

The background of the slide is a dark blue field filled with various shades of blue and white gear silhouettes of different sizes, some overlapping. On the left side, there is a vertical strip with a colorful, abstract, and somewhat pixelated texture in shades of orange, yellow, and brown.

# Highly Optimized Tolerance (HOT) Model in Internet Topology Generator

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# Outline

- ✦ Overview of topology generator.
- ✦ Highly Optimized Tolerance(HOT) Model.
- ✦ Our approach.
- ✦ Reference.

# Need for Internet topology generator

- ✦ The scale of the Internet is immense.
- ✦ Security reason.
- ✦ Researchers use generated random network topologies instead.
- ✦ Applied areas:
  - ✦ Routing and multicast protocols
  - ✦ Traffic dynamics
  - ✦ Protocol behavior
- ✦ ns-2

# Feature(s) of Internet topology

☀ ...

## ☀ Power-law vertex degree distributions

- ☀ Power-law are expressions of the form

$y \propto x^a$ , where  $a$  is a constant,  $x$  and  $y$  are the measures of interest, and  $\propto$  stands for “proportional to”.

☀ ...

# Physics Theories for the origin of Power-law

## ☀ Self Organized Criticality (SOC)

- Waxman
- Tiers
- GT-ITM
- BRITE
- Inet

## ☀ Highly Optimized Tolerance (HOT)

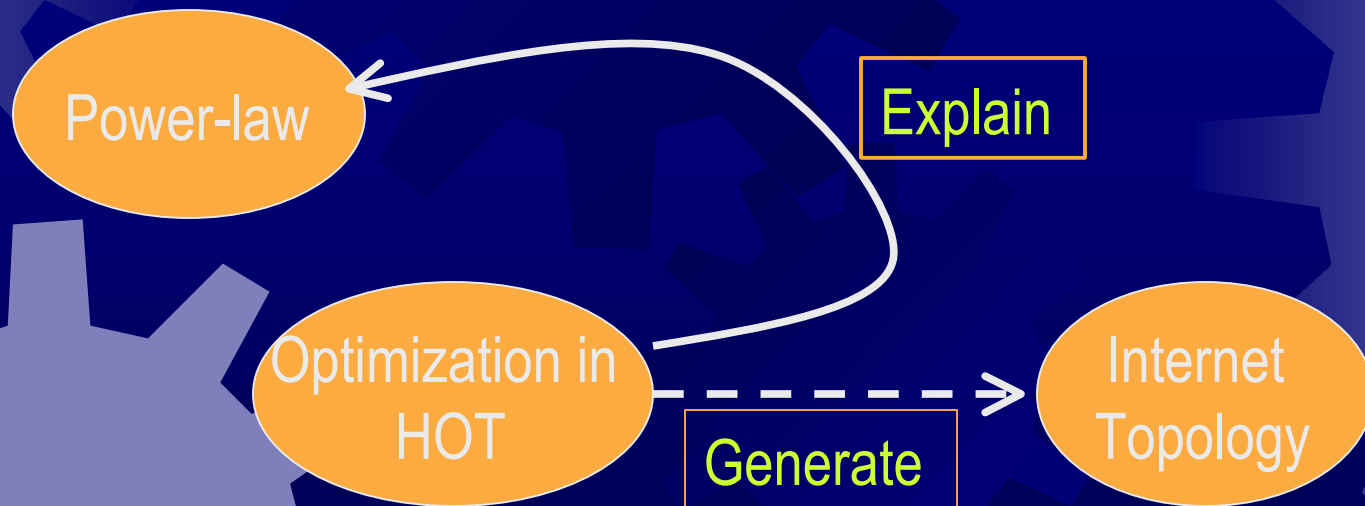
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# Characteristics of HOT

- ★ HOT system:
  - Efficient, high performance, and robust
  - Hypersensitive to design flaws and unanticipated perturbations
  - Nongeneric, specialized, structured configuration
  - Power law
- ★ These features arise as a consequence of optimizing a “design” objective in the presence of uncertainty and specified constraints.

# Our approach

- ★ Generate Internet topology in the process of optimization Web layout design which explains the origin of heavy tails in Web traffic.



