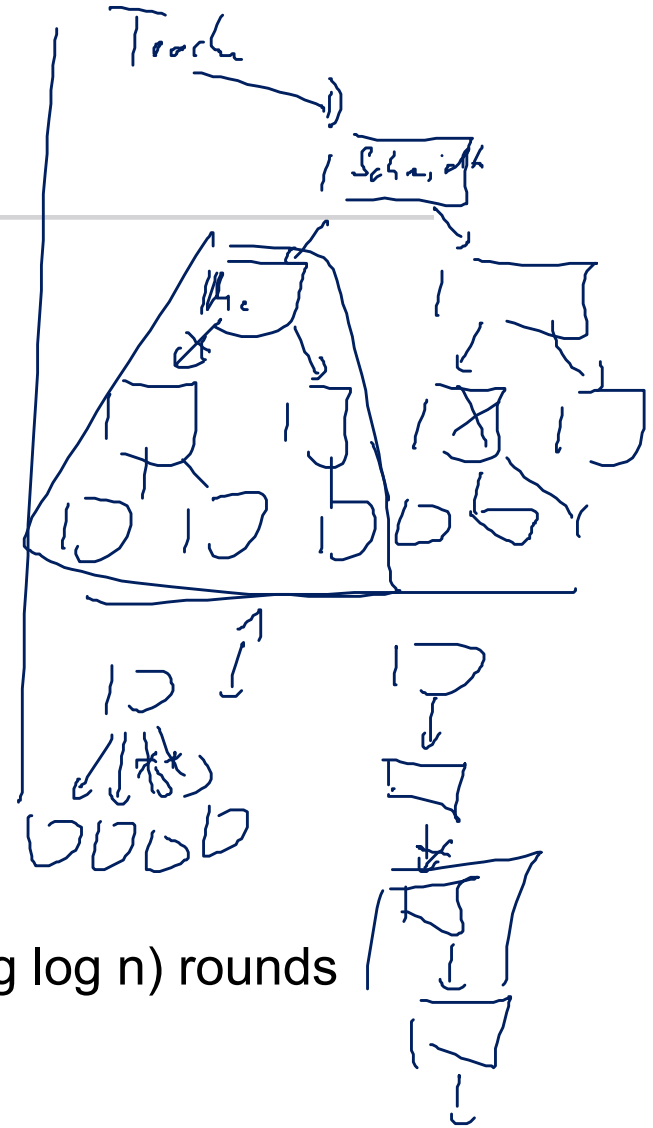
$$\frac{di(t)}{dt} = \beta \cdot i(t)s(t) - \delta i(t)$$

$$\frac{dr(t)}{dt} = \delta i(t)$$



# Epidemic Algorithms

- **Epicast**
  - new information is a rumor
  - as long the rumor is new it is distributed
  - Is the rumor old, it is known to all servers
- **Epidemic Algorithm [Demers et al 87]**
  - distributes information like a virus
  - robust alternative to BFS or flooding
- **Communication method**
  - Push & Pull, d.h. infection after  $\log_3 n + O(\log \log n)$  rounds with high probability
- **Problem:**
  - growing number of infections increases communication effort
  - trade-off between robustness and communication overhead



- Given a contact graph  $G=(V,E)$ 
  - $n$ : number of nodes
  - $I(t)$  := number of infected nodes in round  $t$
  - $i(t) = I(T)/n$
  - $S(t)$  := number of susceptible nodes in round  $t$ 
    - $I(t)+S(t)=n$
  - $s(t) = S(T)/n$
- Infection:
  - If  $u$  is infected in round  $t$  and  $(u,v) \in E$ , then  $v$  is infected in round  $t+1$
- Graph determines epidemics
- Complete graph:
  - 1 time unit until complete infection
- Line graph
  - $n-1$  time units until complete infection

# Random Call Model

- In each round a new contact graph  $G_t=(V,E_t)$ :

- Each node in  $G_t$  has out-degree 1
  - chooses random node  $v$  out of  $V$

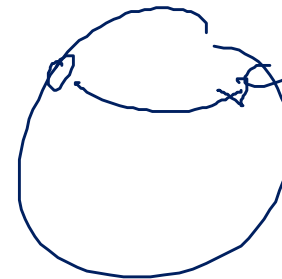
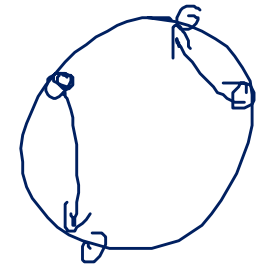
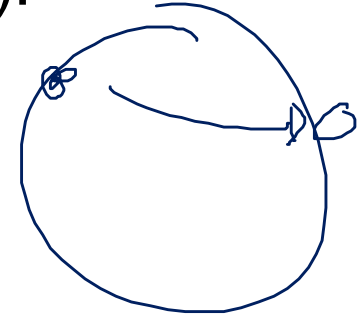
- Infection models:

