

# **Necessary backbone of superhighways for transport on geographical complex networks**

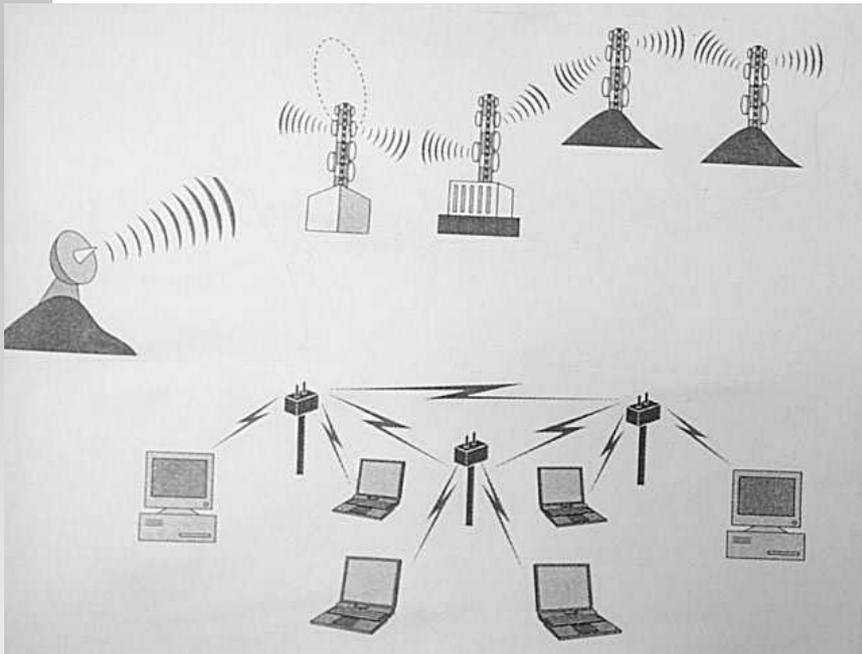
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# 1. Introduction

Dynamic configuration of (backbone) networks in an emergent or self-organized manner

**Problems** for efficient communication such as in distributed sensor networks or P2P systems



**dissipation** of wireless beam-power or wired line-cost for **long-range** links

**interference** by **crossing** of links (non-planar)

to realize efficient transport of packets

# 1-1. Model of Ad-Hoc Nets

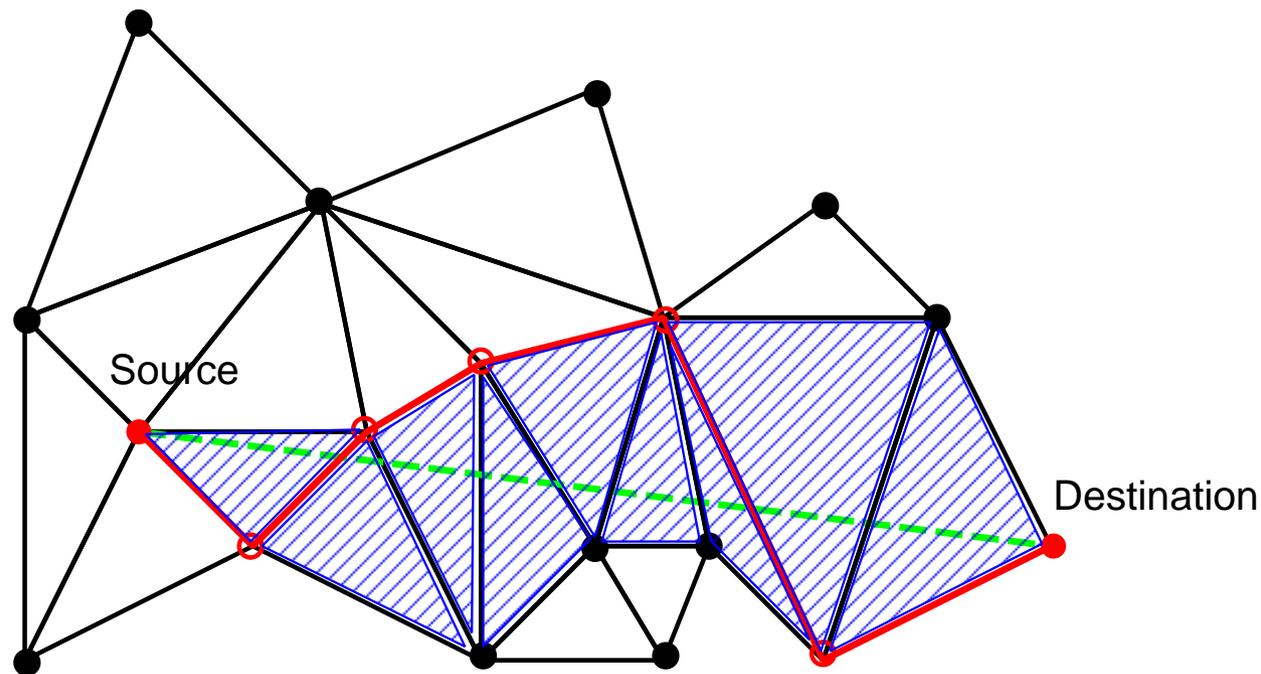
We assume that

- a network evolves with a new node
- the position of each node is fixed
- a few nodes have sufficient power to be hubs
- various transmission ranges and the orientation are controllable (for wireless links)
- It is better that only local information is used because of the topological change

These are reasonable in the current technology, but we don't care about the details in device or application

# 1-2. Efficient Routing

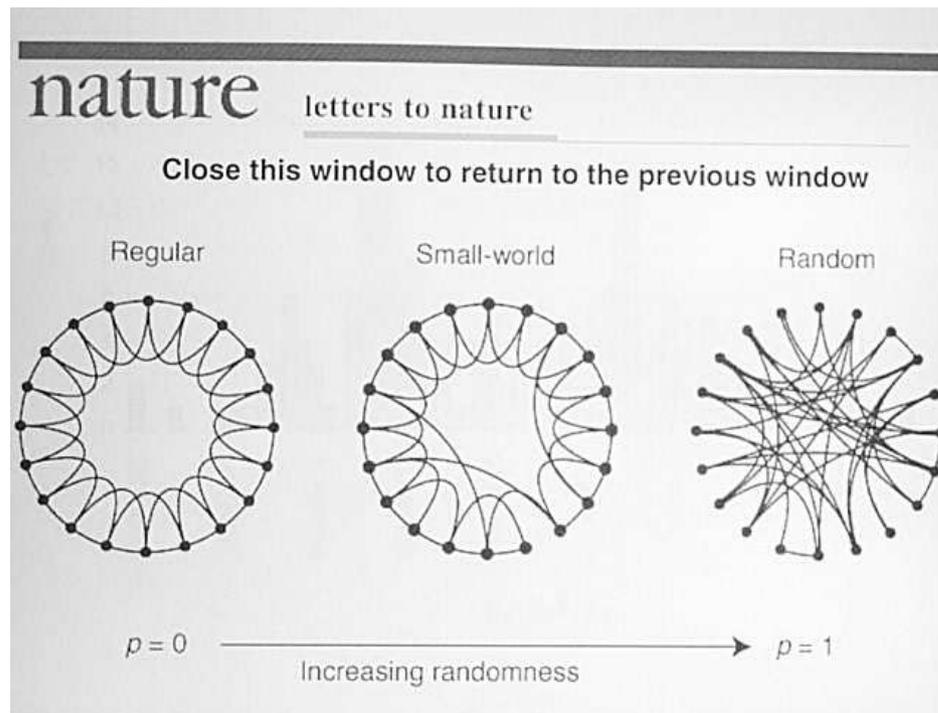
Planar triangulation: reasonable math. abstraction of ad hoc net. Moreover, a **memoryless, no defeat, and competitive** online routing algorithm has been developed for planar networks taking into account the face.



