



# Welcome

## Final Year Project Oral Presentation

- ◆ Title: **Analysis of Fuzzy-Neuro  
Network Communications**
- ◆ Student: Zhang Xinhua
- ◆ Duration: January 2003 ~ June 2003
- ◆ Supervisor: A/P Peter. K. K. Loh
- ◆ Examiner: A/P Quek Hiok Chai



# Project Objective

- ◆ Investigate the use of fuzzy logic in routing decisions on unstable or unreliable communication networks.
- ◆ Unify the fuzzy system for various network topologies, especially the rule base and membership functions.
- ◆ Implement the new fuzzy routing system on FPGA.
- ◆ Provide a basis for development of new, intelligent and high-performance routing techniques to enhance communications support in networks.



# Tasks Finished

- ◆ Explore fuzzy neural network applied in network communications
- ◆ Design of fault-tolerant routing algorithm for Gaussian cube
- ◆ Design of fault-tolerant routing algorithm for Fibonacci-class cubes
- ◆ Proposing a new interconnection topology: Exchanged Hypercube
- ◆ Writing software simulation tools for implementation and benchmark
- ◆ Hardware implementation of two algorithms on FPGA with Handel-C



# Tasks Finished (1)

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# Fuzzy Neural Network

## ◆ Strengths

- Fuzzy characteristic provides interpretable human-like IF-THEN reasoning rules.
- Artificial neural network (ANN) supplies the learning ability to the traditional fuzzy systems by deriving fuzzy rule base and/or membership function automatically.