## Our approach (Cont'd)

- ☀ Internet is a HOT-related system.
- ☀ Heavy tails appear in network traffic is related to power-laws.
  - ☀ A variable  $X$  follows a heavy tail distribution with  $P[X > x] = k^a x^{-a} L(x)$ , where  $k \in \mathfrak{R}^+$  and  $L(x)$  is a slowly varying function:  
 $\lim_{t \rightarrow \infty} [L(tx)/L(x)] = 1.$

# A simple example of HOT--PLR

- ✦ Probability-loss-resource(PLR) problem.
  - ✦ Loss: Cost associated with each event in a developing system.
  - ✦ Resource: Elements to limit loss.
  - ✦ Probability: Event probability.

# A simple example of HOT-- PLR (Cont'd)

- ★ Objective: To minimize cost by optimization the “design” objective.
- ★ Key function  $l_i = f(r_i)$  s.t. resource( $r_i$ ) acts to limit the cost of events( $l_i$ ). And  $l_i \propto r_i^{-\beta}$ .
- ★ Functional result:  $p_i = c_1(l_i + c_2)^{-(1+1/\beta)}$   
( $p_i$ =noncumulative probability distribution,  $c_1, c_2$ =free parameters)

# Introduction of our approach

- ✦ Consider a Web site modeled as a directed graph  $(V, E)$ , where:
  - ✦ Node  $V_i (i=1 \dots N)$  represents a Web page.
  - ✦ Directed edge  $E_{ij}$  represents a hyperlink pointing from page  $V_i$  to page  $V_j$ .
- ✦ The goal is to minimize the download time user experiences when accessing each Web page.

## Introduction (Cont'd)

- ★ Associate “design” with subdivision of large documents into files.
- ★ The size of events ( $l_i$ ) are file lengths.
- ★ Noncumulative probability distribution ( $p_i$ ) are determined by user navigation pattern in the file.
- ★ The cost  $J = \sum p_i l_i$  is the average delay a user experiences in downloading files.
- ★ The resources  $r_i$  divide the document into files, where large  $r_i$  correspond to small files and vice versa.

