

# Networks Structure and Dynamics

## 13. Dynamics of the Internet topology

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- 1 "Measuring" the dynamics
  - Context and approach
  - Tracetest
  - Measurements
- 2 Analysis of the dynamics
  - Basic properties
  - The growth phenomenon
  - Presences and presence blocks
- 3 Modelling the dynamics
  - Impact of the dynamics
  - Modelling
  - Simulations

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## Outline

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## References for this course

Fasts dynamics in Internet topology: observations and first explanations - Magnien, Ouédraogo, Valadon, Latapy - 2009

A Radar for the internet - Latapy, Magnien, Ouédraogo - 2011

Towards realistic modeling of IP-level routing topology dynamics - Magnien, Medem, Kirgizov, Tarissan - 2013

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## Unexpected properties

### Important unexpected property

Heterogeneous degree distribution

### Consequences on ...

- robustness
- spreading phenomena
- ...

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## Unexpected properties

### Important unexpected property

Heterogeneous degree distribution

### Consequences on ...

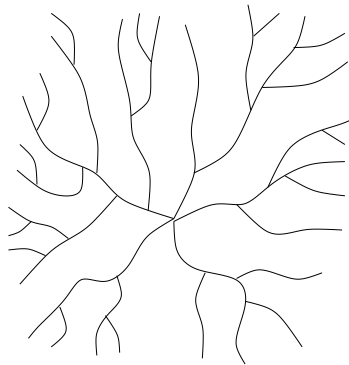
- robustness
- spreading phenomena
- ...

Led to works on the cartography of the Internet at the IP-level  
that we discuss here

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## Observed vs real properties (with traceroutes)

One source, a lot of destinations:



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## Observed vs real properties (with traceroutes)

- **bias** on the structure observed: missing links

⇒ theoretical and empirical works to ...

- ... assess the bias
- ... assess some properties in an unbiased way

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## Summary

### Cartography at the IP level

Long and expensive

### Trend during 2010's

- Massive data  
increase number of sources and destinations,  
distributed measurements. . .
- Improve the quality of the measurement

What about the dynamical aspect?

## Summary

### Cartography at the IP level

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What about the dynamical aspect?

## The approach in this course

### Focus on what one machine sees of the Internet

- easier to measure (in terms of time and load)  
simple and efficient measure  $\Rightarrow$  easy to repeat
- easier to interpret

$\Rightarrow$  ego-centered view

### Radar

One source, several destinations, periodic measurements

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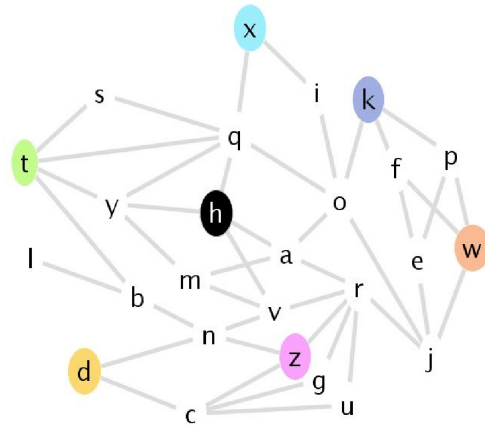
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### Radar

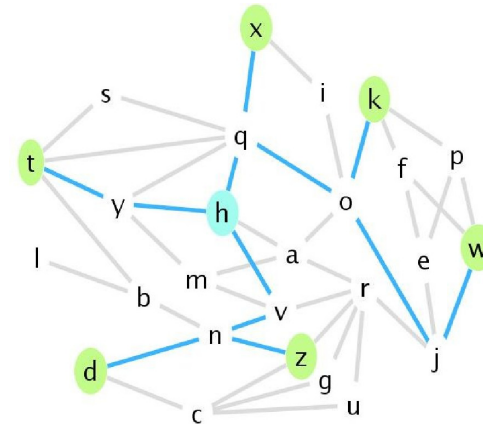
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## Ego-centered view



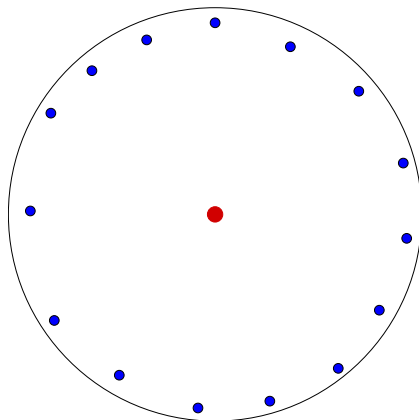
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## Ego-centered view



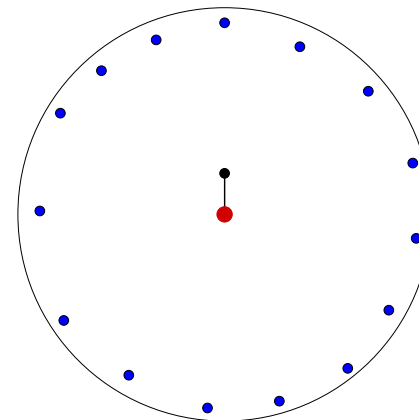
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## Measuring with traceroute



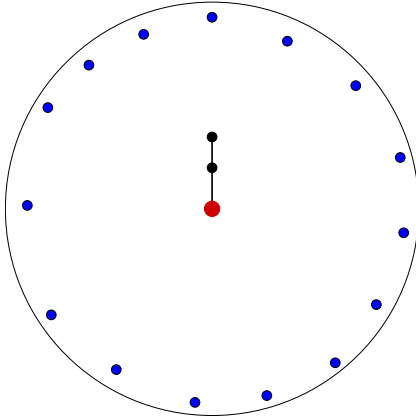
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## Measuring with traceroute