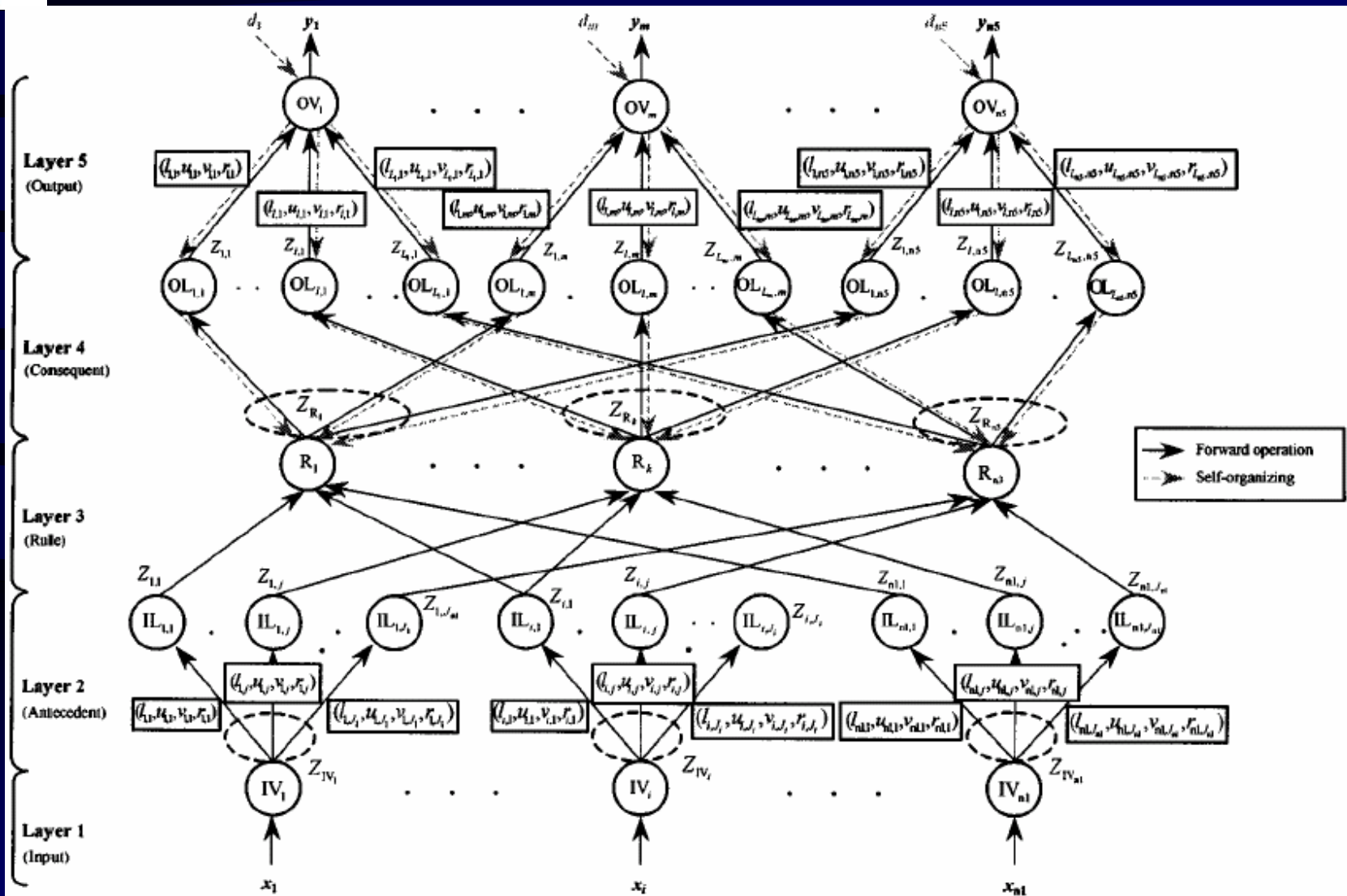
## ◆ Deficiencies

- Too large rule base for real hardware implementation

- Intractable Training time complexity:  $O(\prod_{i=1}^n I_i \cdot \prod_{j=1}^m O_j \cdot T)$



# Architecture of GenSoFNN





# Applying FNN to Routing, Barriers

## ◆ Exponentially growing number of rules

Mamdani

$R_i$  : IF  $x_1$  is  $A_{i1}$  and ... and  $x_r$  is  $A_{ir}$  THEN  $y$  is  $C_i$

Where,

$x_j (j = 1, 2, \dots, r)$	input variables
$y$	output variable
$A_{ij}$	fuzzy sets for $x_j$
$C_i$	fuzzy sets for $y$ .

TSK

$R_i$  : IF  $x_1$  is  $A_{i1}$  and ... and  $x_r$  is  $A_{ir}$   
THEN  $y = f_i(x_1, x_2, \dots, x_r) = b_{i0} + b_{i1}x_1 + \dots + b_{ir}x_r$

Where

$f_i$	is the linear model
$b_{ij} (j = 0, 1, \dots, r)$	are real-valued parameters



# Applying FNN to Routing, Barriers

- ◆ Exponentially growing number of rules
- ◆ Too long off-line training time  $O(\prod_{i=1}^n I_i \cdot \prod_{j=1}^m O_j \cdot T)$
- ◆ Difficulty in discussion of non-fuzzy metrics
- ◆ Challenges in preparing training examples
- ◆ Hard to unify membership functions and/or rule base for various topologies

**Cause/Conclusion:** FNN is not currently suitable for high-dimensional binary applications.





# Tasks Finished (2)

- ◆ Explore fuzzy neural network applied in network communications
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# Background of Gaussian Cube (*GC*)

- ◆ Proposed by Dr. W. J. Hsu
- ◆ Merits
  - the interconnection density and algorithmic efficiency are linked by a common parameter, the variation of which can scale routing performance according to traffic loads without changing the routing algorithm
  - such communication primitives as unicasting, multicasting, broadcasting/gathering can also be done rather efficiently
- ◆ Issue: **no existing fault-tolerant routing strategy for it (node/link dilution cubes)**



# FT Routing algorithm for Gaussian Cube

- ◆ **Significance:** making  $GC$  a more fault-tolerant topology
- ◆ **Chief advantages** (for  $GC(n, 2^a)$ )
  - (1) Incurs message overhead of only  $O(n)$ .
  - (2) The computation complexity for intermediate nodes is  $O(a(n-a)\log a)$
  - (3) Tolerate a large number of faults.
  - (4) Guarantees a message path length not exceeding  $2F$  longer than the optimal path found in a fault-free setting, provided the distribution of faults in the network satisfies some constraints.
  - (5) Generates deadlock-free and livelock-free routes.