- Push-Model

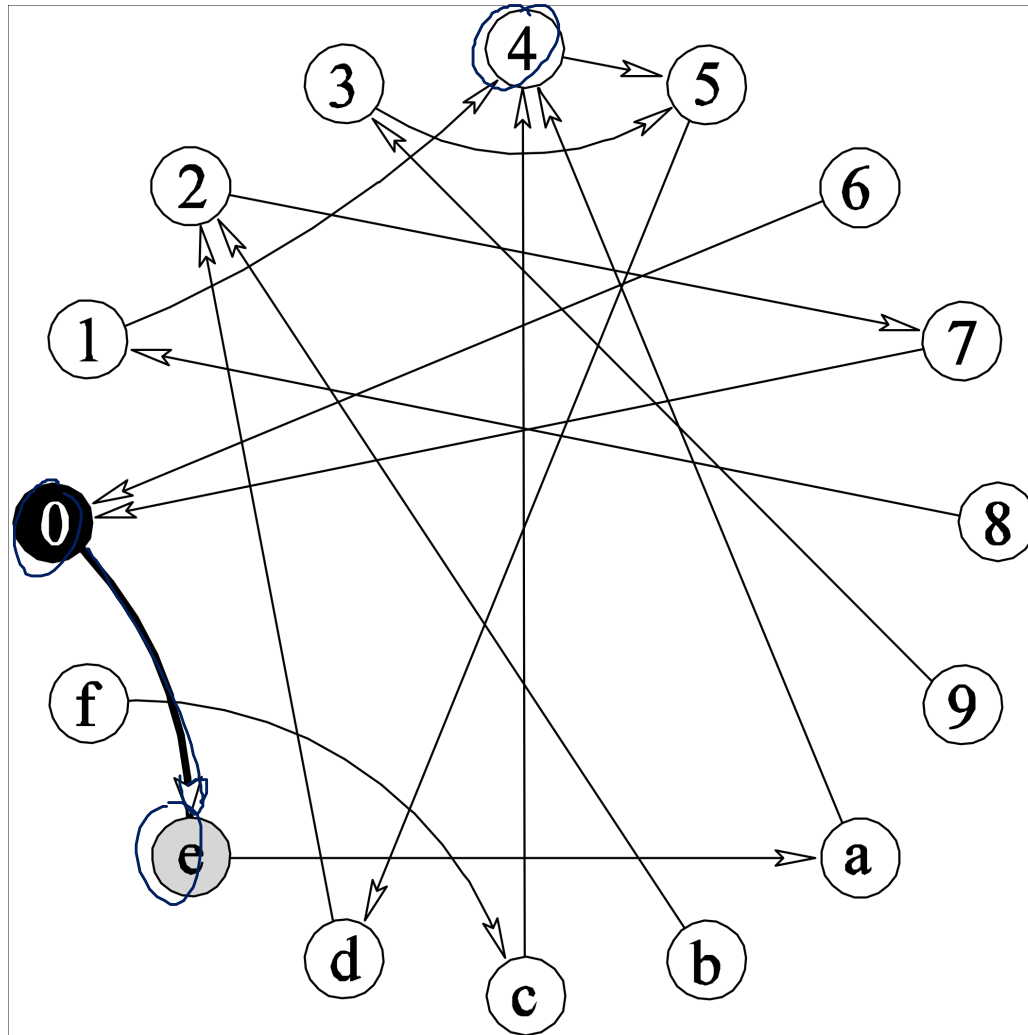
- if  $u$  is infected and  $(u,v) \in E_t$ , then  $v$  is infected in the next round

- Pull-Modell:

- if  $v$  is infected and  $(u,v) \in E_t$ , then  $u$  is infected in the next round