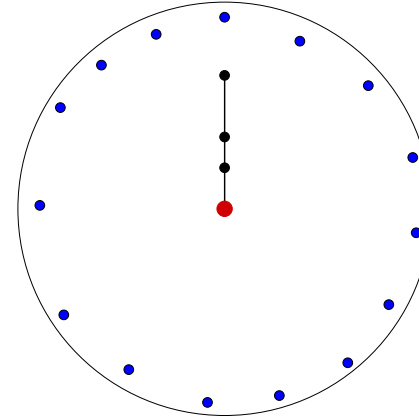


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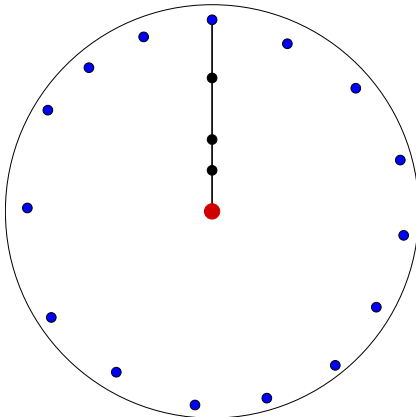
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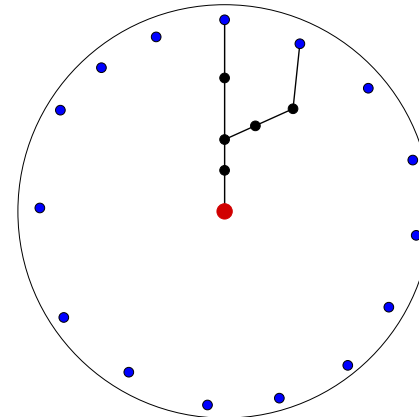
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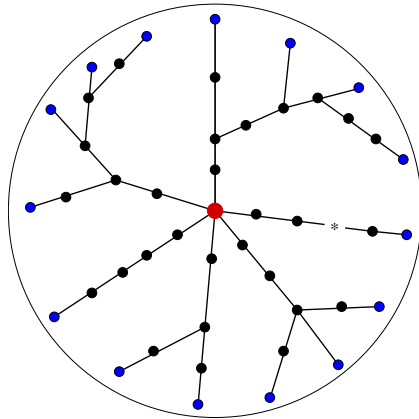
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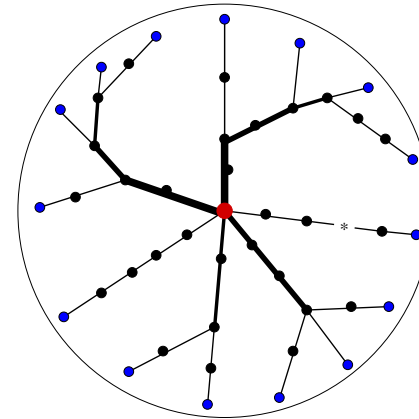


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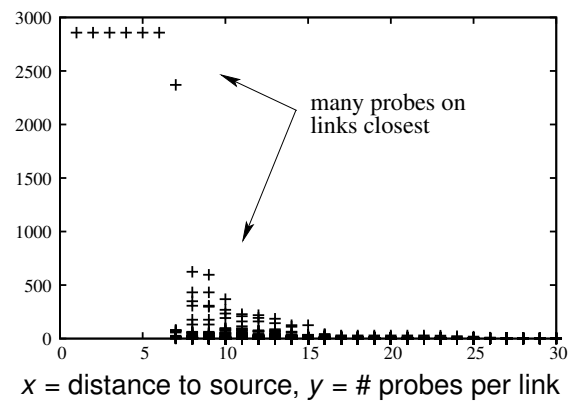
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## Unbalanced probing



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## Limits of the traceroute approach

- **Unbalanced probing**  
⇒ information redundancy
- **Obtained view is not a tree**  
⇒ make the analysis more complicated

⇒ need for a dedicated tool  
tracetest

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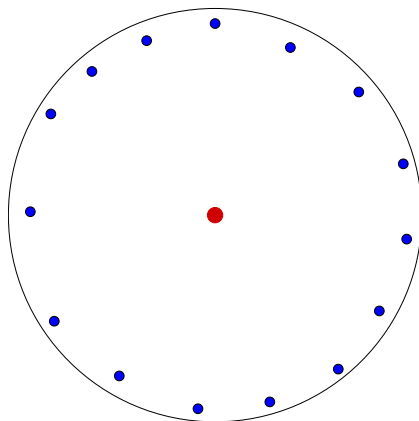
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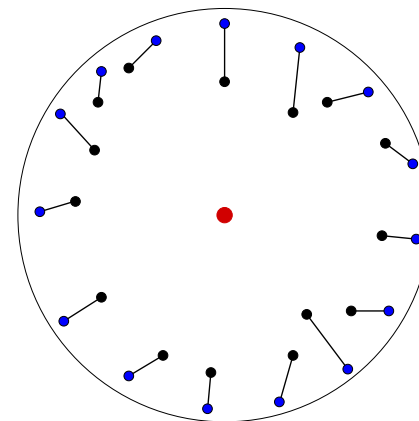
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**Backward measurement**, in parallel, stop when paths connect