# Details

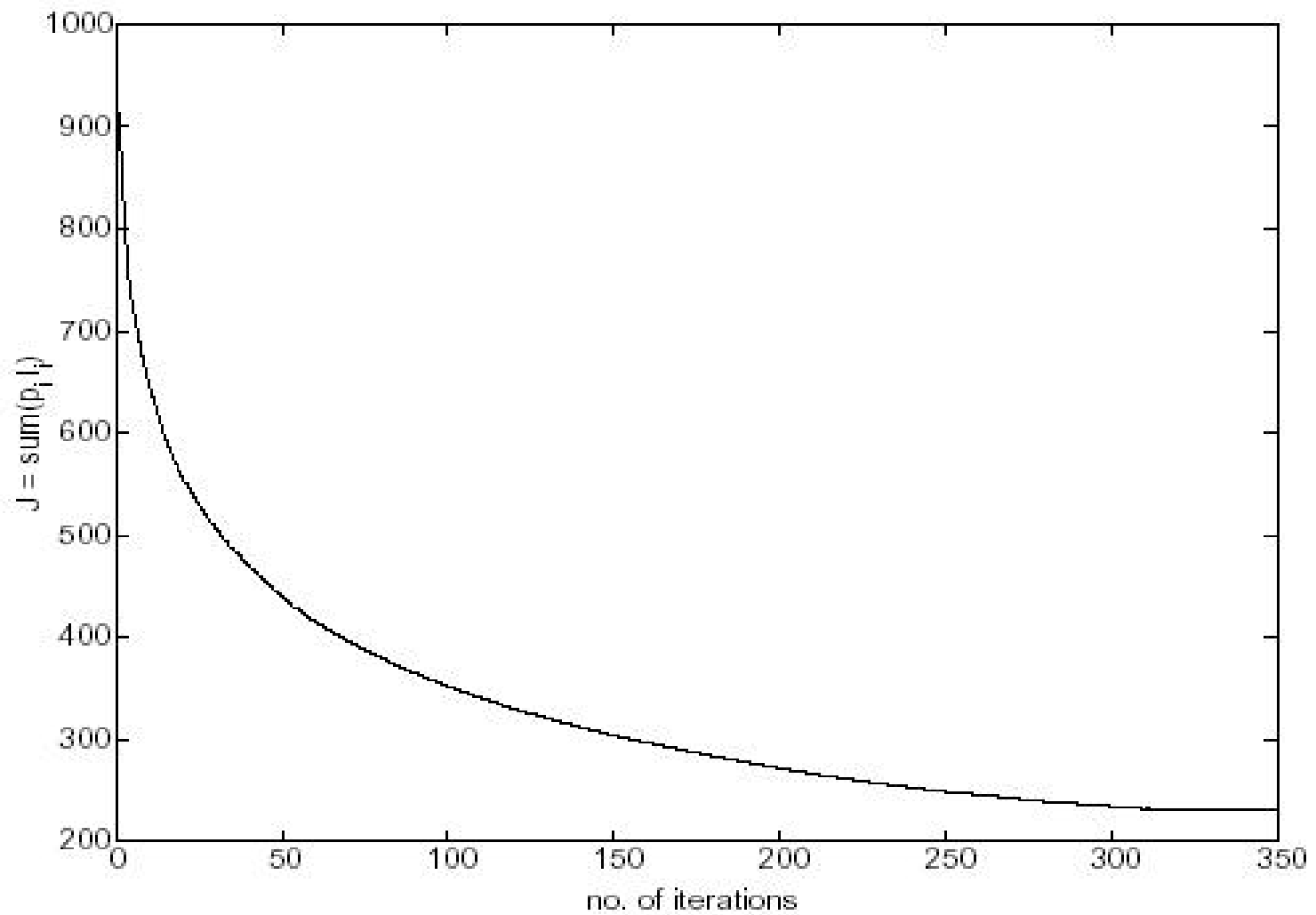
## ✦ Initialization of the Graph Model

- ✦ Wax man's network model as the initial topology graph.
- ✦ Markov chain as the user navigation pattern.
- ✦ Exponential distributions for file sizes  $l_i$