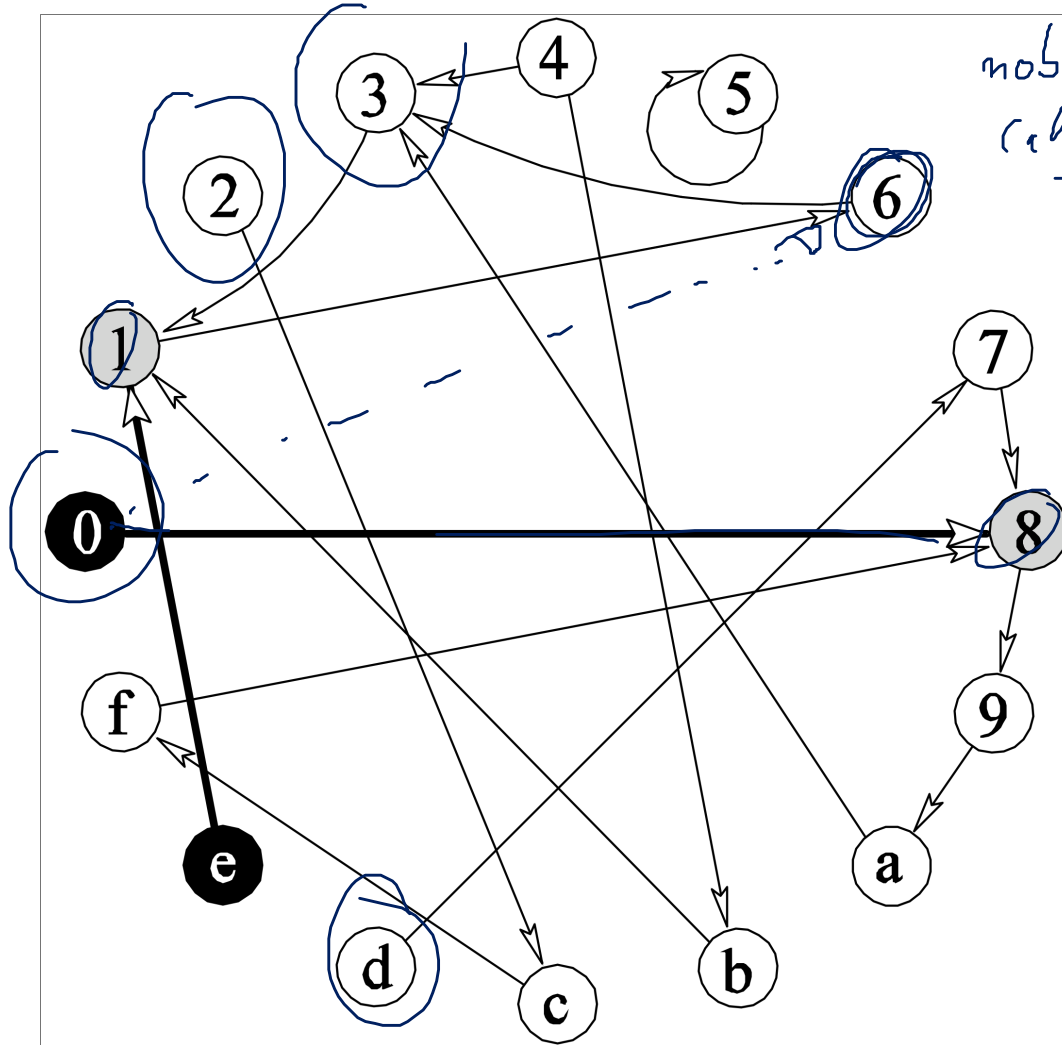


# Push Model



# Push Model

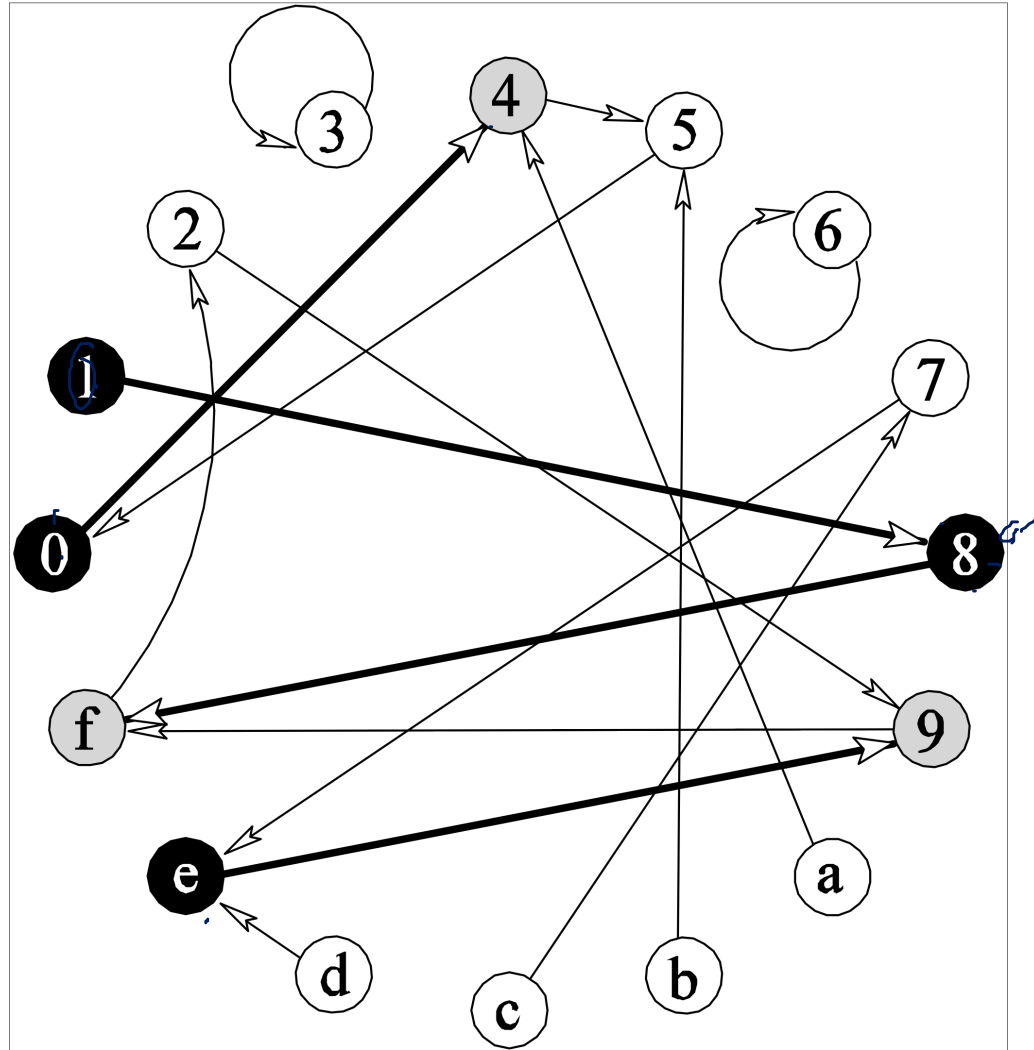
$\rightarrow \boxed{0 \text{ calls } 6} \quad 1 - \frac{1}{n}$