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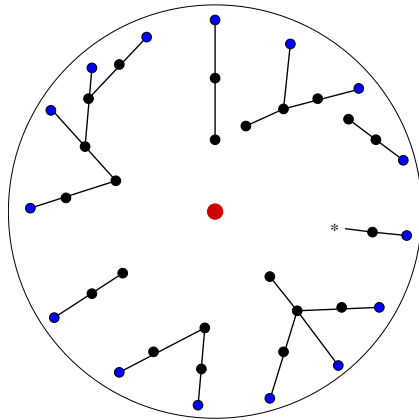
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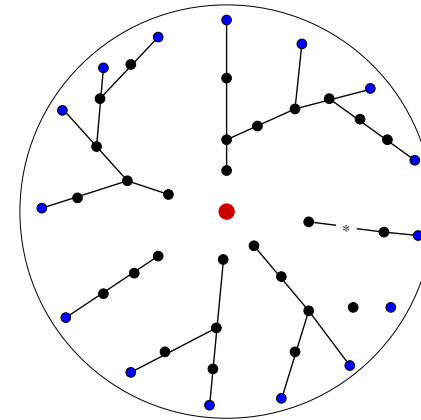
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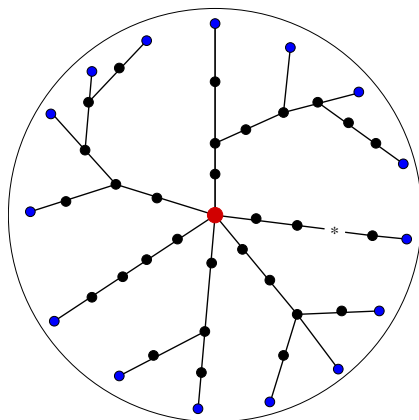
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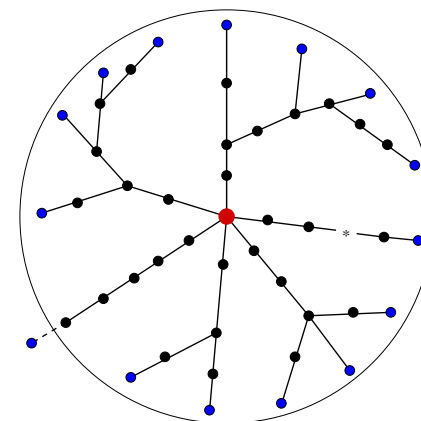
## Tracetree



**Backward measurement**, in parallel, stop when paths connect

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## Tracetree



**force a radius limit** (= TTL max):  
Probe until a certain distance to the source (typically 20 to 30)

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## Tracetree and Radar

### Tracetree

- One packet per link
- Uniform (in terms of load) and fast measurement
- Tree

→ available C code

<http://www.complexnetworks.fr/programs/>

### Radar

- One source
- A set of destinations
- Periodical tracetree measurements

But Tracetree same problems as traceroute for meas. quality

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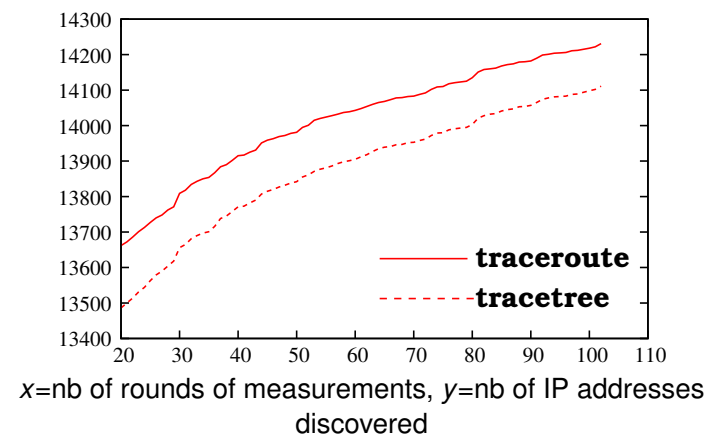
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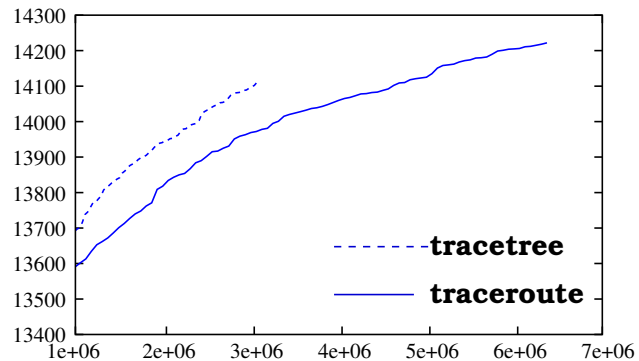
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## tracetree vs traceroute: empirical comparison



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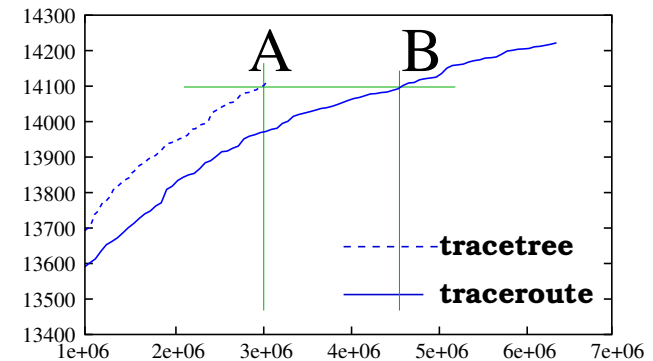
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x=nb of packets sent, y=nb of IP addresses discovered

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## Setting the experiments parameters

### Measurement parameters

- Which source, which destinations?
- How many destinations?
- Which delay between consecutive rounds?
- ...