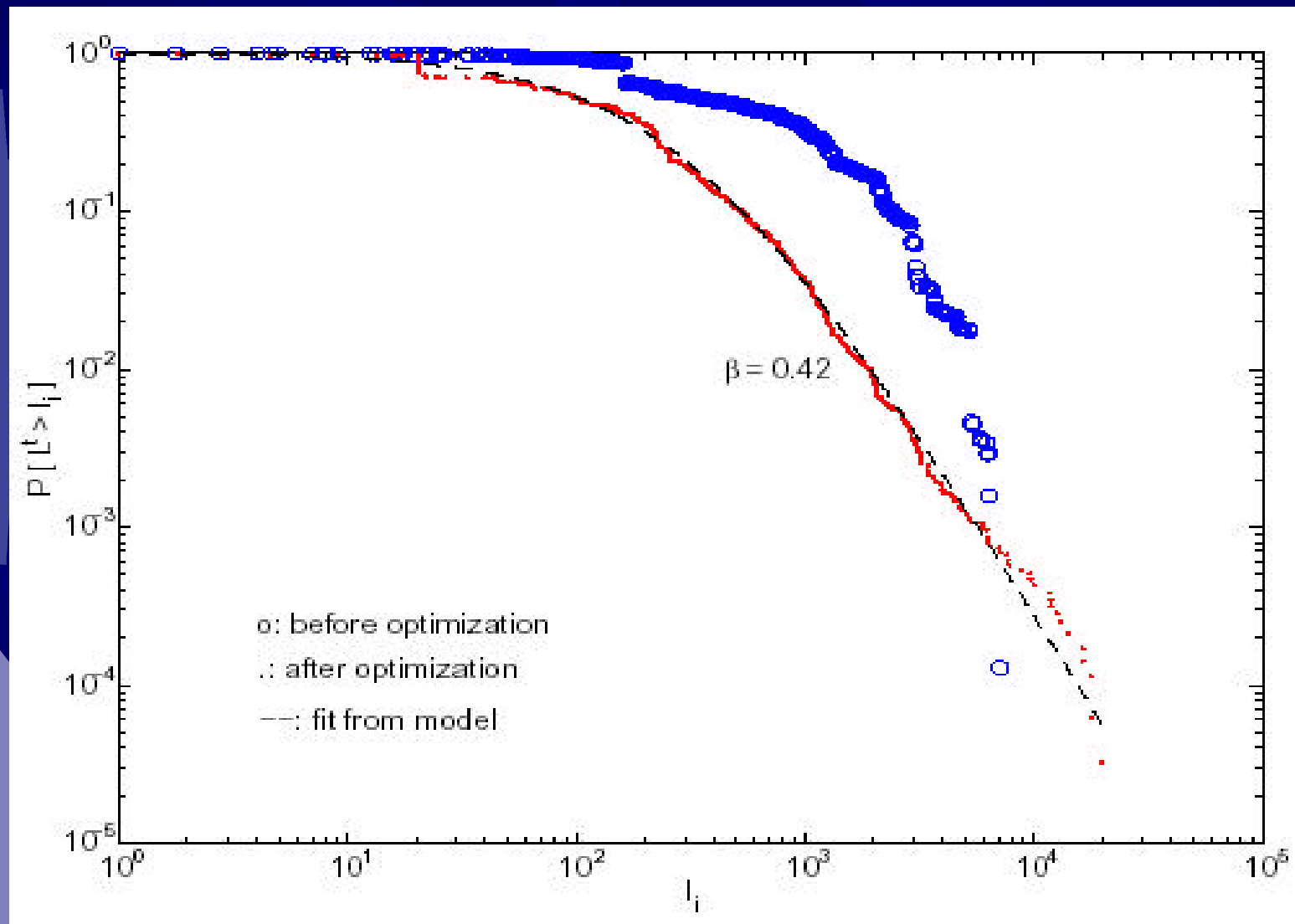
## ✦ Heuristic Optimization

- ✦ Splitting: split vertex with the highest  $p_i l_i$ .
- ✦ Merging: merge 2 vertices after 1 splitting.
- ✦ Iteration: stop till the improvement of  $J$  is within a certain tolerance level or the # of iterations reaches a preset maximum.

# Paper Result



# Paper Result (Cont'd)



# Paper Result (Cont'd)

✦ Hyperbolic function:

$$P_i = c_1 (l_i + c_2)^{-1/\beta}$$

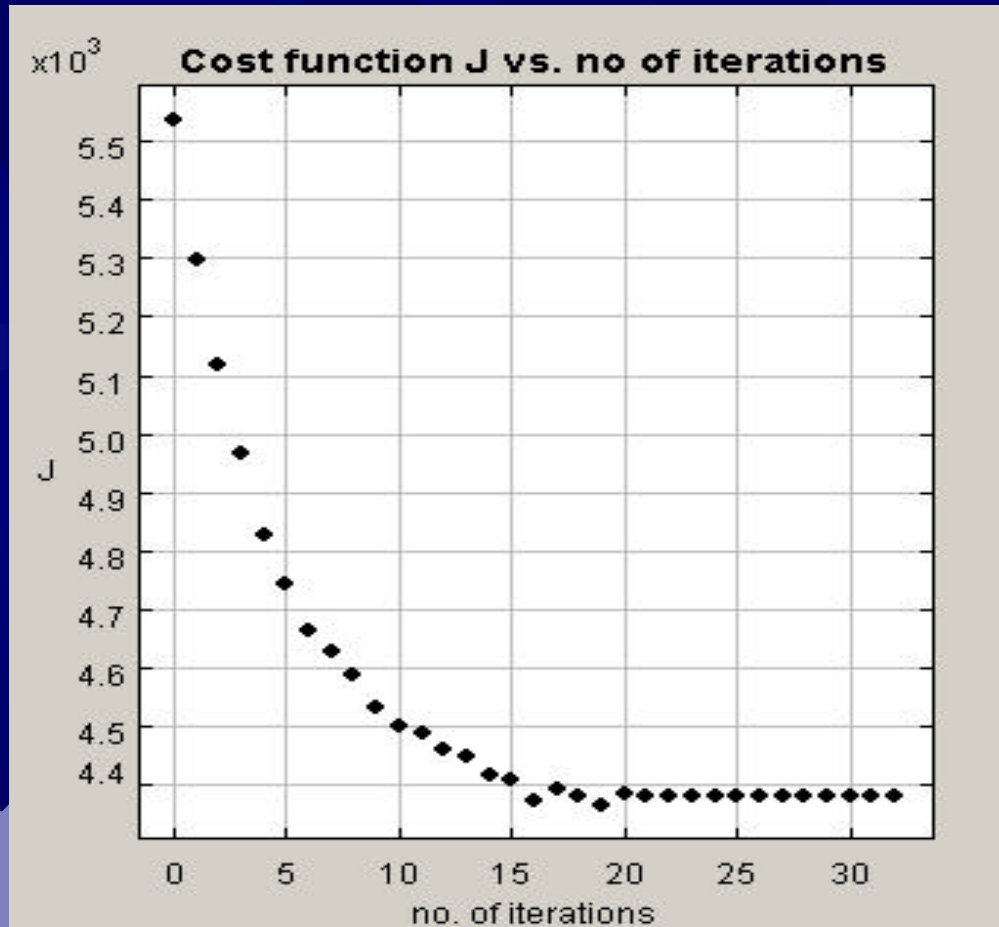
Cumulative probability  $P_i = \sum_{j \leq i} p_j$ ,