nobody calls 6  $\frac{(1 - \frac{1}{n})^n$

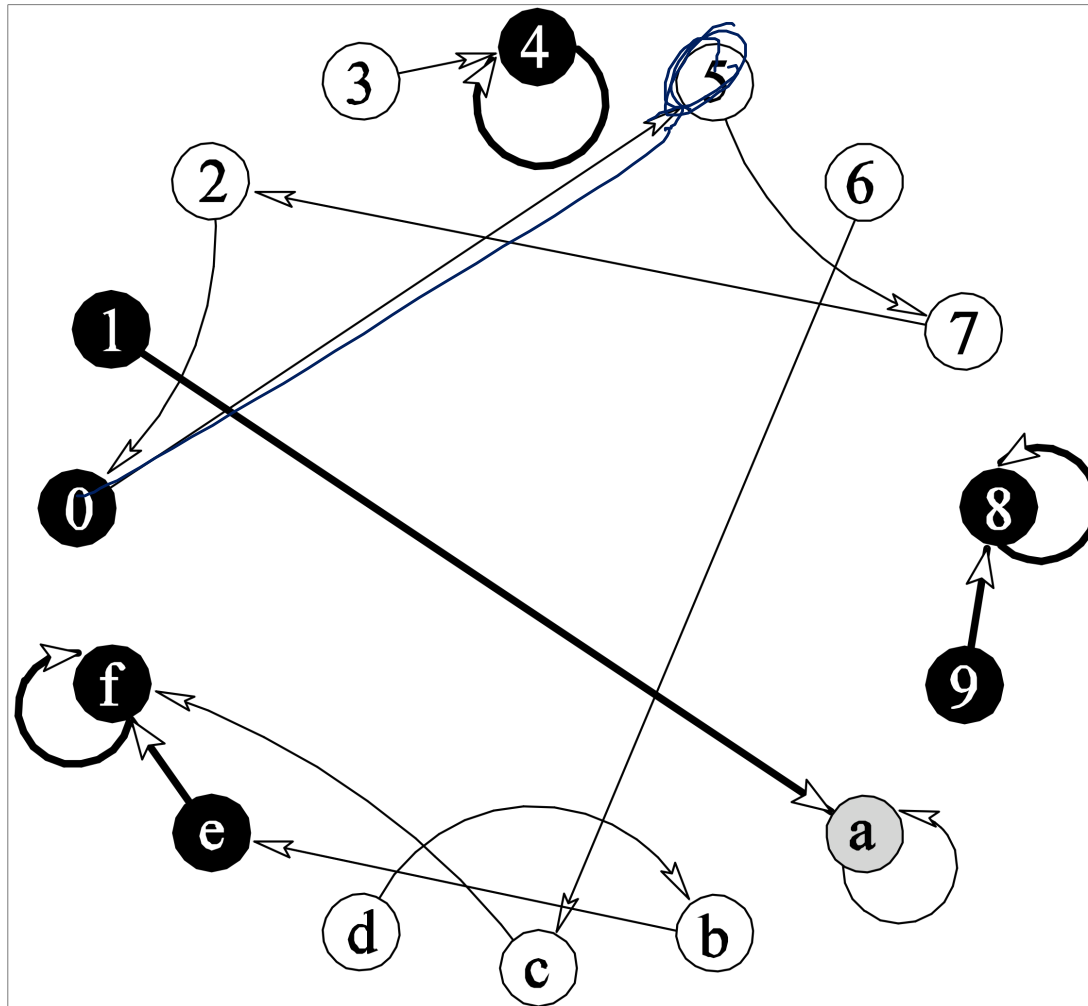
$\star \left(1 - \frac{1}{1000}\right)^{1000}$   
 $= 0.36\dots$   
 $= \frac{1}{2.71\dots} = \frac{1}{e}$