# Chief Techniques Adopted (1)

## ◆ Gaussian Tree ( $GT_a$ for $GC(n, 2^a)$ )

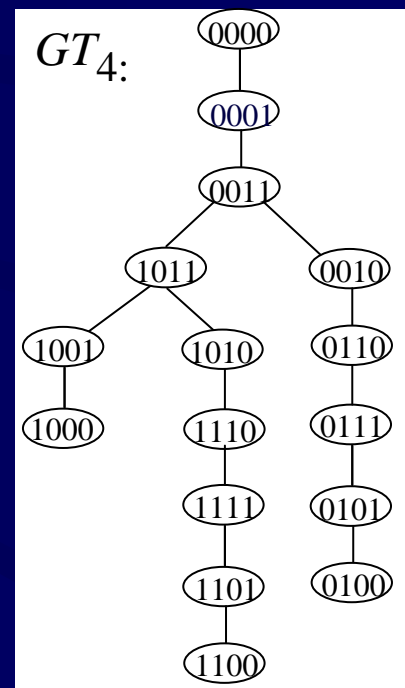
Gaussian Tree is composed of  $\langle V_n, E_n \rangle$ ,

where:  $V_n = \{a_{n-1}a_{n-2} \cdots a_1a_0 \mid a_i \in \{0,1\}, \text{ for } i \in [0, n-1]\}$

$$E_n = \{(a_{n-1}a_{n-2} \cdots a_c \cdots a_1a_0, a_{n-1}a_{n-2} \cdots \overline{a_c} \cdots a_1a_0) \mid$$

$c=0 \text{ or } c \in [1, n-1] \text{ and } \overline{a_{c-1}a_{c-2} \cdots a_1a_0} = c\}$

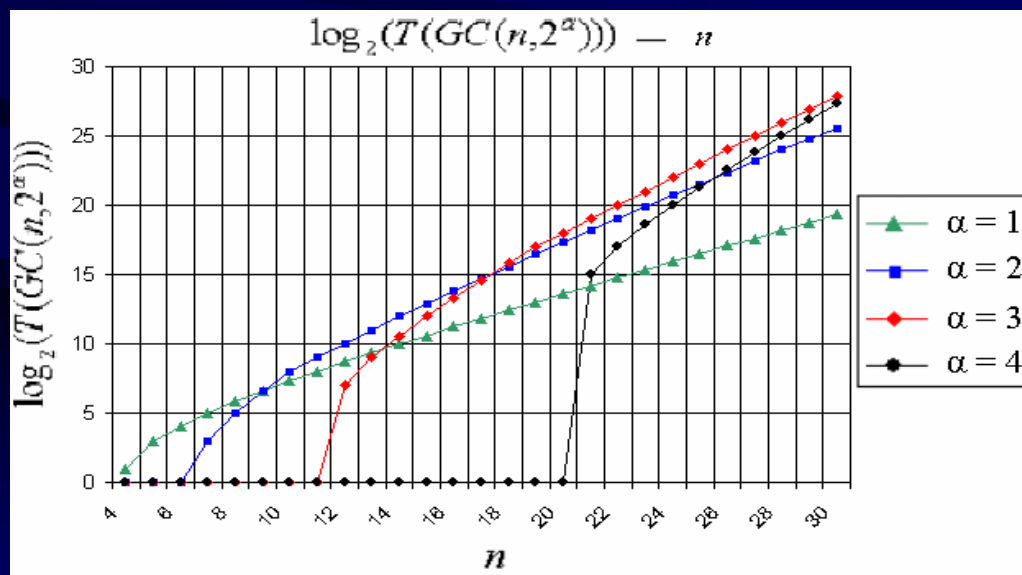
**Significance:** A many-to-one mapping is established between nodes in  $GC$  and  $GT$ , thus converting the original problem into routing in  $GT$ , which is found to be more definite and predictable.





# Chief Techniques Adopted (2)

- ◆ Fault categorization
  - A, B, C - Category (partition)
  - **Significance**: overcome the problem of low node availability, with refined analysis of faults' location





# Tasks Finished (3)

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# Background of Fibonacci Cube

- ◆ Proposed by Dr. W. J. Hsu
- ◆ Merits
  - use fewer links than the comparable hypercubes, with the scale increasing far less fast than hypercube, allowing more choices of network size
  - allow efficient emulation of other topologies such as binary tree (including its variants) and hypercube
- ◆ Issue: **no existing fault-tolerant routing strategy for it (node/link dilution cubes)**



# Routing algorithm for Fibonacci Cube ( $FC$ )

◆ **Significance:** making  $FC$  a more fault-tolerant topology

◆ **Chief advantages**

- (1) Applicable to all Fibonacci-class Cubes in a unified fashion
- (2) Maximum number of faulty components tolerable is the network's node availability
- (3) Generates deadlock-free and livelock-free routes
- (4) Can be implemented almost entirely with simple and practical hardware requiring minimal processor control
- (5) Maintains and updates at most  $(deg+2)*n$ -bit local vectors
- (6) Guarantees a message path length not exceeding  $n+H$  empirically and  $2n+H$  theoretically.