Bose and Morin, SIAM J. of Comp. 33(4), 2004

# 1-3. Motivation for Shortcuts

Shorten the path length remaining local clusters



SW model, D.J. Watts and S.H. Strogatz, Nature, 393, 1998

Moreover, **the robustness can be improved by adding shortcuts** to a one-dim. SW model

C. Moore, and M.E.J. Newman, PRE 61, 2000

# 1-4. Objective

To investigate the effect of shortcuts on geographical networks in the viewpoints:

**the tolerance of connectivity** to random failures and targeted attacks on hubs

**the backbone for transport** measured by the usage and centrality of links on the shortest paths

in typical planar network models:

- random Apollonian network in **complex network science**,
- Delaunay triangulation in **computer science**,
- our proposed models to bridge them.

# 1-5. Scale-Free Nets with Hubs

Existing a surprisingly common structure: SF net.

the degree dist. follows  $P(k) \sim k^{-\gamma}$ ,  $2 < \gamma < 3$ , in many social, technological, and biological nets.

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**Robust connectivity** for random failures (Albert et al., Nature 406, 2000)

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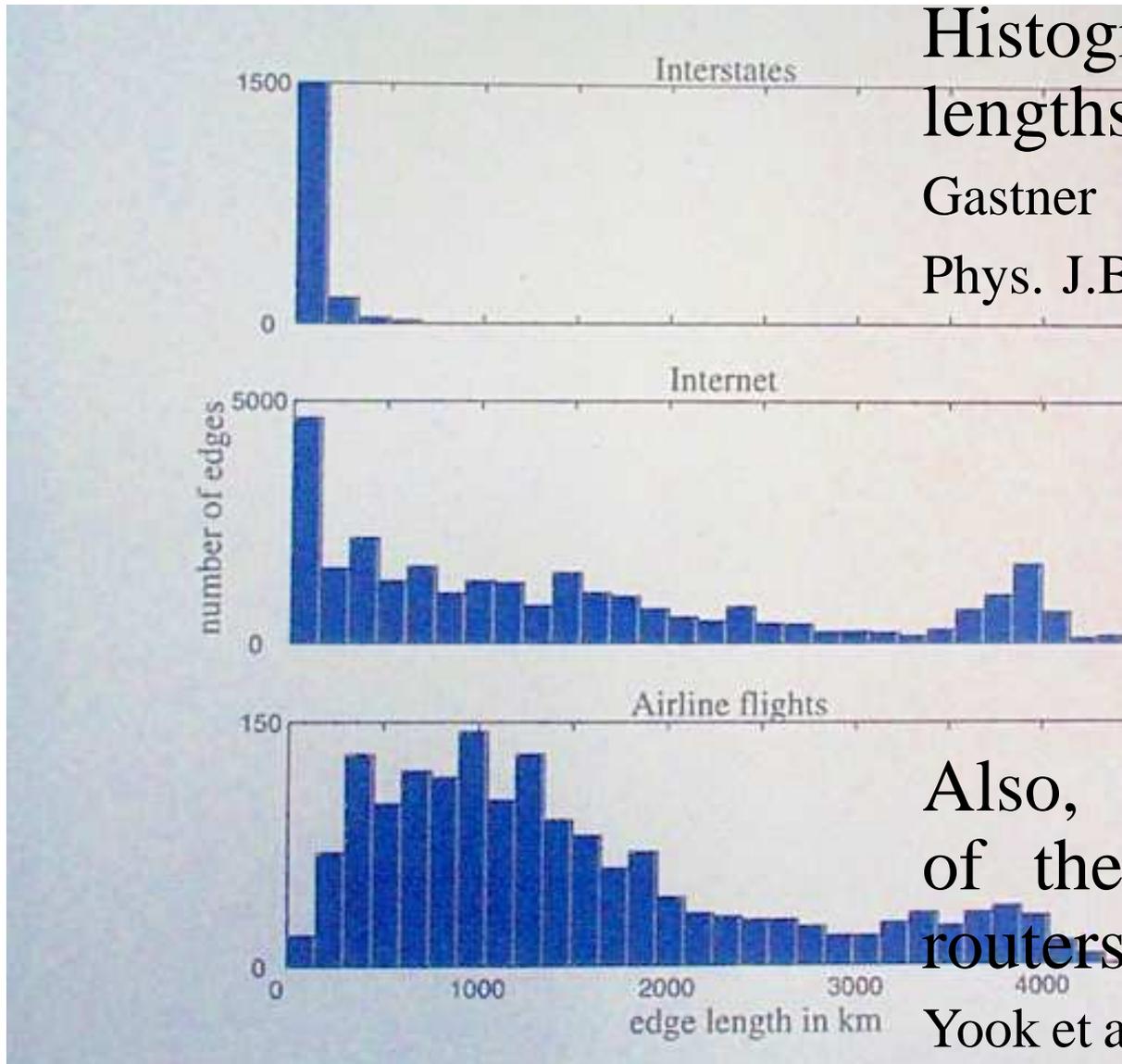
⇒ However, most of SF net models were irrelevant to a geographical space.

## 2. Geographical SF Nets

Many real nets have not only **scale-free** but also **geographical** heterogeneity:

- The Internet, power-grid, and airline-flight connections, etc. are **embedded in a metric space**
- Nodes are usually concentrated in a urban city (there are **dense and sparse areas** on the earth)
- Especially for wireless communication, **planarity** is suitable
- Majority of **links are short** due to economical reasons for the construction and maintenance costs

## 2-1. Rare Long-range Links



Histograms of the lengths of links

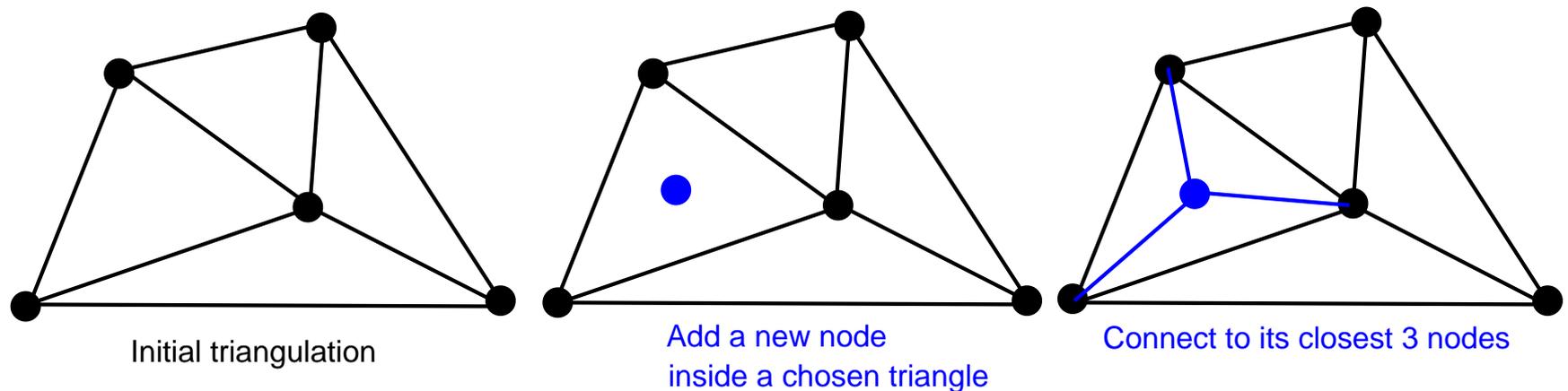
Gastner and Newman, Eur. Phys. J.B 49, 2005

Also, the length dist. of the links between routers:  $P(l) \sim l^{-1}$

Yook et al., PNAS 99, 21, 2002

## 2-2. Random Apollonian Net

Configuration: iterative subdivision of a randomly chosen triangle from an initial triangulation

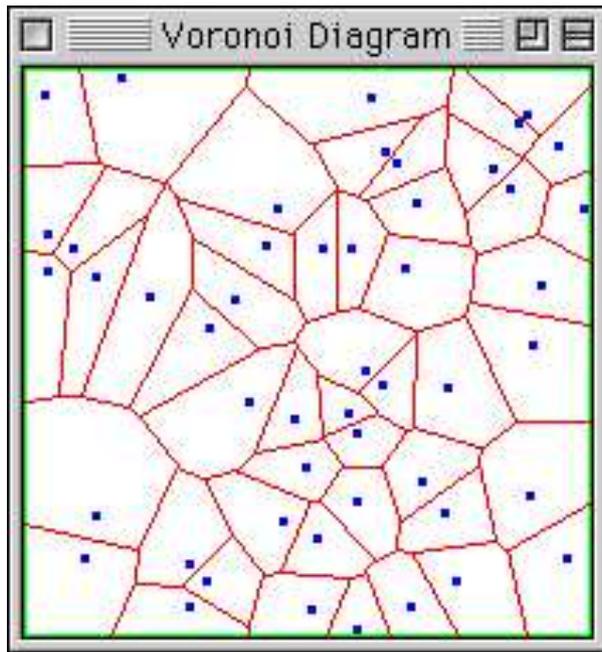


⇒ Some **long-range links naturally appear** in narrow collapsed triangles near the boundary edges