# Push Model

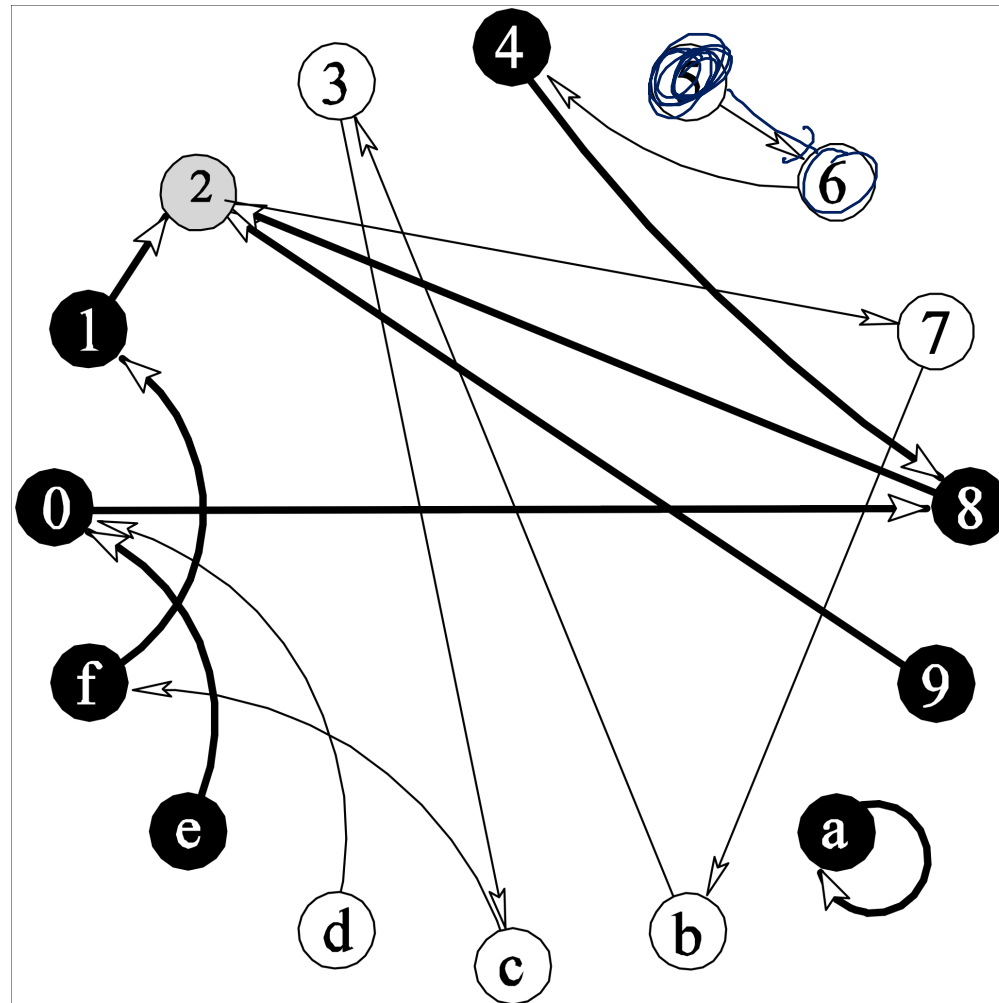




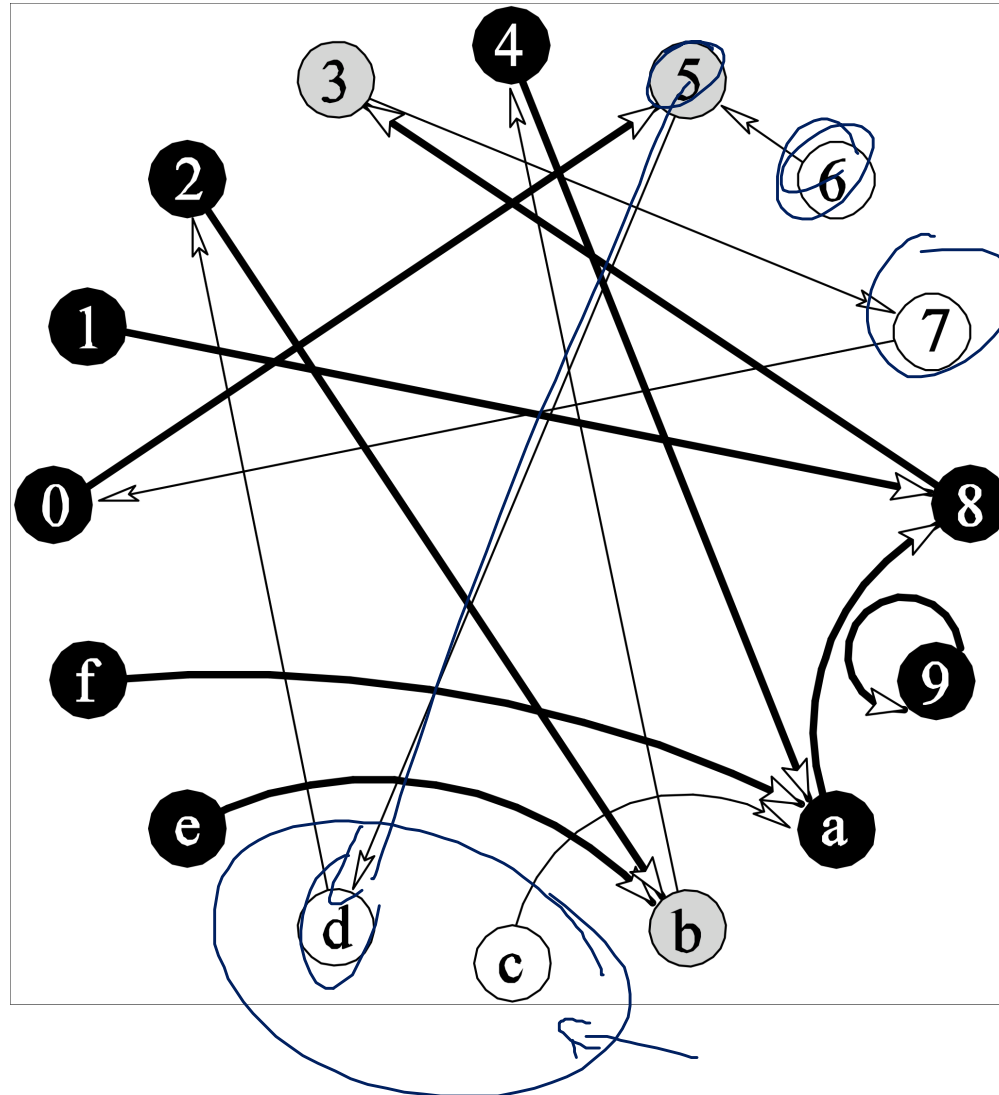
# Push Model



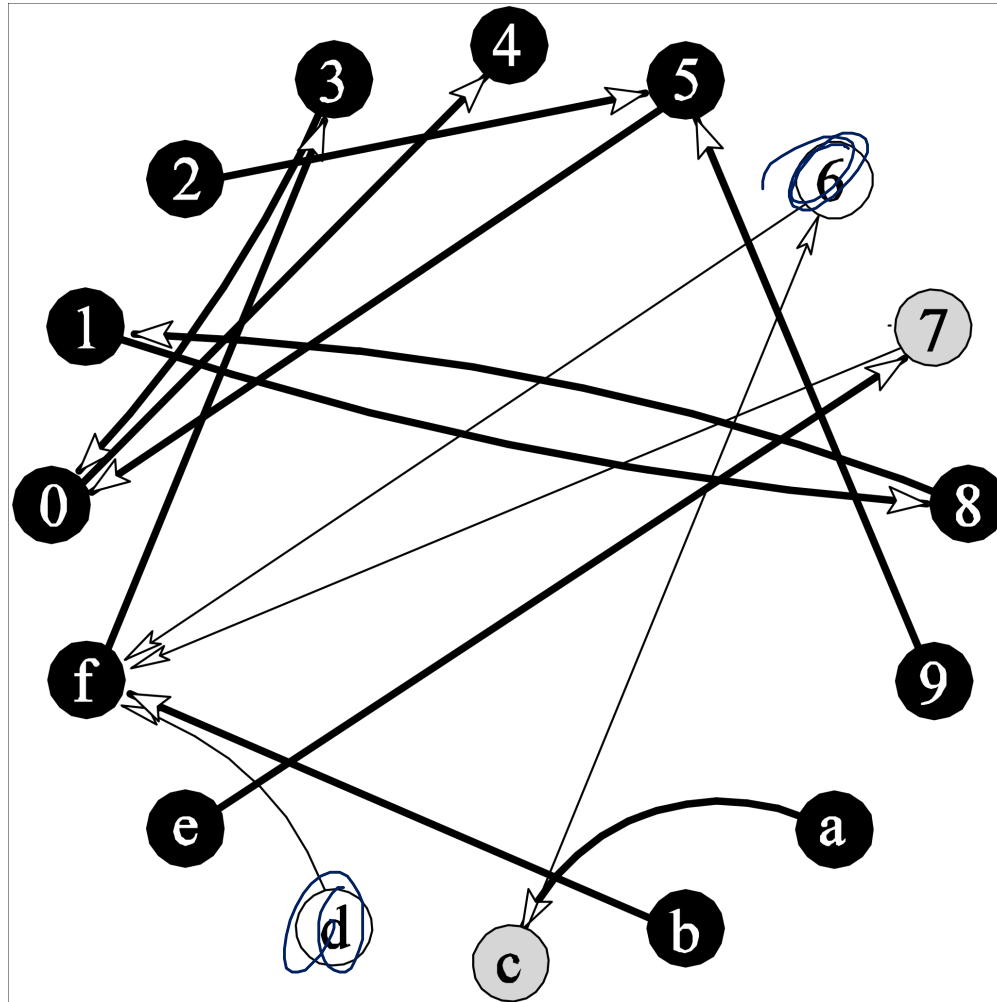
# Push Model



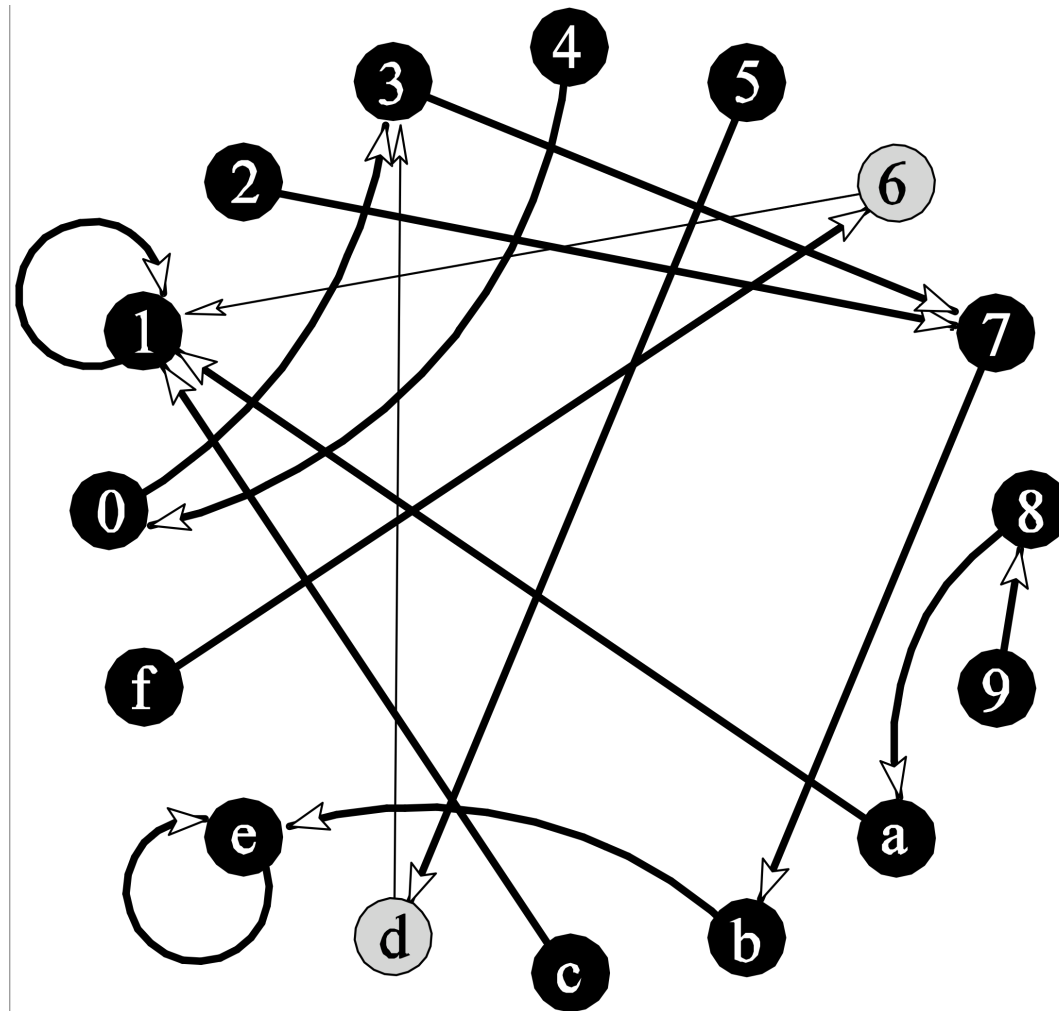
# Push Model



# Push Model



# Push Model



# Push Model Start Phase

$$i(t) = 1 - s(t)$$

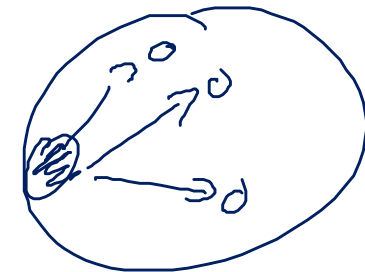


- 3 cases for an infected node
  1. it is the only one infecting a new node
  2. it contacts an already infected node