# Tasks Finished (4)

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# Exchanged Hypercube (*EH*)

## ◆ Properties and merits

- (1) Reduce the number of link to  $1/n$  of binary hypercube with the same number of node.
- (2) Hamiltonian property, uniform node degree, low diameter, and various possibilities of decomposition.
- (3) Good emulation of Gaussian Cube, binary hypercube, ring, mesh.
- (4) *Extended Binomial Tree* is found as spanning tree, helping to solve broadcasting and load balancing.
- (5) Deadlock/livelock free fault tolerant routing algorithm designed and the number of hops is tightly bounded.

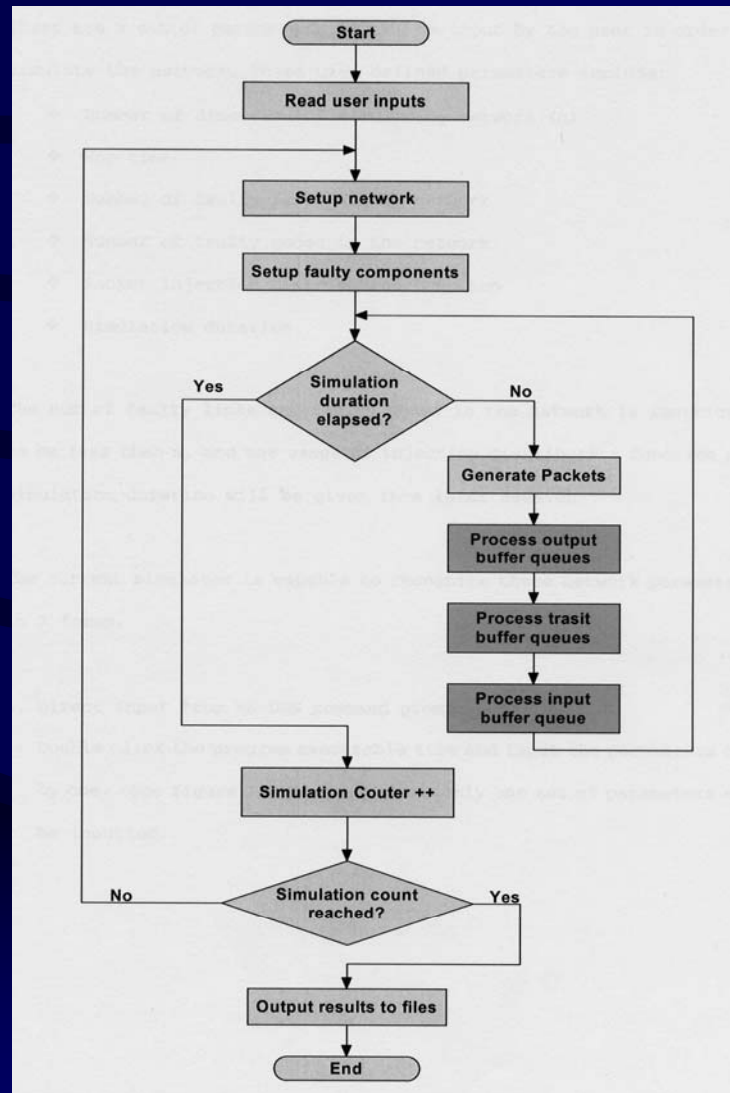


# Tasks Finished (5)

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# Simulator Architecture

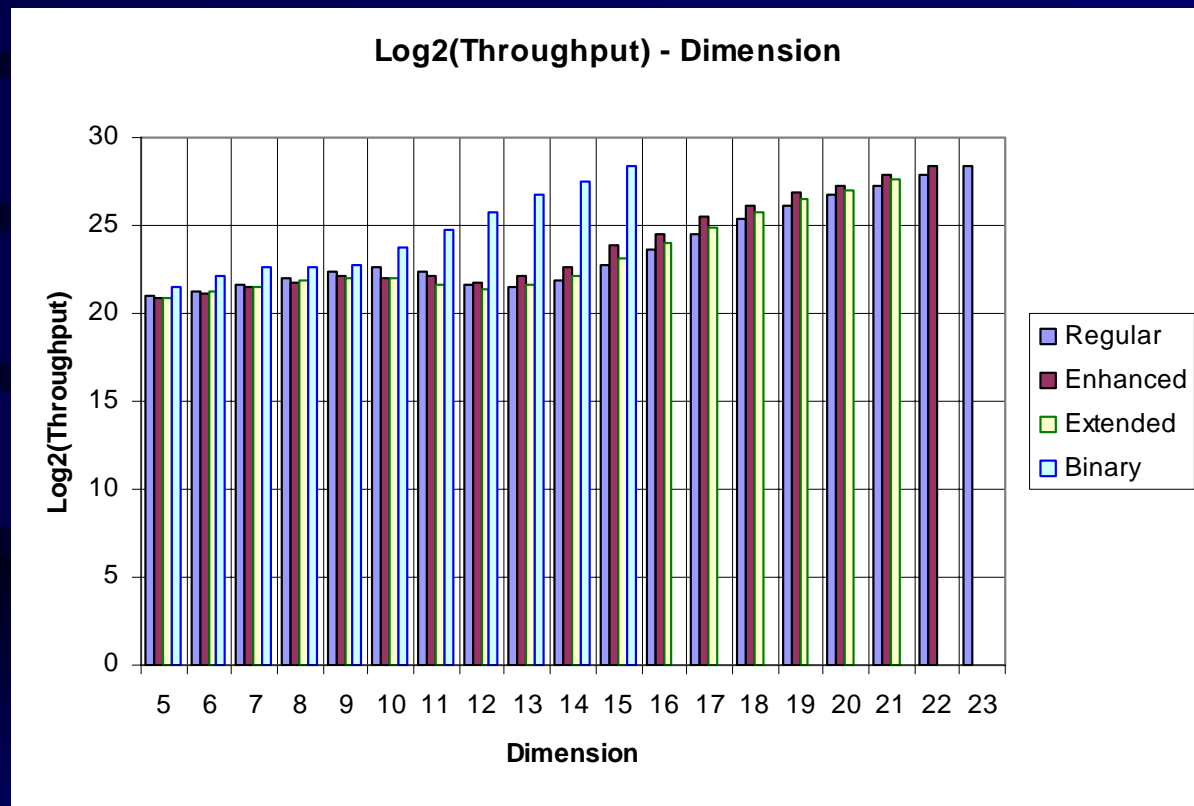




# Simulation results

## ◆ Fibonacci Cube

throughput  
(logarithm) of  
faulty-free  
Fibonacci-class  
Cube

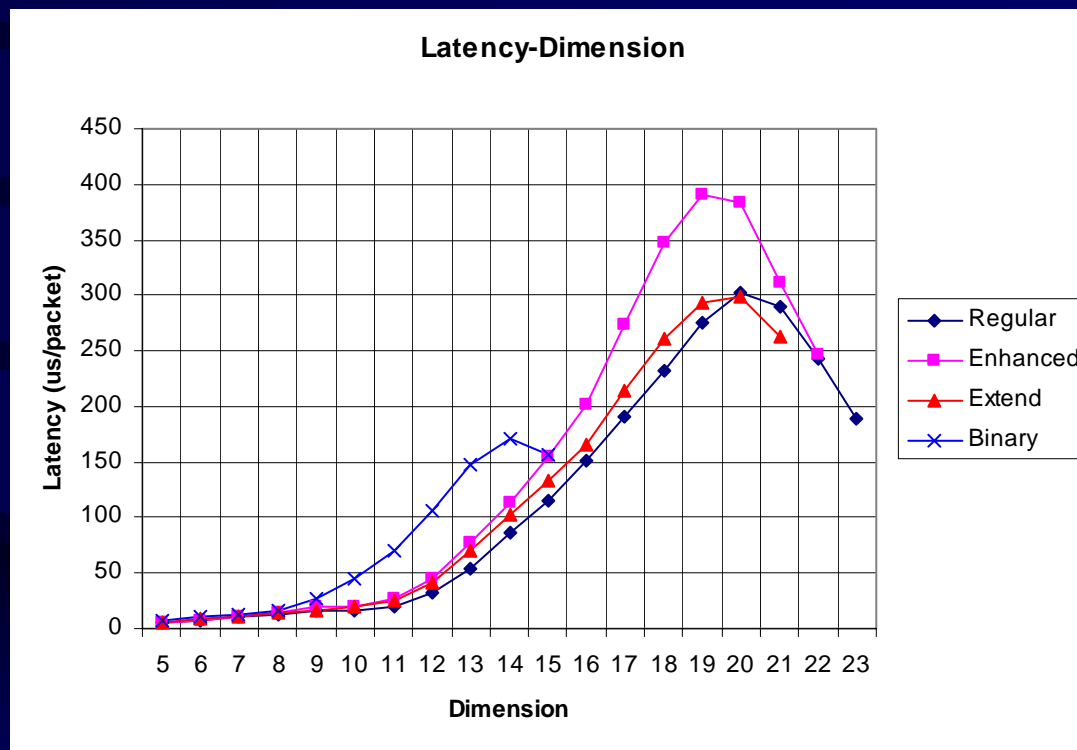




# Simulation results

## ◆ Fibonacci Cube

Latency of  
Fault-free  
Fibonacci-  
Class Cubes

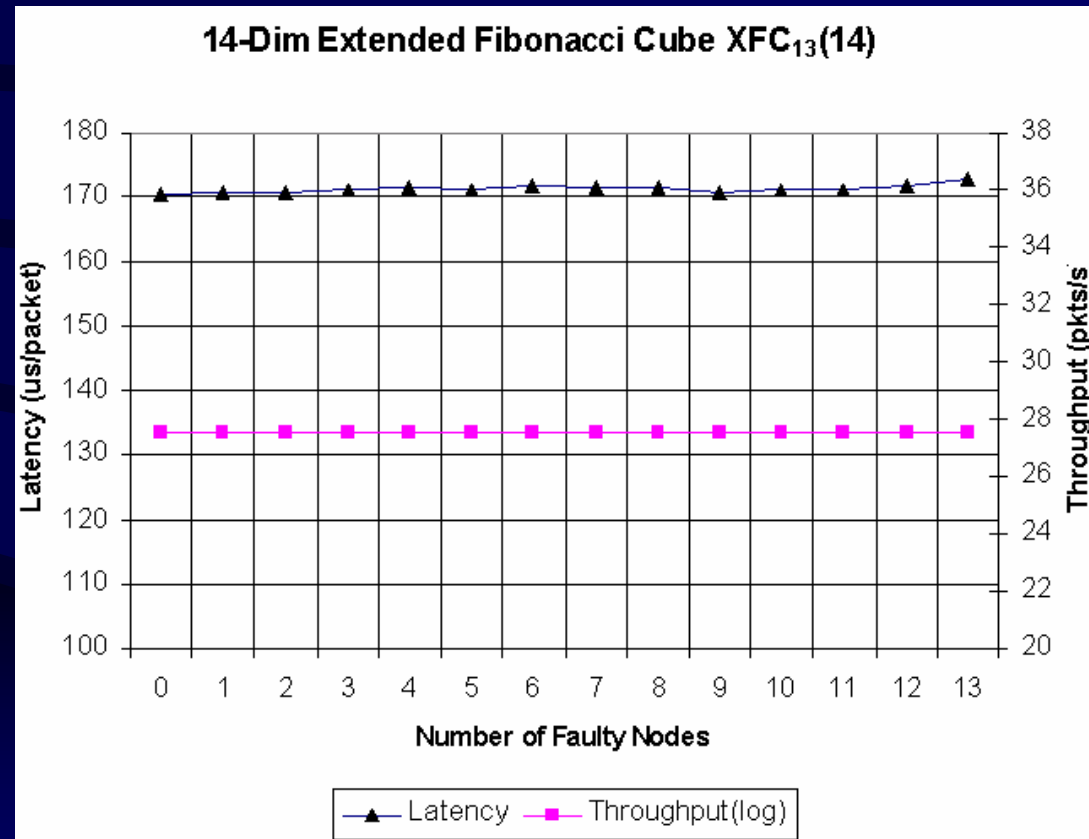




# Simulation results

## ◆ Fibonacci Cube

Throughput and Latency (logarithm) of  $XFC_{13}(14)$  with respect to number of faults





# Tasks Finished (6)

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# Proposal for future research

- ◆ Give theoretical proof for the fault-tolerant routing strategy of Fibonacci Cube.
- ◆ Introduce new metrics for comparison of fault-tolerant routing strategies, especially for *GC*, Fibonacci and other node/link dilution cubes.
- ◆ Improve the simulator architecture to achieve more accurate statistical results.



# Question and Answer Session



Questions  
are  
welcomed.