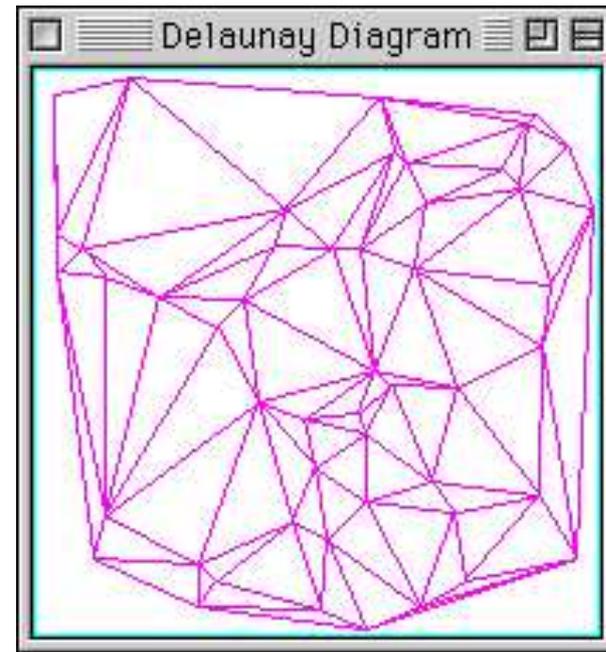
Zhou, Yan, Wang, Phys. Rev. E 71, 2005

## 2-3. Voronoi and Delaunay

Optimal triangulation in some geometric criteria:  
maximim angle, minimax circumcircle, **short path length in the same order as the direct Euclidean dist.**



→  
Dual Graph  
←

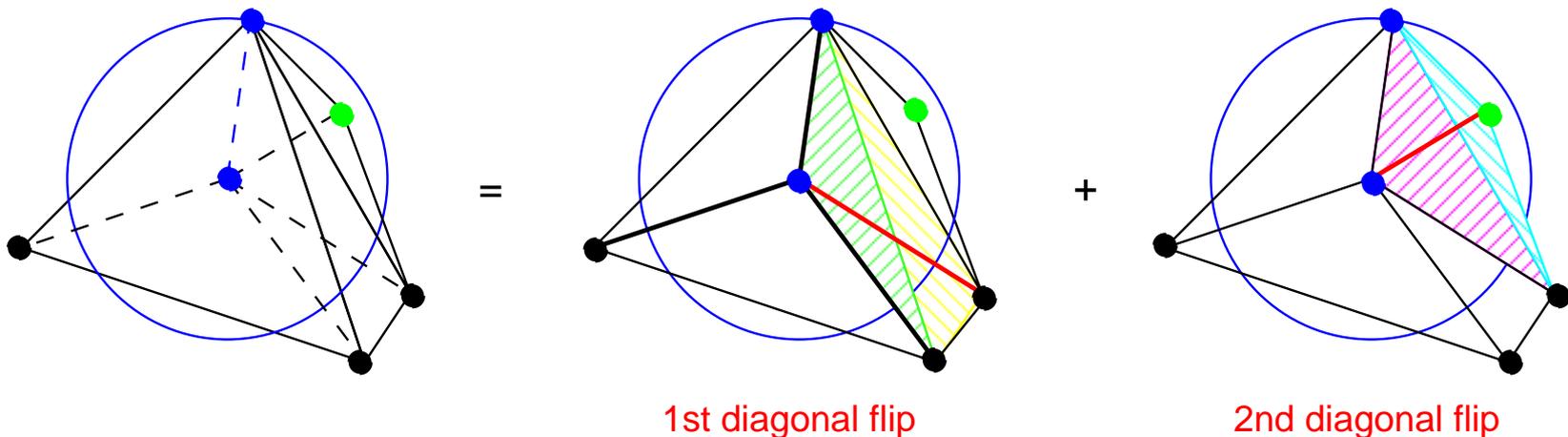


⇒ Consider the combination of RA (by triangulation on a plane) and DT **to avoid the long-range links**

## 2-4. Delaunay-like SF Net

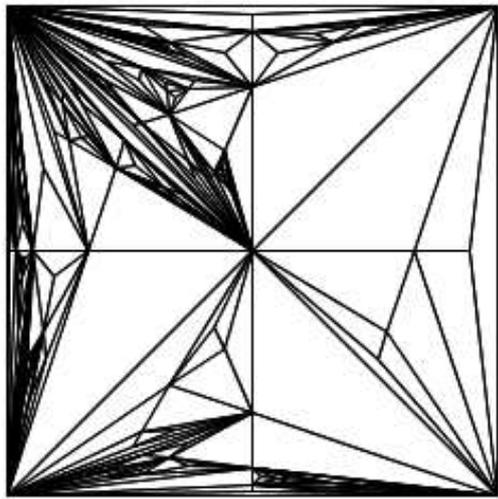
We propose DLSF:

- Set an initial planar triangulation.
- Select a triangle at random and add a **new node** at the barycenter. Then, connect the new node to its three nodes tentatively. By **iteratively applying diagonal flips**, connect it to **the nearest node(s)** within a **radius** as a localization.