### Finding a good trade-off

- High frequency
- Large measurements
- Low network load

Approach: parameters changed one by one  
controlled measurement

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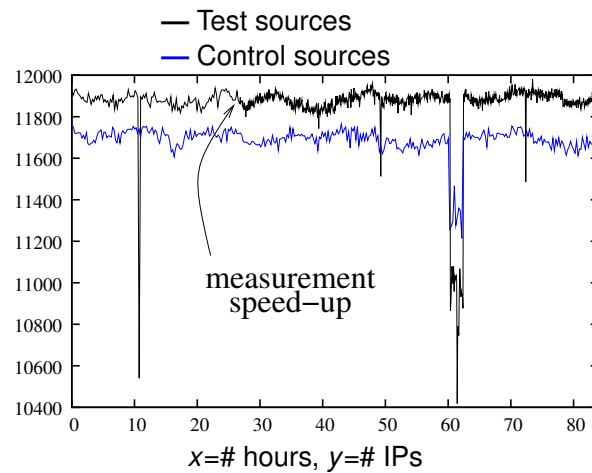
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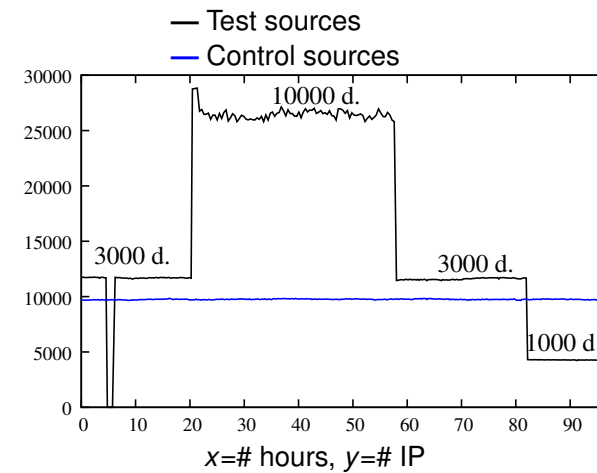
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## Parameters: frequency



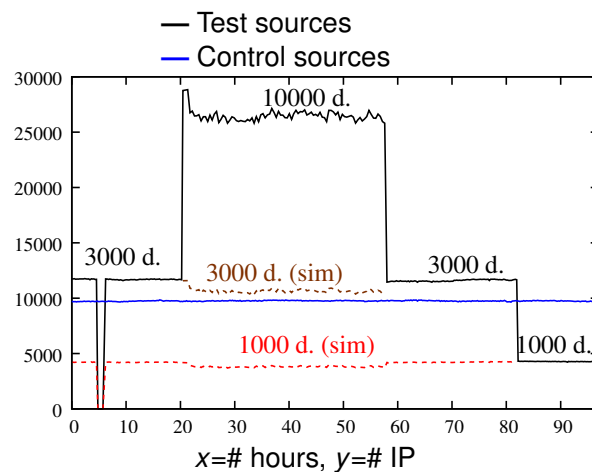
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## Parameters: number of destinations



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## Our measurements

Two parameter sets:

- **normal**: 3000 destinations, 10 min. delay between rounds, max TTL 30, ... ~ 100 rounds / day
- **fast**: 1000 destinations, 1 min. delay between rounds, max TTL 15, ... > 800 rounds / day, ~ 36 / hour

**Sources**: PlanetLab and others (> 100)

**Destinations**: random, answered once to ping

several months of uninterrupted measurement  
dataset available for study  
[www-complexnetworks.lip6.fr/~latapy/Radar/](http://www-complexnetworks.lip6.fr/~latapy/Radar/)

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## Analysis

### Which dynamics?

Goal:

- better understanding
- model, simulate
- detect events
- ...

How to answer to this question?

No out-of-the-shelf method

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## Data

Valid questions for **any** dynamical network

### Focus on the radar normal dataset

- 3000 destinations
- one round every 15 minutes (100 rounds per day)

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## Study of a round

Variations as a function of:

- the source of the radar
- the moment of the data collection

### General trends

- ~ 12 000 IP
- ~ 12 000 "stars"
- most nodes are at distance 13-18

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- ~ 12 000 IP
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We always observe the same kind of behaviors

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## Simple properties through time

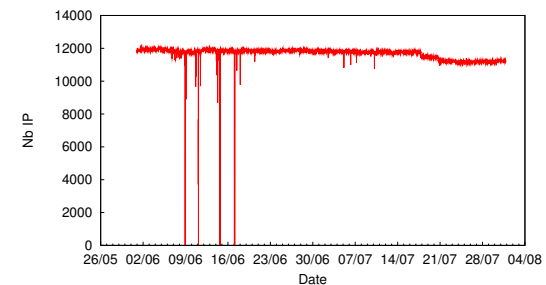
First approach: evolution of simple properties through time

### Properties investigated

- number of IPs
- number of unanswered probes
- duration of rounds
- ...

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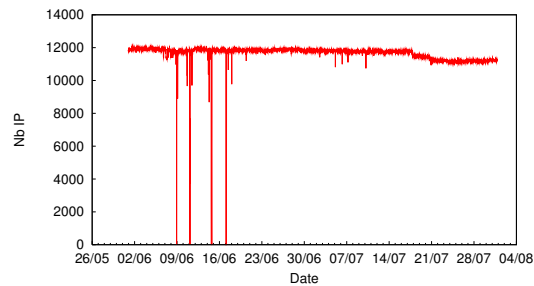
## Simple properties through time



- source in Japan
- two months of measurement
- ~ 6 000 rounds

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## Simple properties through time



- number of IP seen more or less stable
- a few sudden drops (downward pikes) → disconnections?
- no upward pikes

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## Stabilization?