  3. it infects together with other infected nodes a new node
    - this case is neglected in the prior deterministic case

o. 3rd case

- Probability for 1st or 3rd case  $s(t) = 1 - i(t)$
- Probability for 2nd case  $i(t)$
- Probability for 3rd case is at most  $i(t)$ 
  - since at most  $i(t)$  are infected

- Probability of infection of a new node, if  $i(t) \leq s(t)/2$ :
  - at least  $1 - 2i(t)$
- $E[i(t+1)] \geq \underline{i(t) + i(t)(1 - 2i(t))} = \underline{2i(t) - 2i(t)^2} \approx 2i(t)$



- If  $i(t) \leq s(t)/2$ :
  - $E[i(t+1)] \geq 2i(t) - 2i(t)^2 \approx 2i(t)$
- Start phase:  $l(t) \leq 2c(\ln n)^2$ 
  - Variance of  $i(t+1)$  relatively large
  - Exponential growth starts after some  $O(1)$  with high probability
- Exponential growth:
  - $l(t) \in [2c(\ln n)^2, n/(\log n)]$
  - Nearly doubling of infecting nodes with high probability, i.e.  $1 - O(n^{-c})$
- Proof by Chernoff-Bounds

- For independent random variables  $X_i \in \{0, 1\}$  with  $X_m = \sum_{i=1}^m X_i$