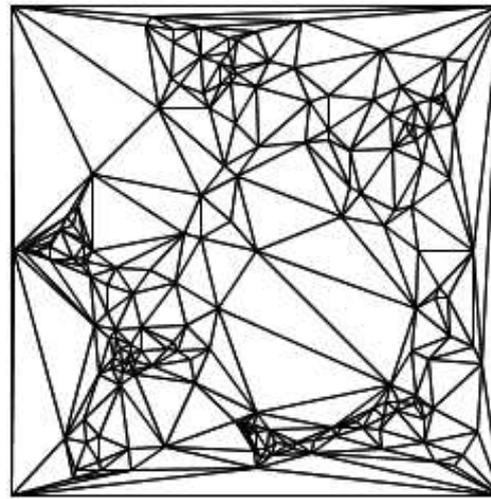


## 2-5. Topological Structure

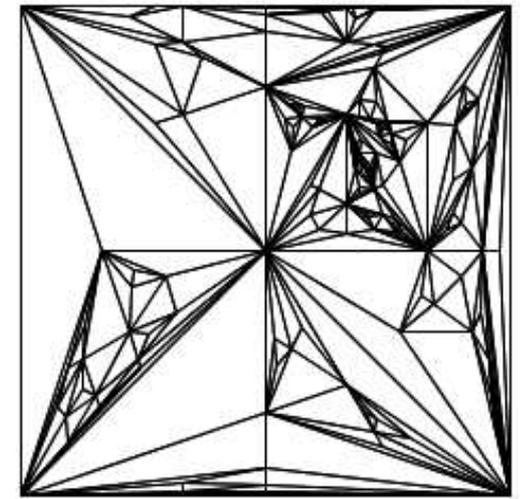
DLSF has the intermediate structure



RA



DT

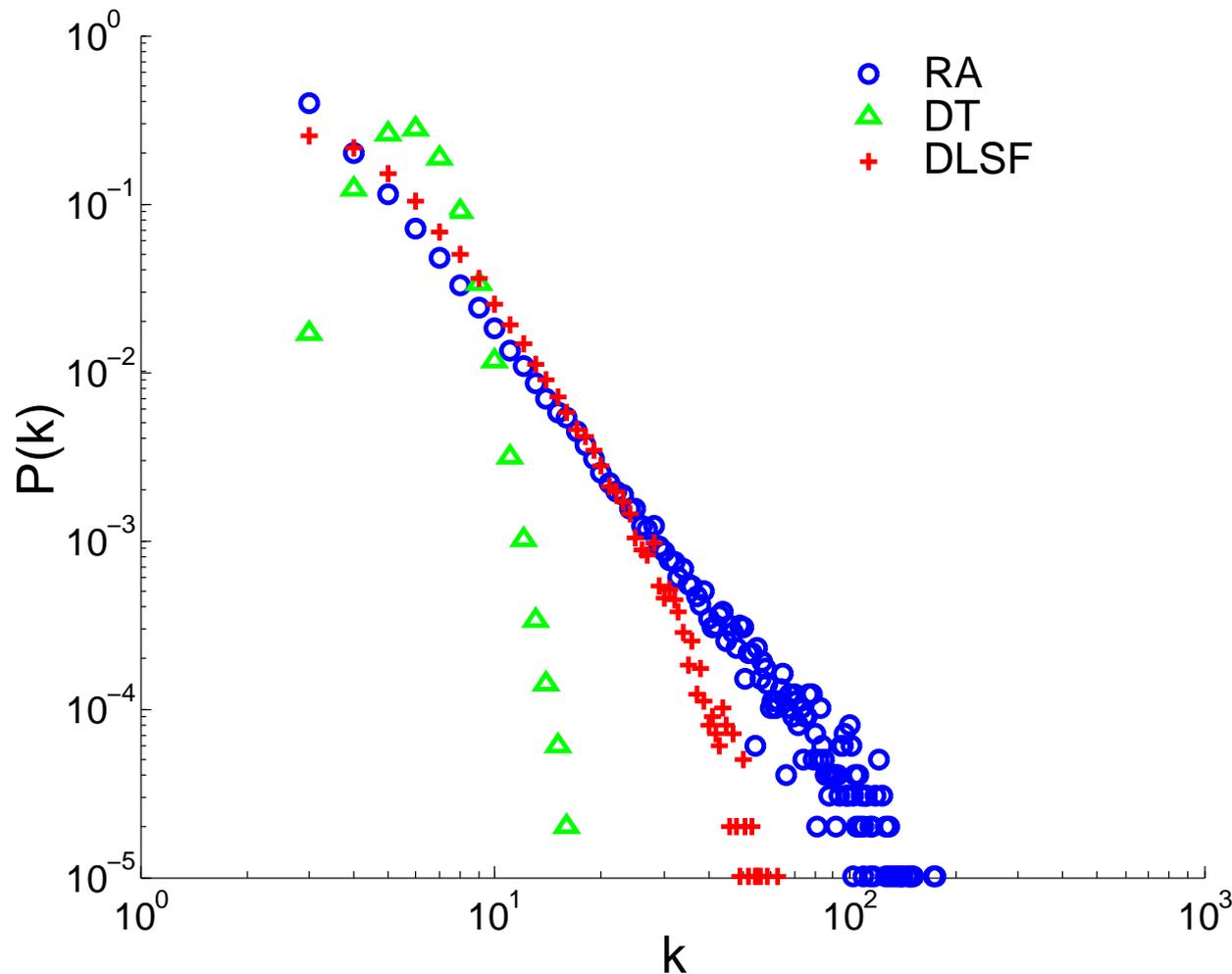


DLSF

We should remark that there exists

- mixing of dense and sparse areas as similar to a population density
- star-like stubs at four corner and the center nodes

## 2-6. Degree Distribution



**RA**: power law, **DT**: lognormal, **DLSF**: power law with exponential cutoff (the deg. of hubs are reduced)

# 3. Improvement of Robustness

SF nets are **extremely vulnerable for the intentional attacks on hubs**

R. Albert, and A.-L. Barabási,  
Nature 406, 378, 2000

⇒ It's **further affected by geographical constraints**, such as local cycles.



## 3-1. Theoretical Prediction

The breaking of connectivity for random failures becomes more serious by small-order cycles

On the assumpt. of a tree  $L_c = 0$ , the percolation threshold  $q_c^* = \langle k \rangle / (\langle k^2 \rangle - \langle k \rangle)$  is well-known.



It is generalized to any cycle length e.g.  $L_c = 3$ ,

$$q_c = \frac{\langle k \rangle}{\langle k(k-1) \rangle - \left(1 - q_c \frac{\langle k(k-2) \rangle}{\langle k \rangle}\right) \langle C(k)k(k-1)^2 \rangle},$$

$1 - f_c = q_c > q_c^*$  predicts decreasing of robustness.

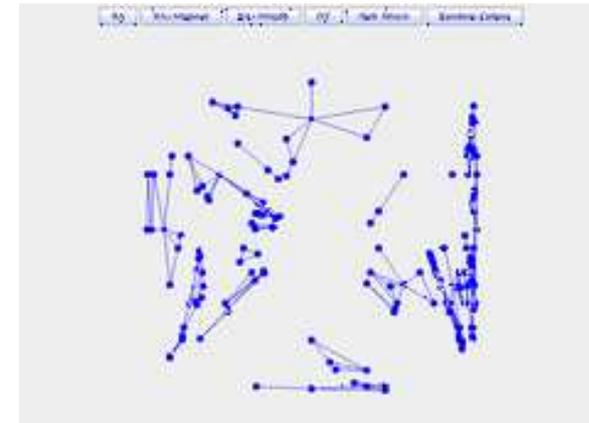
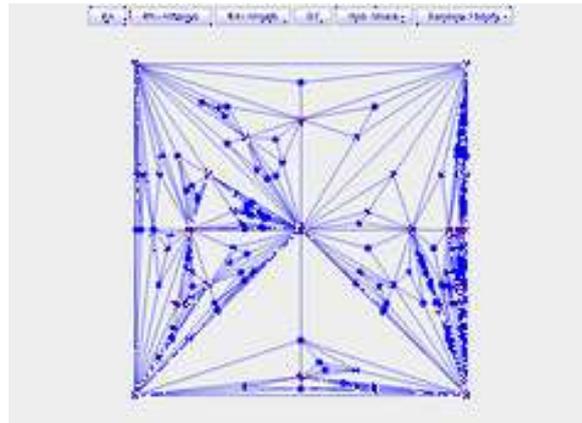
Huang et al., Europhy. Lett. 72, 2005 & PRE 75, 2007

# 3-2. Damages by Attacks

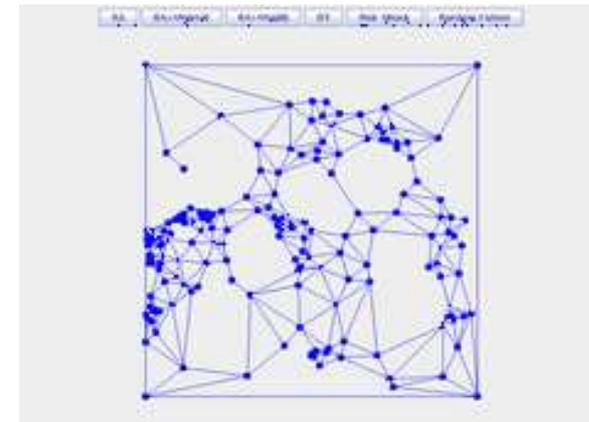
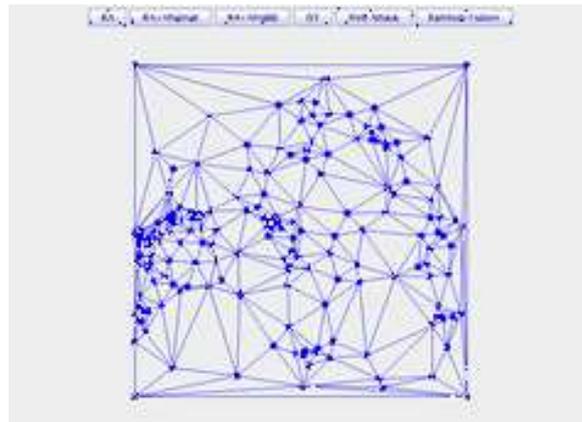
Initial N=200