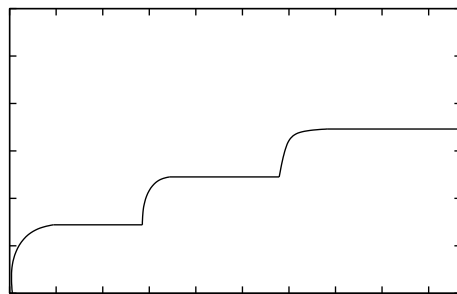
Expected behavior?

$x$  = number of rounds  
 $y$  = number of distinct IP addresses from the beginning

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## Stabilization?

Expected behavior?

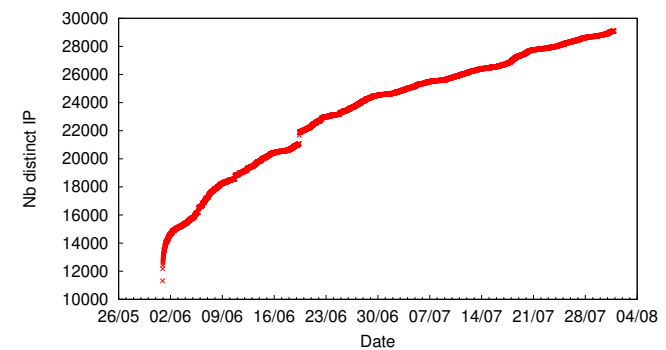


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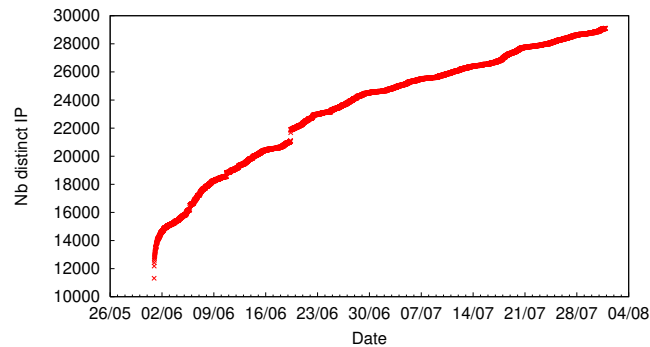
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## Stabilization?

number of distinct IP addresses from the beginning

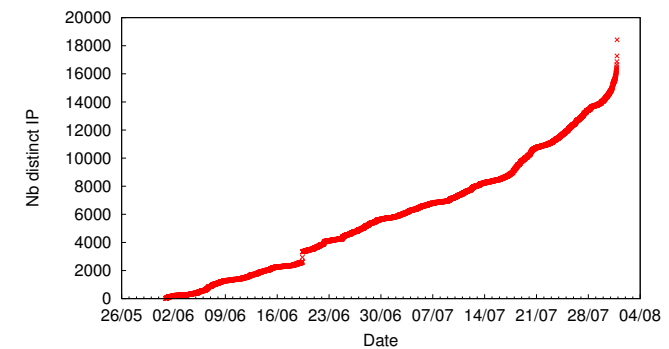


New IPs observed continuously

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## Disappearances

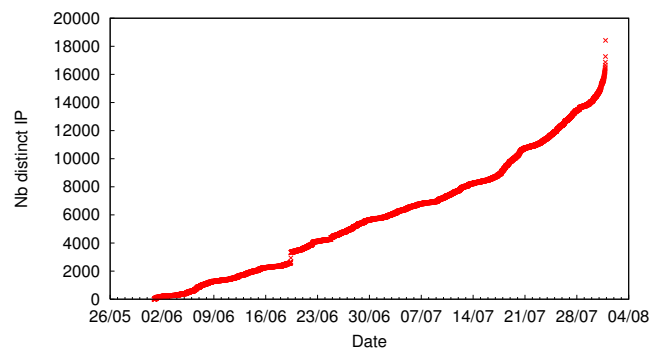
number of distinct IPs that we never see anymore



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## Disappearances

number of distinct IPs that we never see anymore



Continuous renewal of IPs

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## Possible explanations

Surprising growth... how to explain?

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## Possible explanations

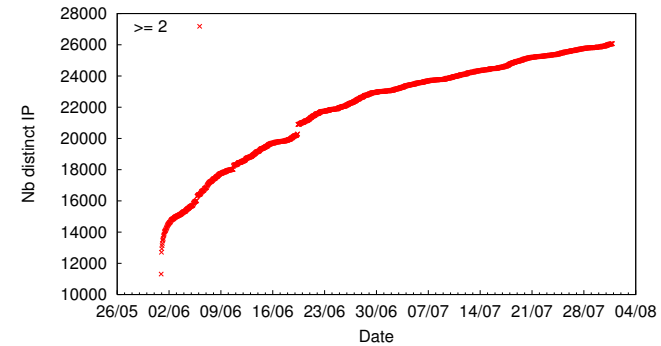
Surprising growth... how to explain?

### A "natural" explanations

- backbone of permanent IPs +  
"random" IPs (appears once then disappears)

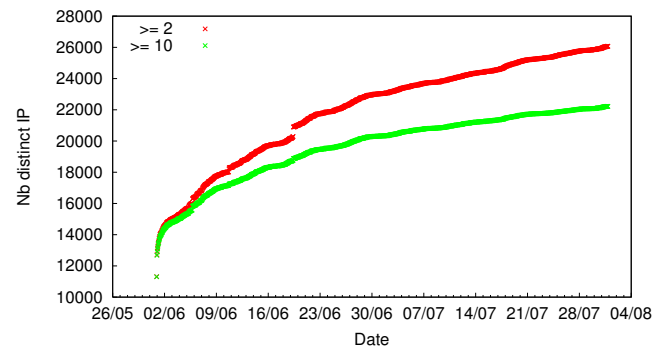
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## IPs seen only once?