$$c_1 = 7.85 \cdot 10^5, \quad c_2 = 318.28, \quad \beta = 0.42$$



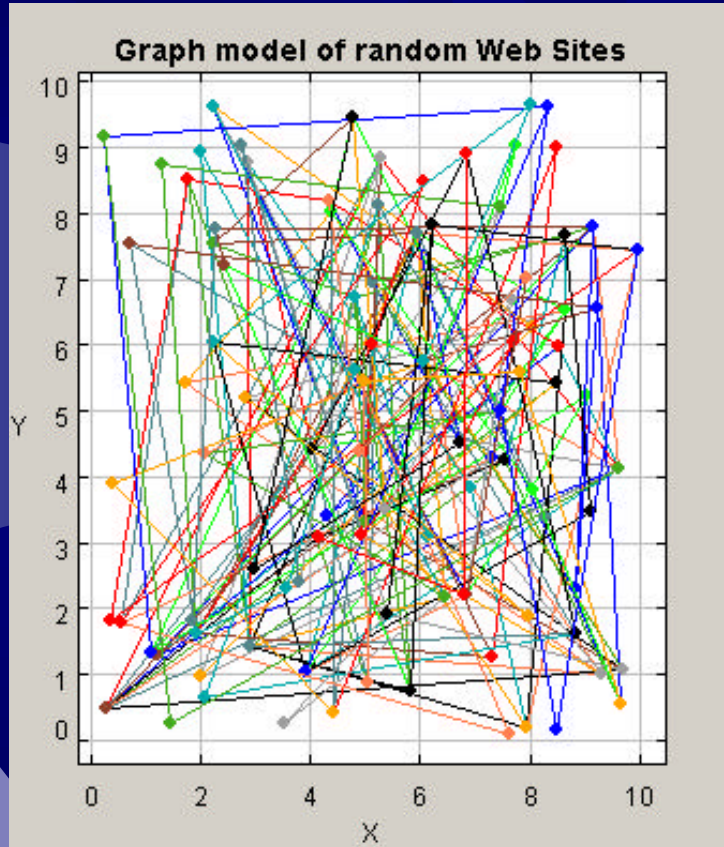
The required elements(nodes, links etc.) for a topology generator are computed during the process.

# Our Result

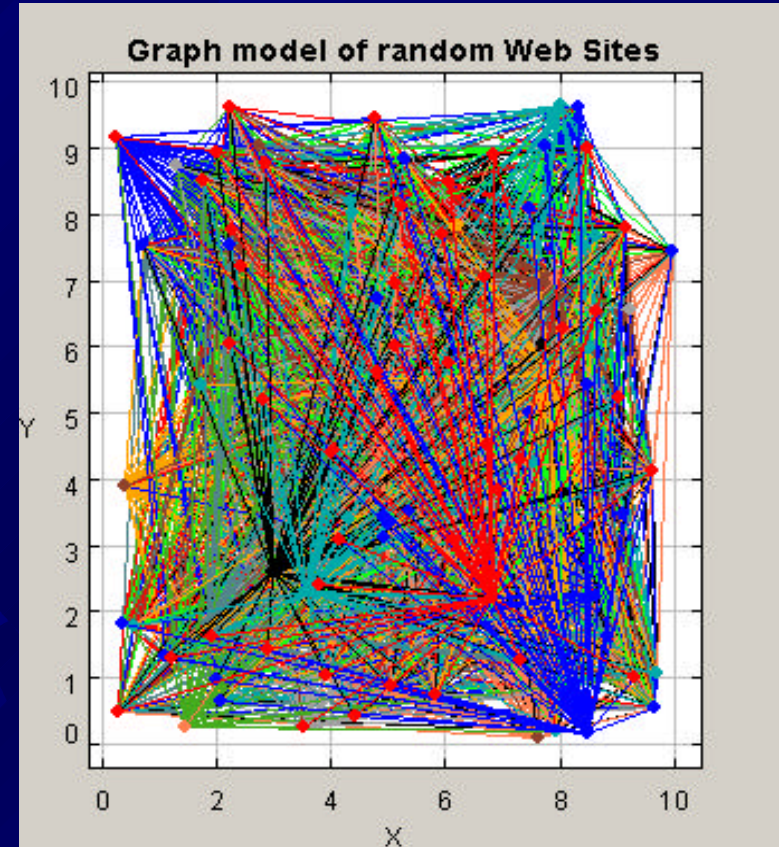


(100 nodes)