targeted attacks on  
16 hubs

RA



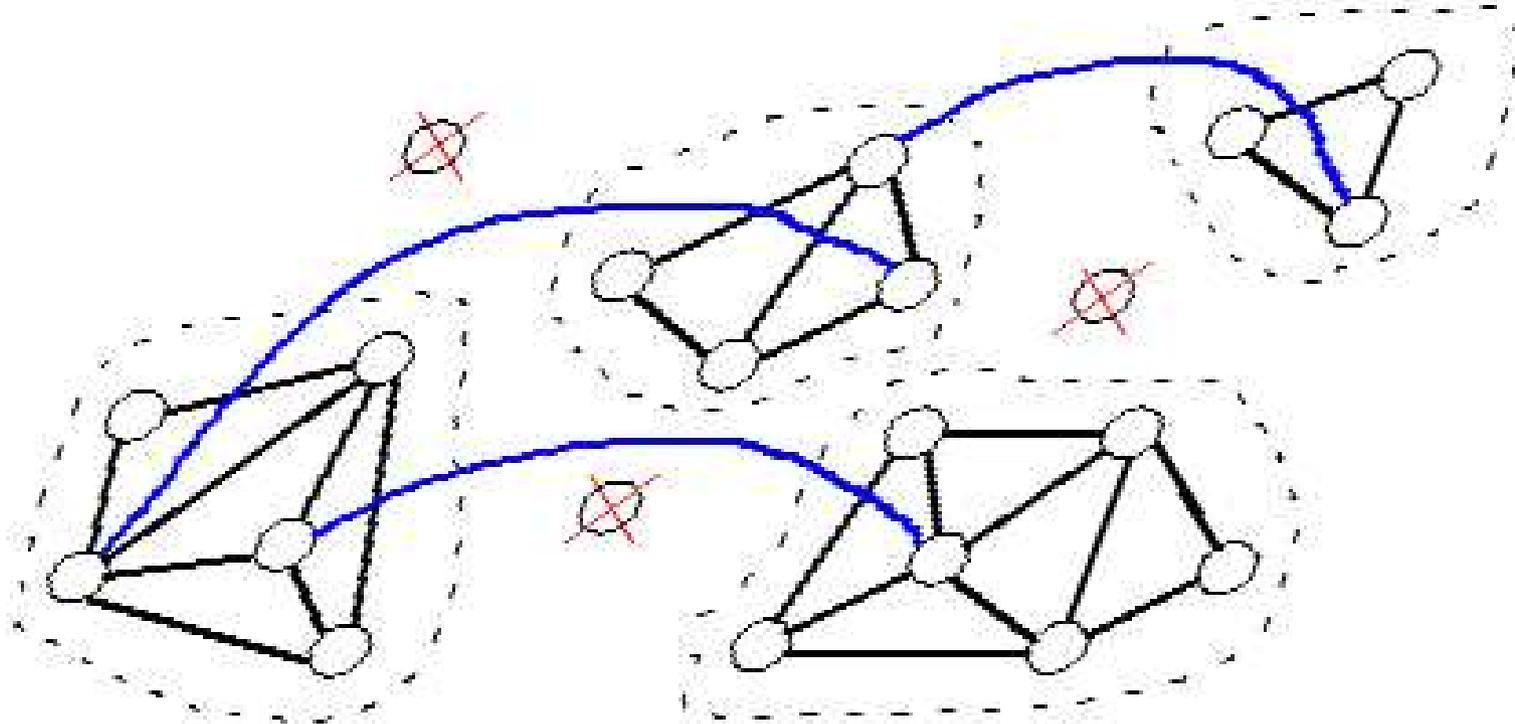
DT



Vulnerable RA broken to many isolated clusters

## 3-3. Overhead Bridge

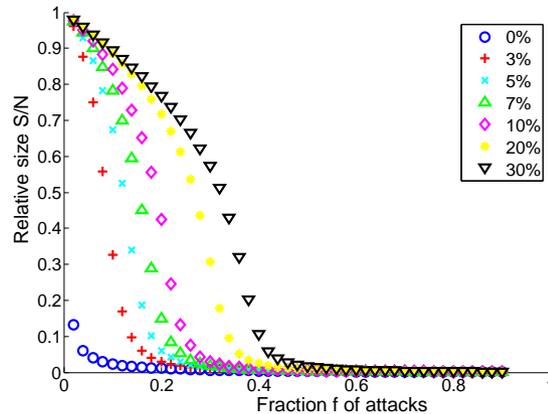
The effect of adding shortcuts on the robustness



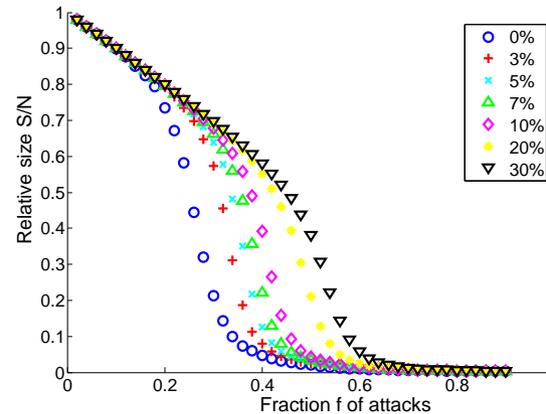
⇒ To bridge the isolated areas on the plain

# 3-4. Giant Component

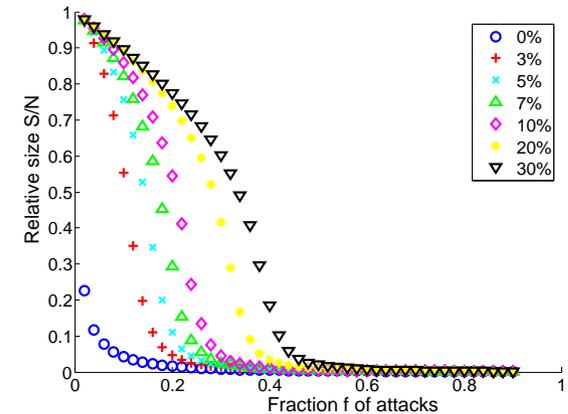
Relative size  $S/N$  of the GC vs. fraction  $f$  of attacks



RA



DT



DLSF

Hayashi et. al., Physica A 380, 2007

⇒ The robustness is improved remaining with a bigger GC from ○ 0 % to ▽ 30 % of the shortcuts rate

## 3-5. Hetero. Communication

Spatially heterogeneous communication

Assumed that both source and terminal are chosen in uniformly random from all nodes at every time step.

However **the spatial distribution of packet generation and receiving** is remarkably heterogeneous

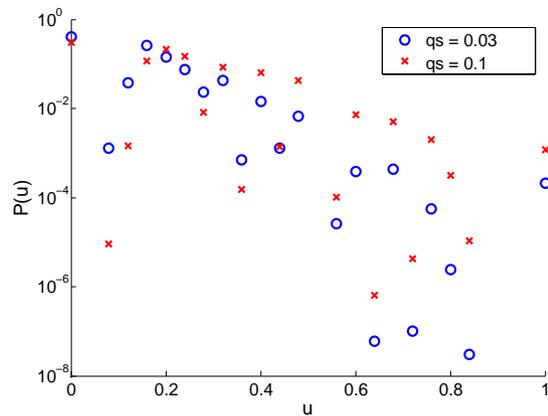
- Dense area  $\leftrightarrow$  much more communication
- Sparse area  $\leftrightarrow$  few frequent one

according to the geographical configuration of nodes.