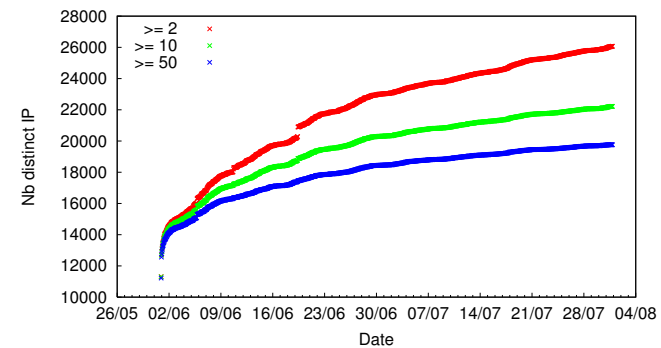
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29/44

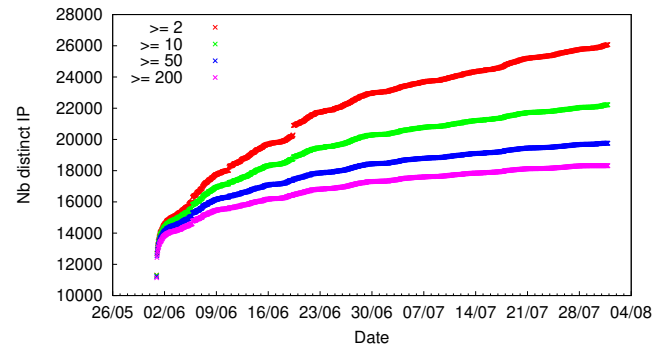
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29/44

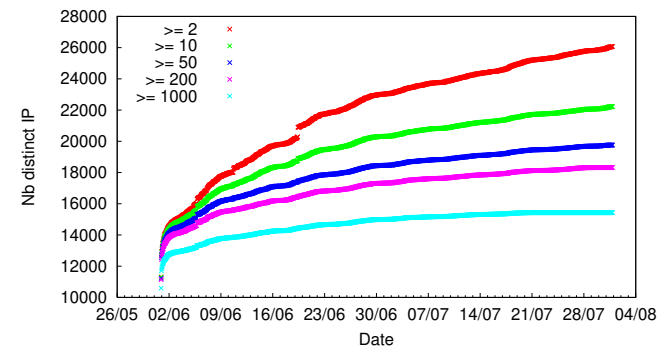


## IPs seen only once?



29/44

## IPs seen only once?



Recurring new IPs...  
Rules out the hypothesis of random IPs

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## Presence of an IP

Distribution of the number of presences

All IPs seen during the measurement (~ 29 000)

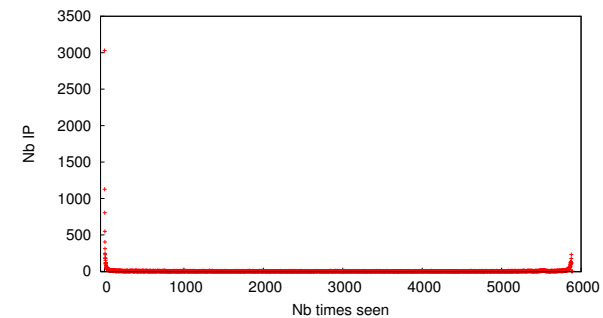
For each IP: **number of rounds** where it is seen

→ Distribution

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## Presence of an IP

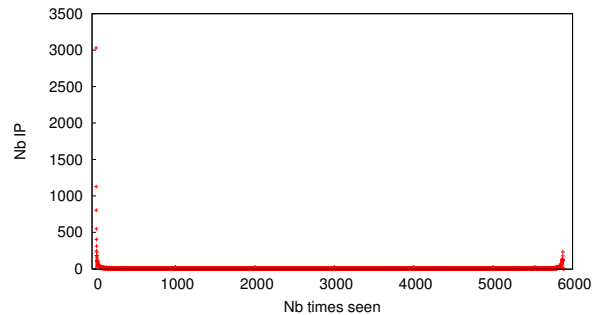
2 months ~ 6000 rounds



30/44

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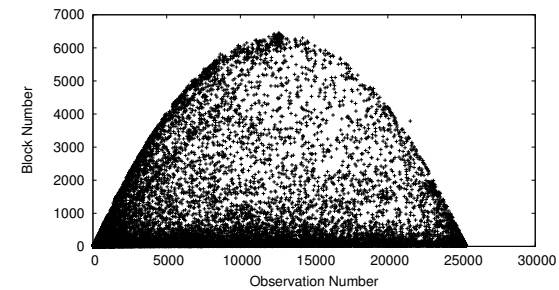
2 months ~ 6000 rounds



- A lot of **ephemeral** IPs (seen very few times)
- Substantial number of **stable** IPs (seen ~ every round)

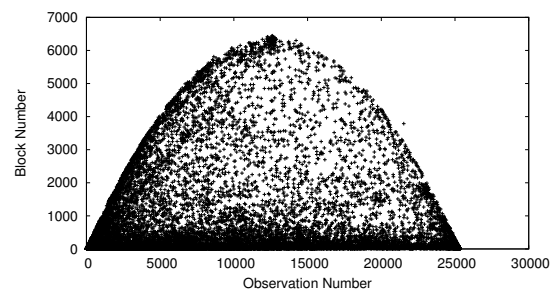
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A presence block = consecutive presences of an IP