# Our Result (Cont'd)

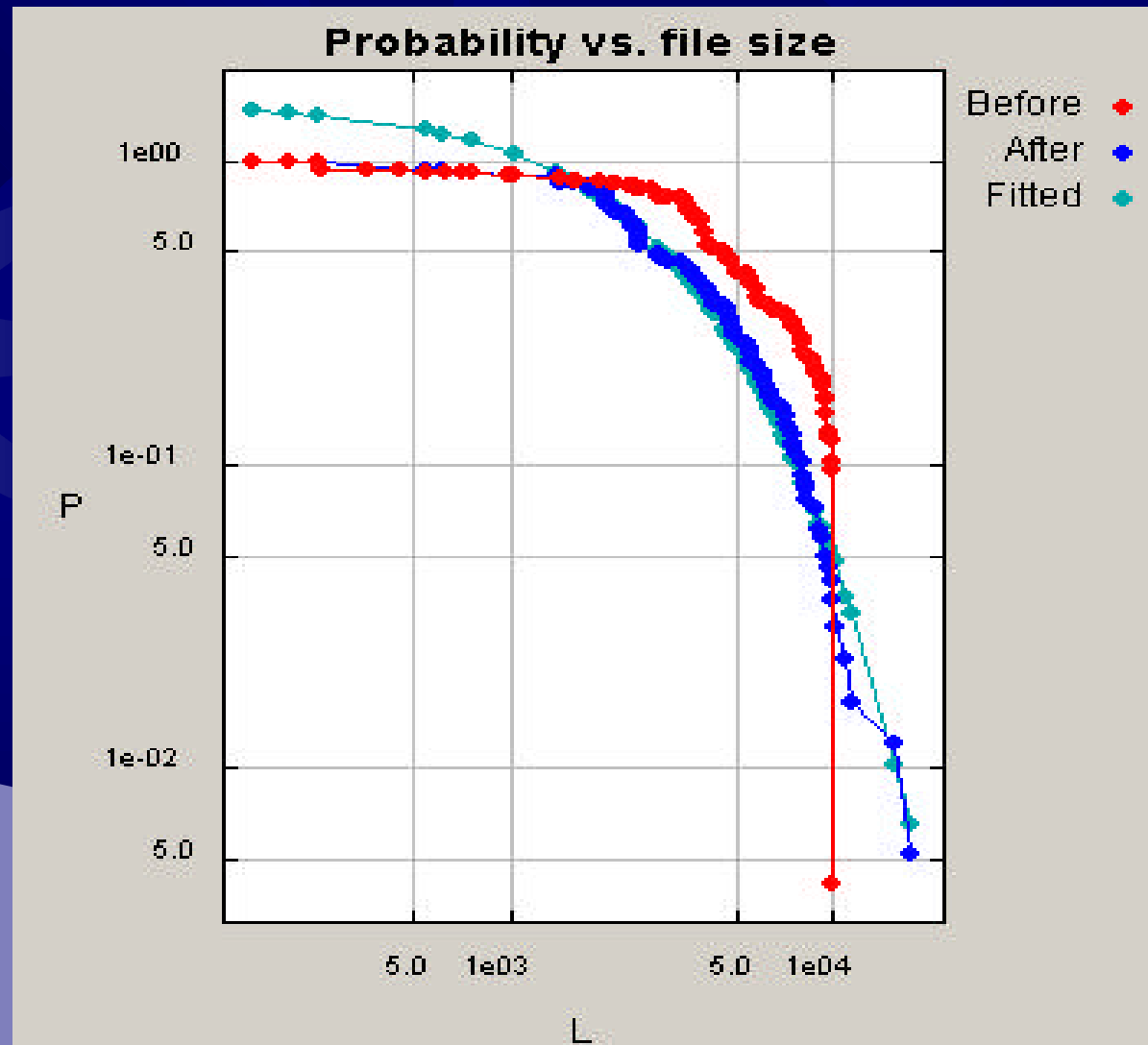


(Before Optimization)