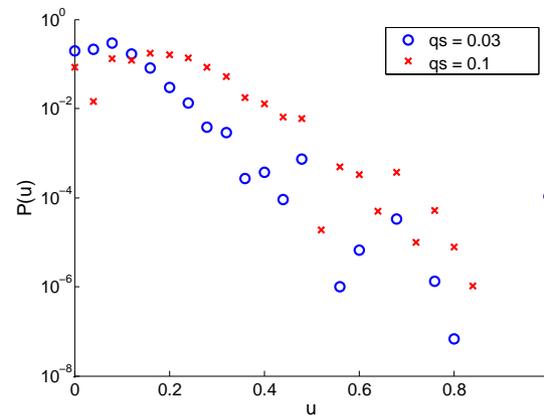
# 3-6. Superhighways

Consider the distribution  $P(u)$  of frequency of superhighways  $u \stackrel{\text{def}}{=} l_{super}/l_{short}$

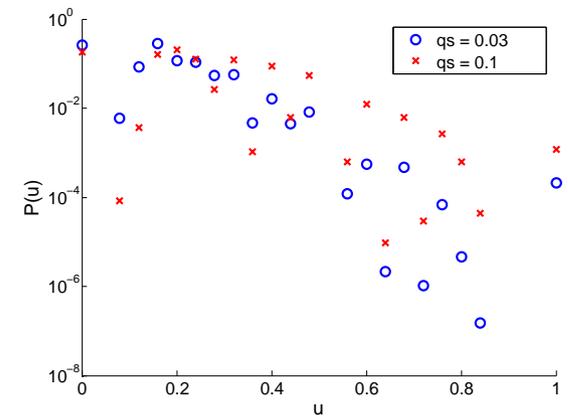
where  $l_{super}$  is the number of shortcuts in a given shortest path of length  $l_{short}$



RA



DT



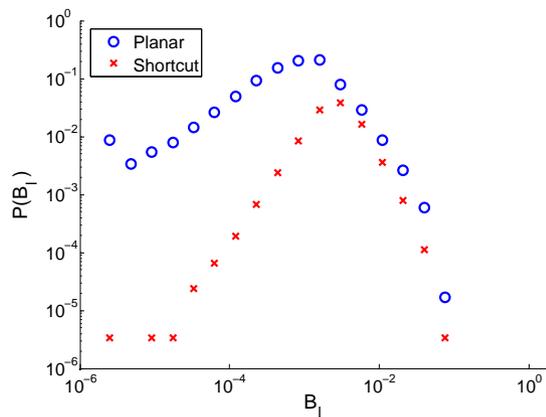
DLSF

⇒ High frequency in spite of only 3 or 10 % of the total

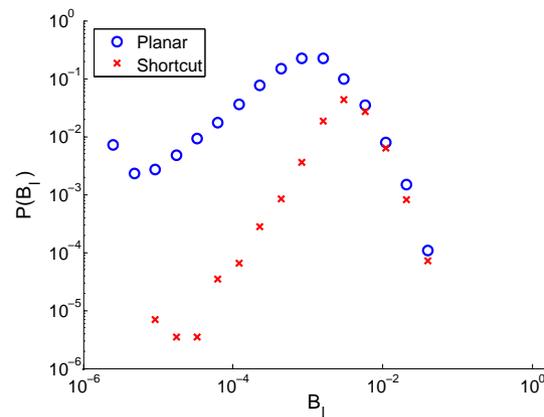
# 3-7. $P(B_l)$ of Link Centrality

Normalized betweenness centrality of link  $l$  on the shortest distant path between nodes  $j$  and  $k$

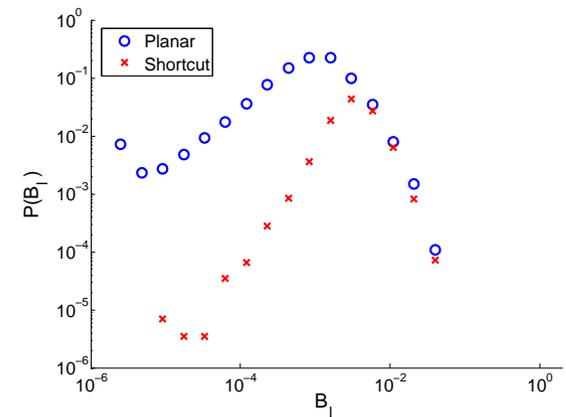
$$B_l \stackrel{\text{def}}{=} \frac{2}{(N-2)(N-3)} \sum_{k \neq j \neq l, 1, 2} \frac{b_k^j(l)}{b_k^j},$$



RA



DT



DLSF

⇒ The peak is righter for the shortcuts with higher  $B_l$

## 4. Summary: shortcut effects

Based on the realistic SF properties,

- we've proposed a modified model from RA in complex net. science and DT in computer science **to reduce long-range links** on a planar space for ad hoc networks.
- For the vulnerability to attacks caused by geographical constraints, it has been shown that **adding shortcuts of only about 10 % of the total improve it.**
- They also construct **a necessary backbone such as superhighways to bridge isolated clusters** (more contribute in the measures of frequency and centrality of links used on the shortest distant paths.)

# Thanks

Thank you for your kind attention !

Related papers: (see Ref. in the Proc.)

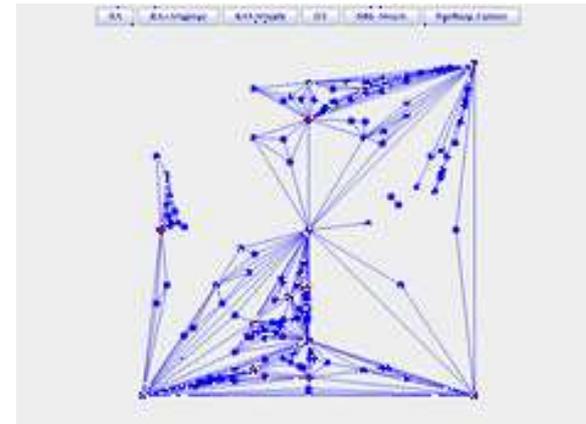
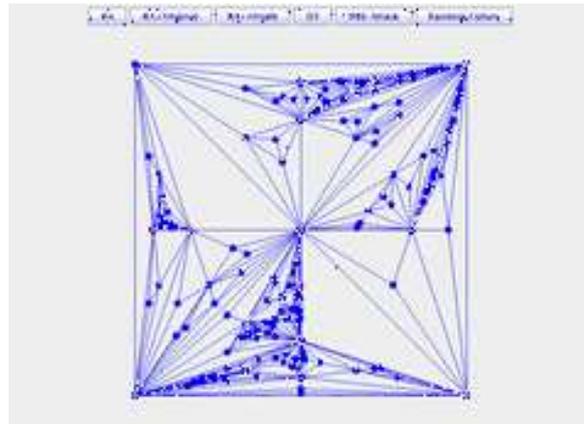
- Geographical effects on the path length and the robustness in complex networks, Physical Review E 73, 066113, (2006).
- Improvement of the robustness on geographical networks by adding shortcuts, Physica A 380, 552-562, (2007).

# A1. Damages by Failures

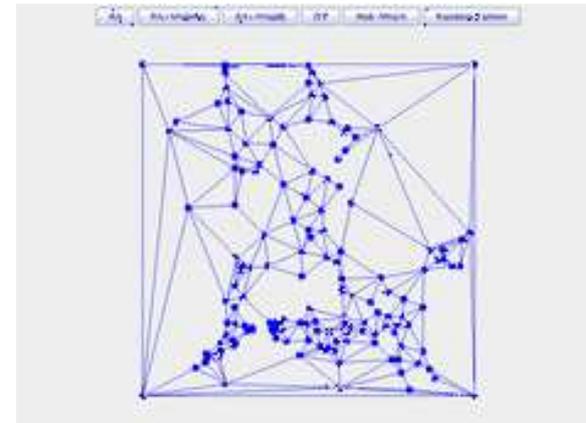
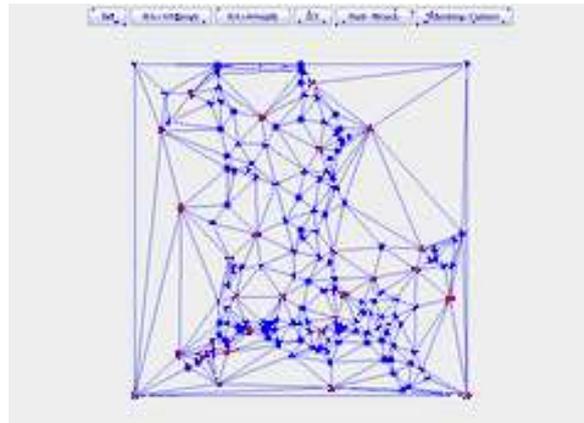
Initial N=200

randomly removed  
32 nodes

RA



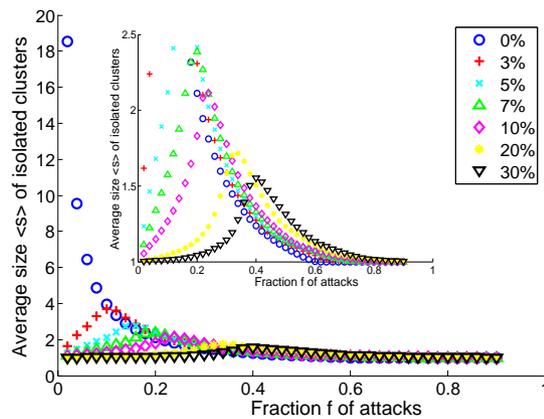
DT



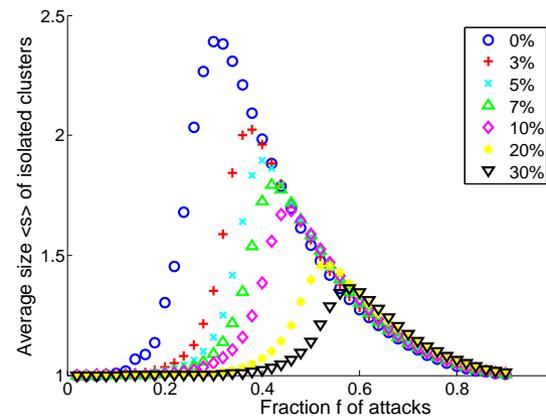
Similarly remained connectivity in the GC