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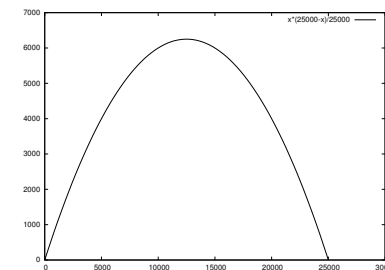


Delimiting triangle:

Nb blocks of presence  $\leq \min(\text{nb presences}, \text{nb absences})$

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A presence block = consecutive presences of an IP



Parabola:

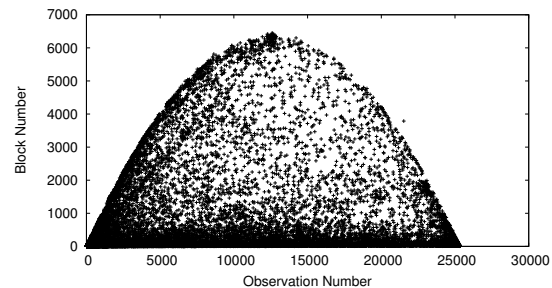
Nb of blocks expected on average for this number of presences

$$P(\text{presence}) = \frac{x}{25000}, P(\text{appearance}) \propto \frac{x(25000-x)}{25000}$$

as appearance corresponds to absence then presence

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A presence block = consecutive presences of an IP



### Two classes of IP

random (parabola) and stable (1 block) dominate

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## How to explain the dynamics?

Approach in the following:

- 1 Choose observable features from the analysis ([see above](#))
- 2 Identify underlying mechanisms related to them
- 3 Model these mechanisms
- 4 Validate using simulations

Several mechanisms may be responsible for routing changes:

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## How to explain the dynamics?

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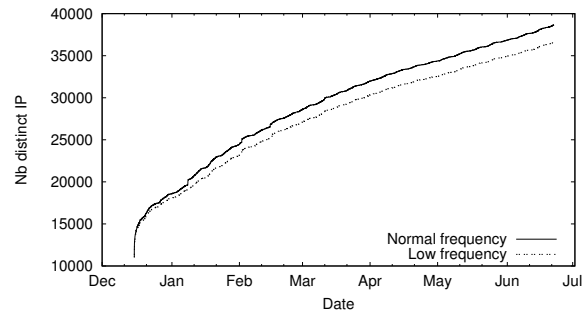
Several mechanisms may be responsible for routing changes:

- load-balancing
- routing topology modifications

Do these mechanisms really impact our measurements?

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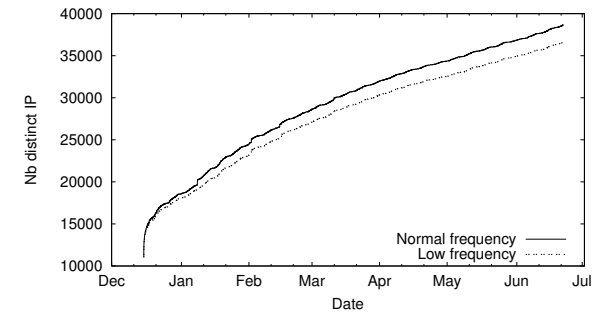
## Impact of the frequency in regard to time



The higher the rate of measurement, the more IPs are seen

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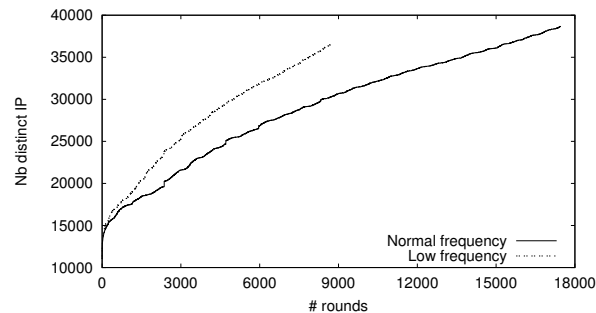
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⇒ **load-balancing**

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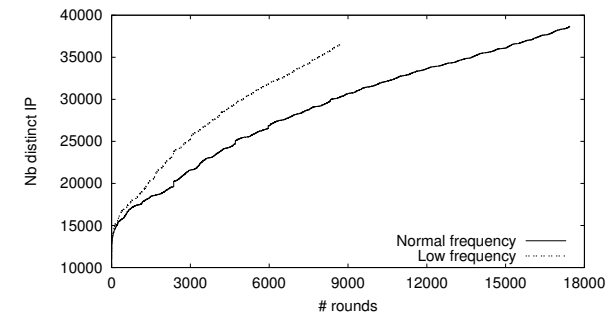
## Impact of the frequency in regard to # of rounds



The longer the time between measurements, the more IPs seen

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## Impact of the frequency in regard to # of rounds



The longer the time between measurements, the more IPs seen  
⇒ **changes of the topology**

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## Modelling the dynamics

We are looking for a (simple) model to account for the load-balancing and for the modifications of the routing topology

### Load-balancing

Traceroute measurement as a shortest path  
How to adapt the BFS to account for the load-balancing?

### Topology

Which graph model? Which re-arrangement rules?  
Random nodes? Random links?

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## Modelling traceroute and load-balancing

Several possibilities to choose a shortest path.