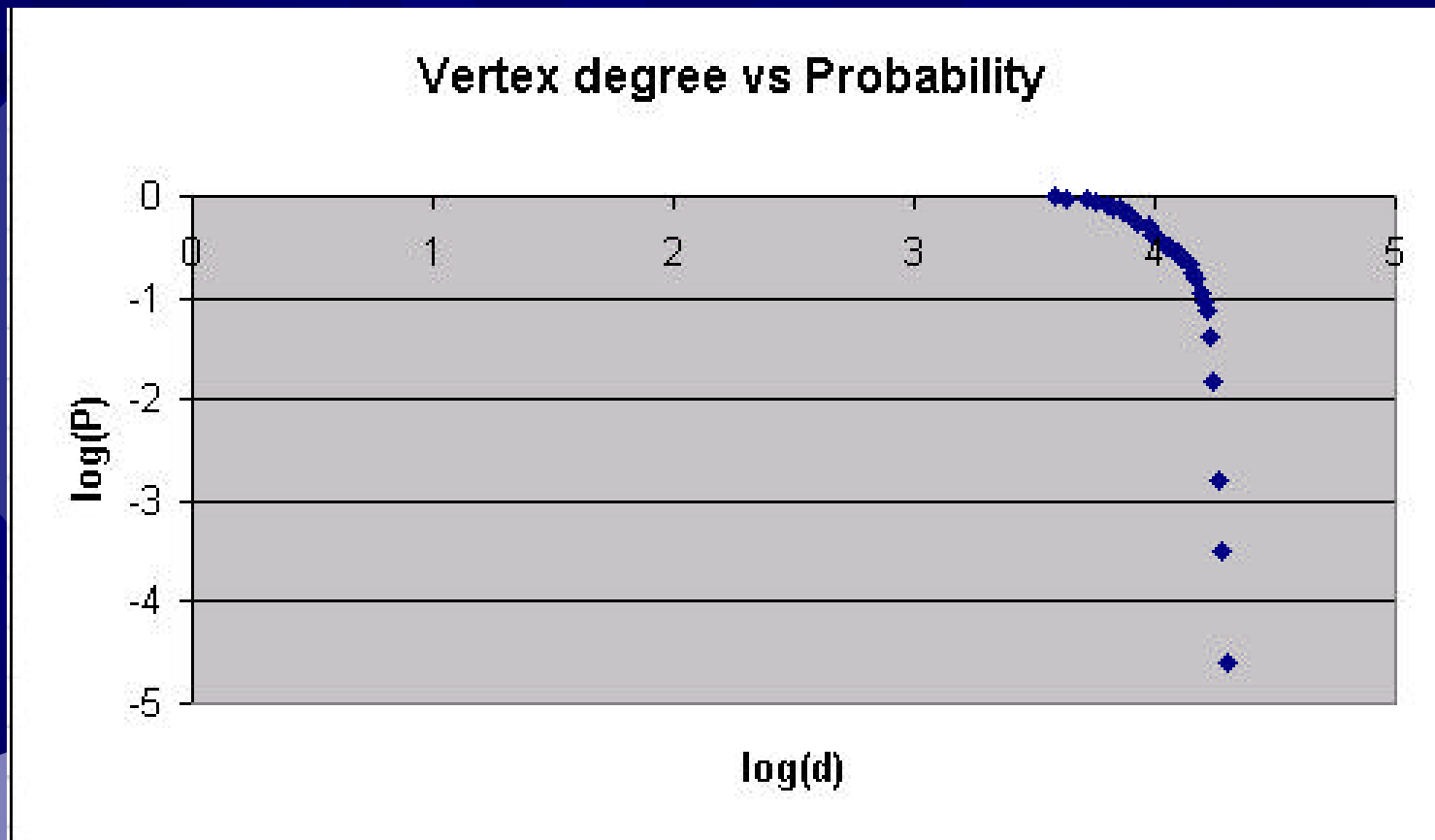


(After Optimization)

# Our Result (Cont'd)



# Our Result (Cont'd)



# Conclusion

- ✦ We verified that HOT mechanism can generate Power-law distribution.
- ✦ HOT process can be used to generate Internet Topology.

# Reference

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