# A2. Breaking of GC at the Peak

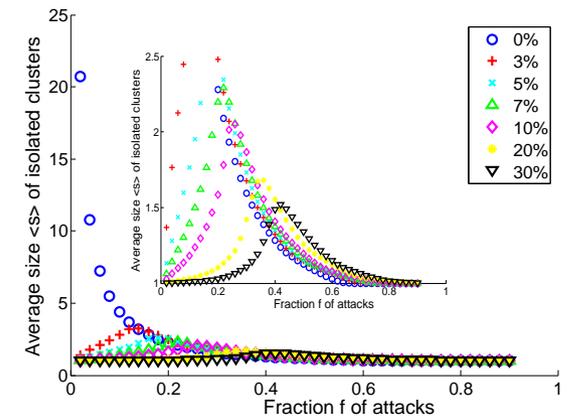
Average size  $\langle s \rangle$  of isolated clusters except of the GC vs. fraction  $f$  of attacks



RA



DT

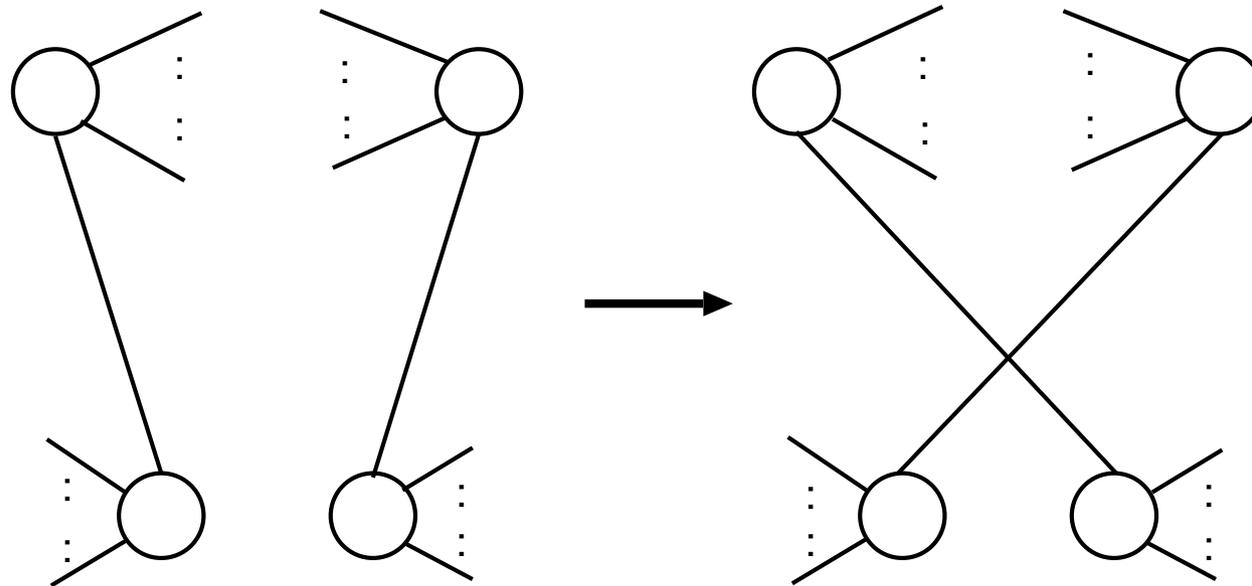


DLSF

Inset shows the peaks enlarged by other scale of the vertical axis. The robustness is more improved by larger shortcut rate (from  $\bigcirc$  0 % to  $\nabla$  30 %).

# A3. Randomly Rewired Nets

We compare the tolerance to random failures of nodes and targeted attacks on hubs in the geographical and non-geographical randomly rewired networks, when a fraction  $f$  of nodes is removed.