- and any  $0 \leq \delta \leq 1$

- Let  $\delta = 1/(\ln n)$

$$P[X_m \leq (1 - \delta)\mathbf{E}[X_m]] \leq e^{-\delta^2 \mathbf{E}[X_m]/2}$$

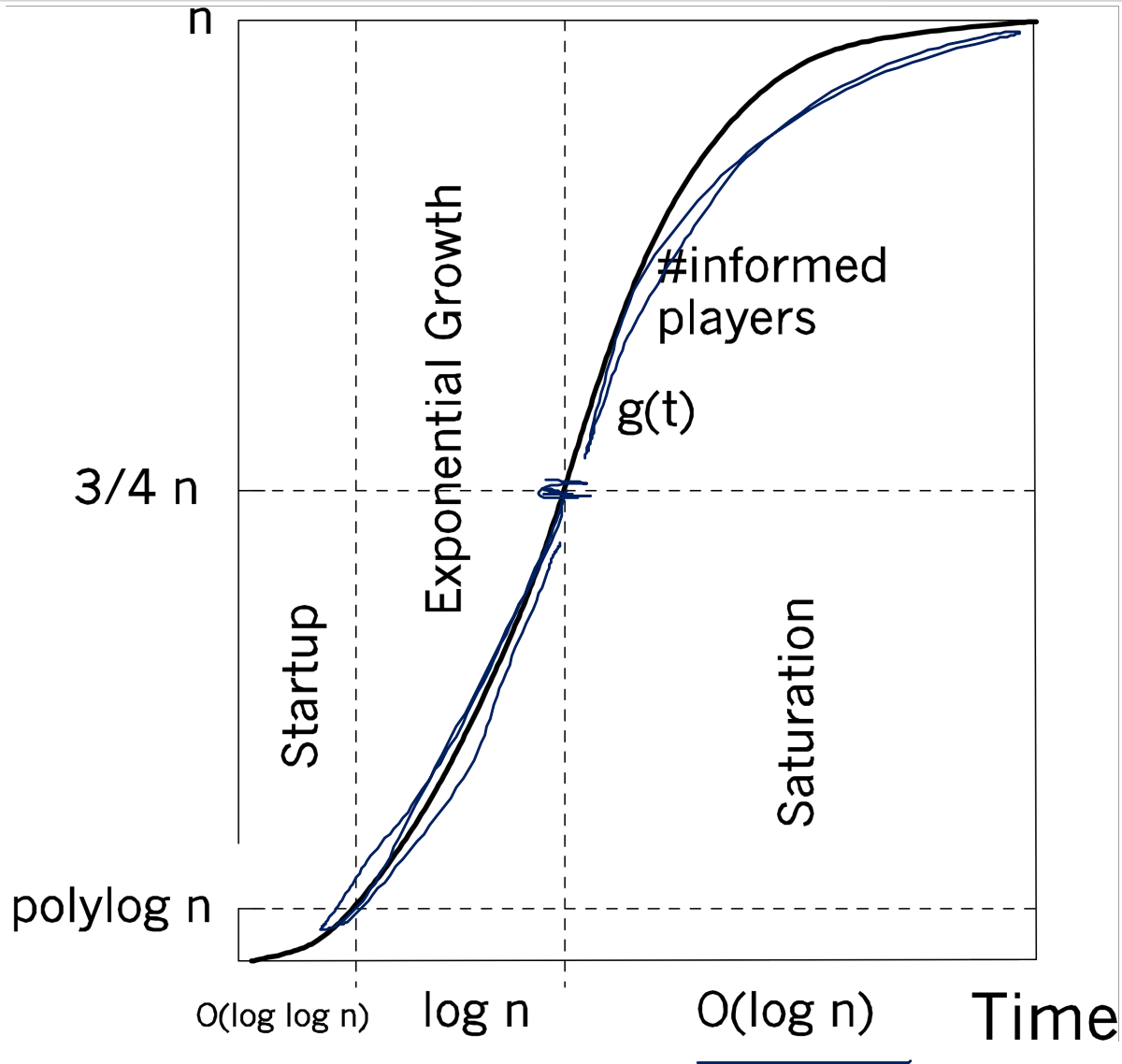
- $\mathbf{E}[X_m] \geq 2c(\ln n)^3$

- Then  $\delta^2 \mathbf{E}[X_m]/2 \geq c \ln n$

- This implies

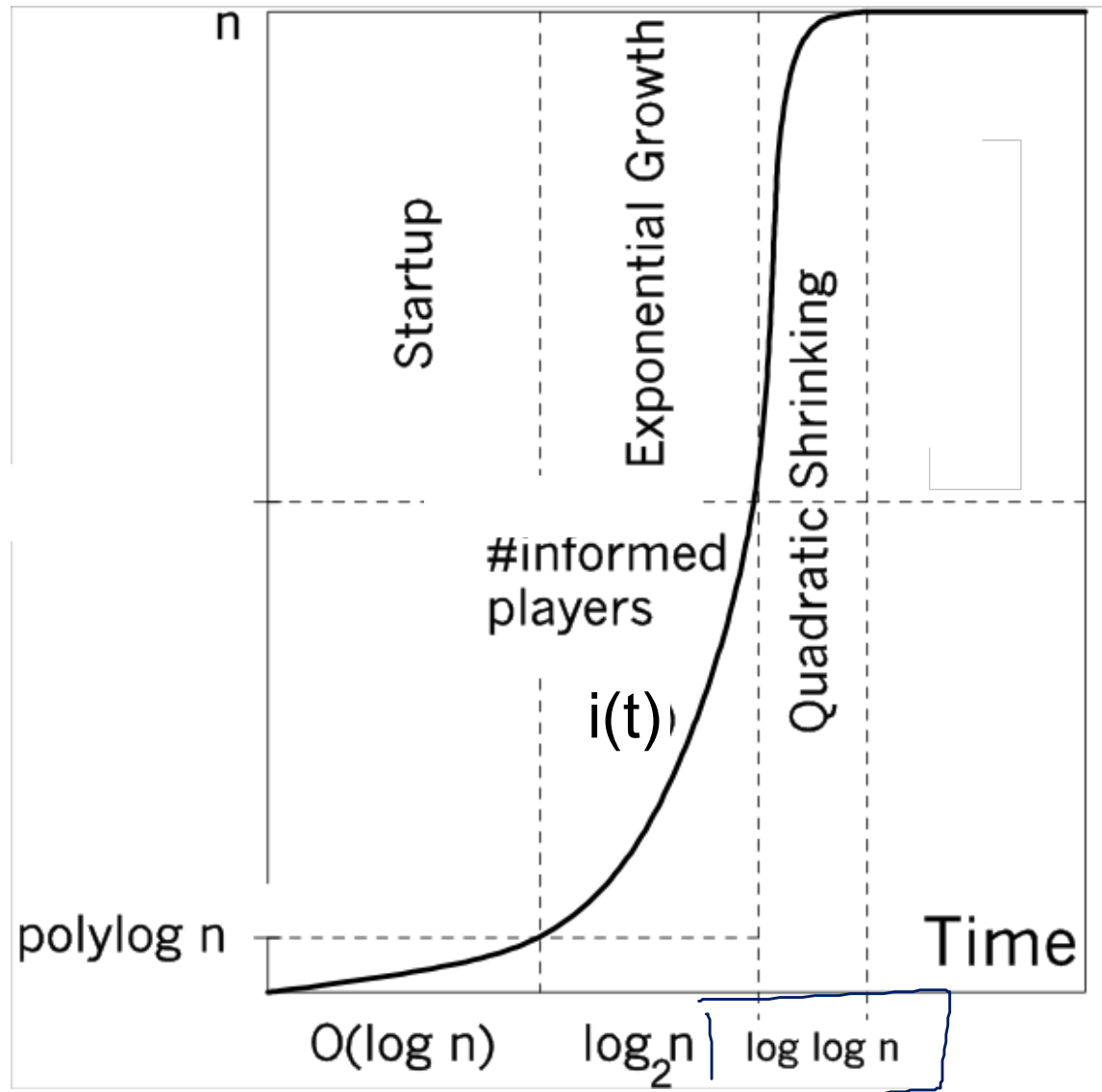
$$P[X_m \leq (1 - \delta)\mathbf{E}[X_m]] \leq e^{-\delta^2 \mathbf{E}[X_m]/2} \leq n^{-c}$$

# Push Model





# Pull Model





# Peer-to-Peer Networks

## 08 Kelips and Epidemic Algorithms

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