Given a DAG of shortest paths from a source to a destination, we can:

- either choose one path among all possible paths
- or for each of the possible following nodes, we choose one

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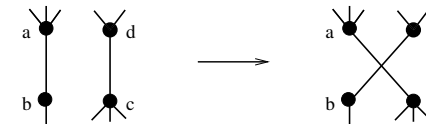
**Benefit of the second choice:** local rule at the level of the node

Implementation: random BFS

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## Modelling the topology modifications

We choose to focus on the links, considering rewiring two pairs of connected nodes:



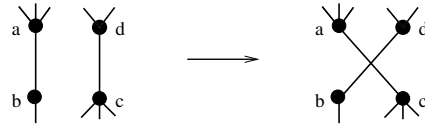
**Benefit:** no change in the graph degree distribution

**Drawback:** cannot handle appearances and disappearances of nodes in the graph

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## Validate using simulations

Simulations approach:

- 1 Generate an initial graph: ER, BA, CM, others...  $\Rightarrow G_1$
- 2 Simulate a measurement: extract a routing tree (random BFS)  $\Rightarrow T_1$
- 3 Simulate a topology modification: swap  $\Rightarrow G_2$
- 4 Iterate step 2:  $\Rightarrow T_2; \dots; T_n$

Questions:

- Do we observe the same phenomena in  $T_1; \dots; T_n$ ?
- What is the impact of the model parameters?

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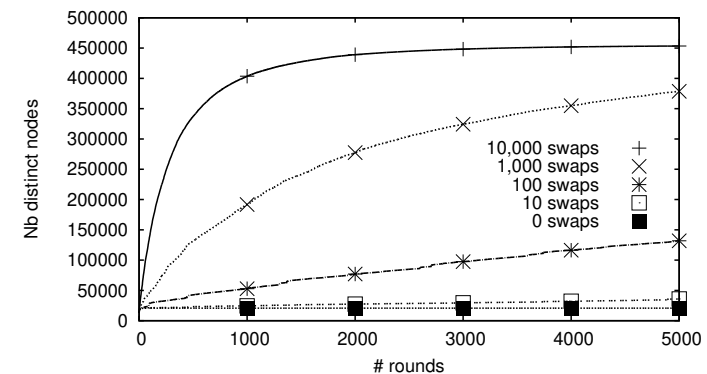
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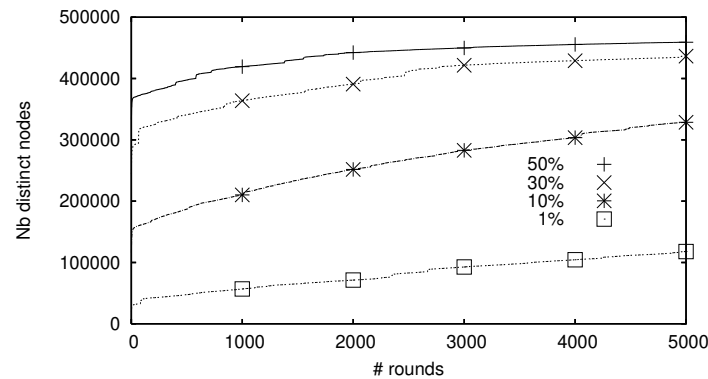
## Impact of the number of swaps



$n = 500,000$  ;  $m = 1,000,000$  ; 3,000 destinations

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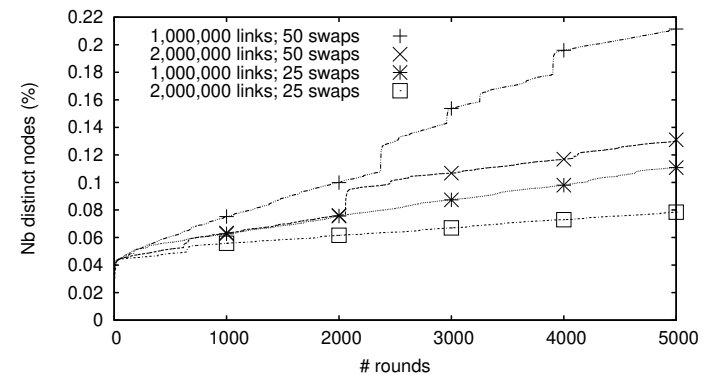
## Impact of the number of destinations



$n = 500,000$  ;  $m = 1,000,000$  ; 50 swaps

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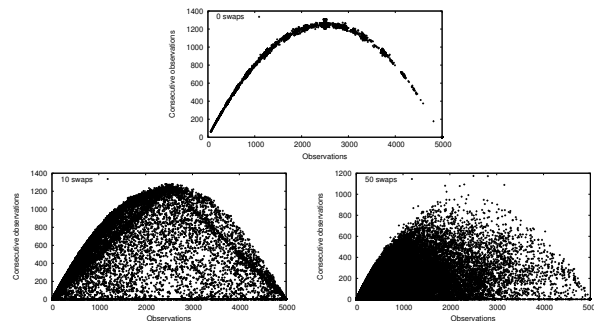
## Relation between the # of links and the # of swaps



$n = 500,000$  ; 3,000 destinations

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## The parabola observation



$n = 500,000$  ;  $m = 1,000,000$  ; 3,000 destinations

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## Conclusions on the simulations

### Global conclusions:

- we account **qualitatively** for the dynamics observed
- the chosen models allow to replicate the observations
- some constraints on the parameters allow to identify invariant in the dynamics
- we do not account for **stable IPs**

### Possible follow ups:

- test other topologies
- integrate appearances and disappearances of nodes
- obtain analytical results to have a better understanding of the curves observed

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