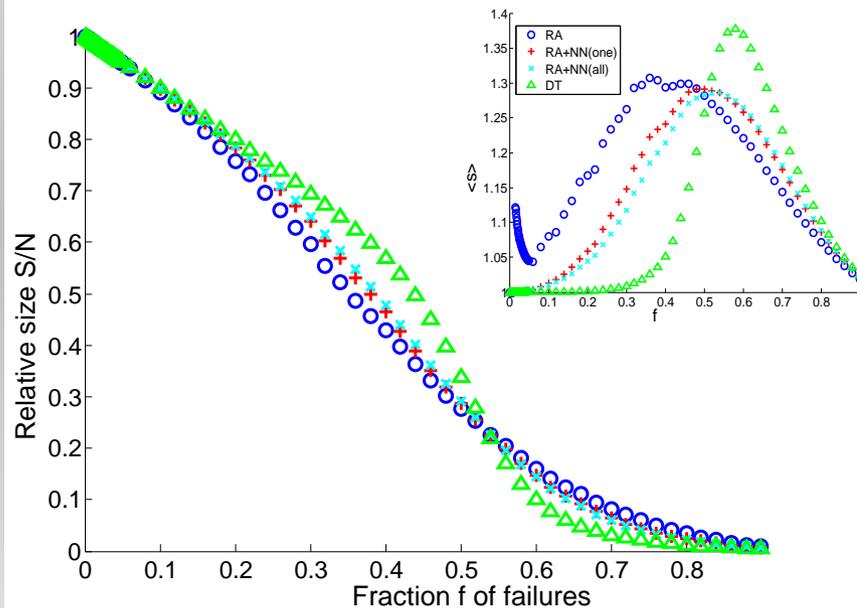


Rewiring a pair of links with the same degree at each node

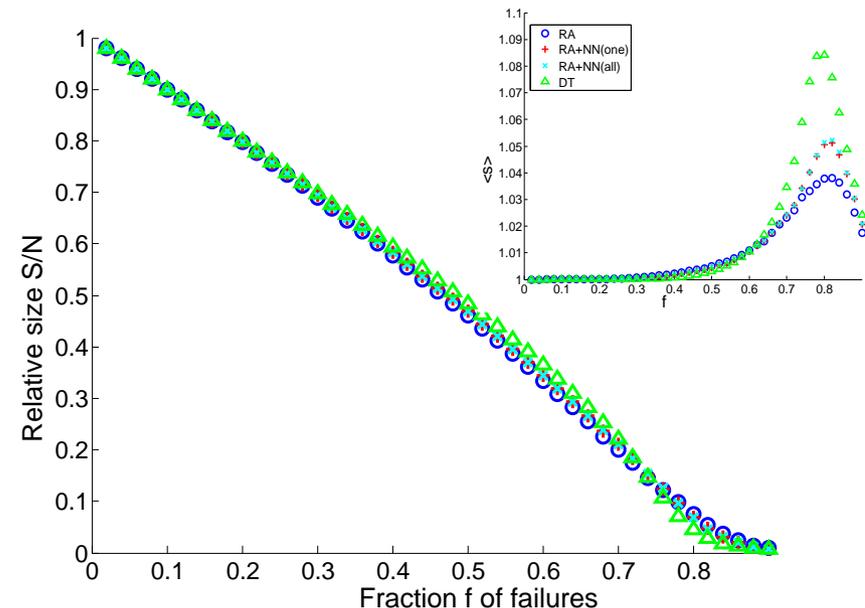
# A4. Tolerance to Failures

Relative size  $S/N$  of the giant component

Inset: the average size  $\langle s \rangle$  of isolated clusters



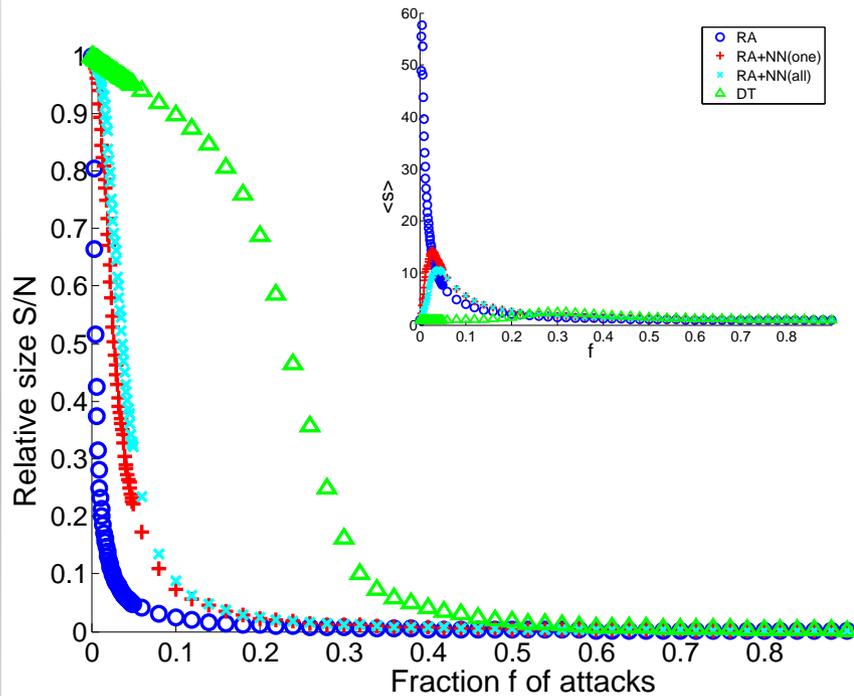
(a) geographical nets



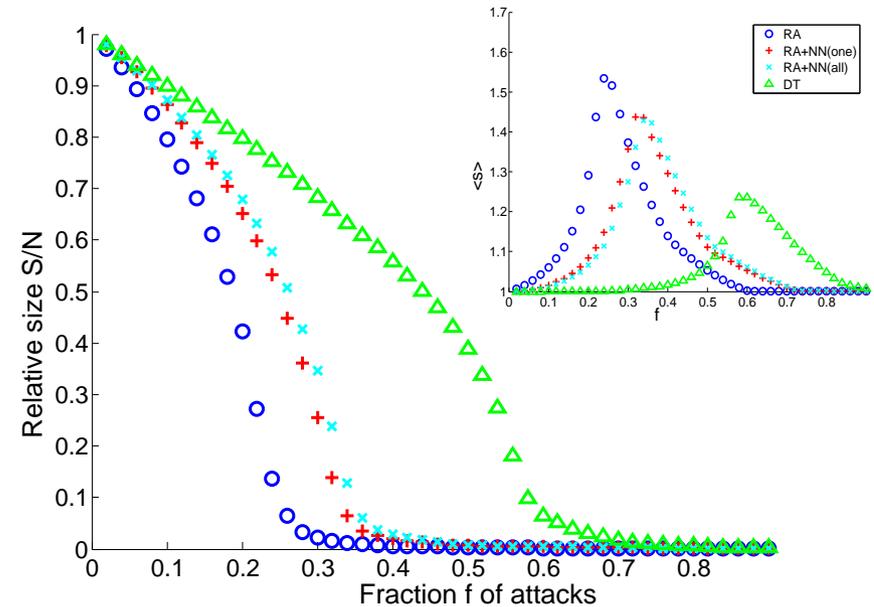
(b) rewired nets

⇒ Similar robustness in RA: ○, DT: △, DLSF: +

# A5. Tolerance to Attacks



(a) geographical nets



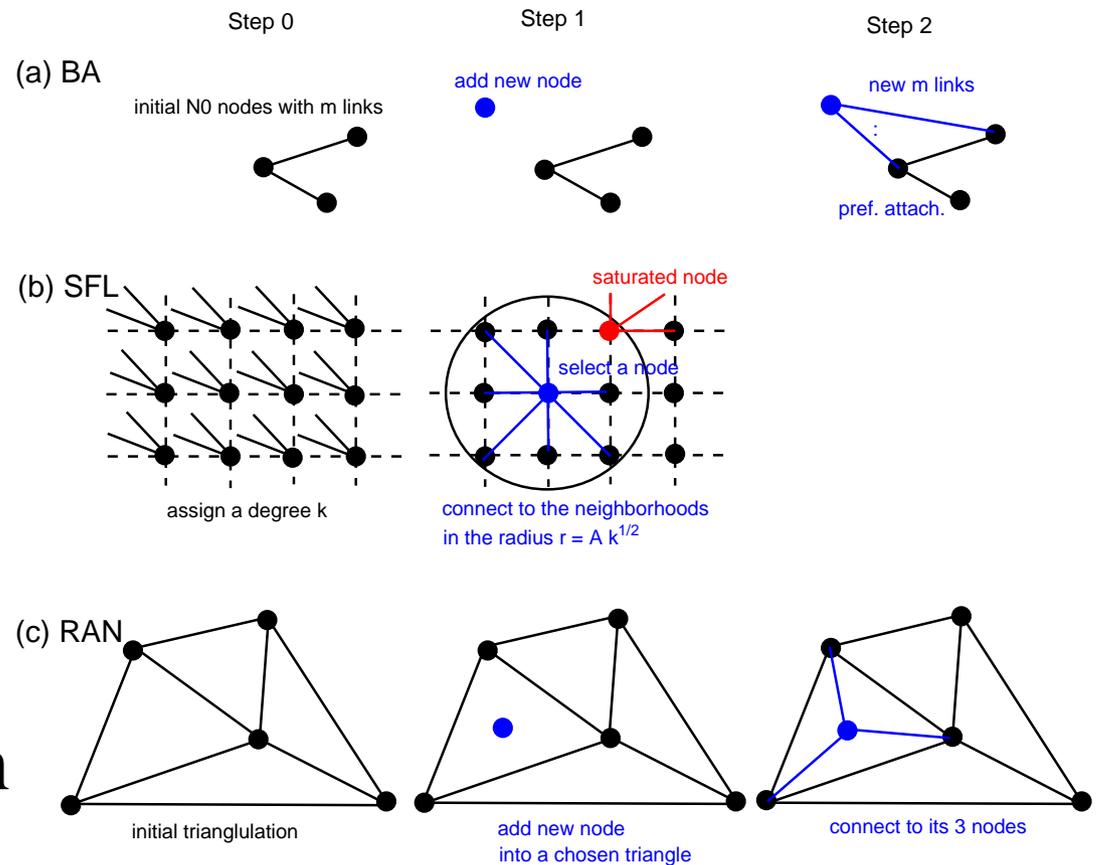
(b) rewired nets

⇒ Improvement from the extremely vulnerable RA

Hayashi et. al., PRE 73, 2006

# A6. Classes of Geo. SF Nets

- Modulated BA:  
 $\Pi_i \sim k_i \times l^\alpha$ ,  
**rand. position of node**
- SF on lattices:  
connect within  
 $r = A \times k_i^{1/d}$
- Space-filling:  
subdivision  
of a region  
**(heterogeneous dist. of nodes)**



# A7. Planarity and Shortness

class	planarity of net	shortness of links
<u>Modulated BA</u> Manna'02, Xulvi-Brunet'02	$\times$ $\exists$ crossing links (not prohibited)	$\bigcirc$ with disadvantaged long-range links
<u>SF on lattices</u> ben-Avraham'03, Warren'02	$\times$ cross of regular links and shortcuts	$\triangle$ $\exists$ long shortcuts from hubs
<u>Space-filling</u> Apollonian nets. Doye'05, Zhou'04	$\bigcirc$ by subdivision of a selected region	$\triangle$ $\exists$ long-range links in narrow triangles