## Research Progress Seminar

A summary of Network-on-Chip benchmarks

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January 11, 2017

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#### Introduction

Why do we select these benchmarks? Because these benchmarks can exploit the characteristics of NoC: parallelism and scalability. Why not the realistic benchmarks? Because we aim the study the network only, not the system performance, therefore, selecting these benchmarks is enough for evaluating.

- Selecting and using benchmark are important for evaluating any system.
- Using benchmarks helps designer understand the performance of their own system and compare with others.
- This presentation aims to explain in details of the benchmarks which are used in OASIS.
  - Transpose
  - Uniform
  - Matrix-multiplication
  - Hotspot 10%
  - Realistic Traffic Pattern

#### Network-on-Chip

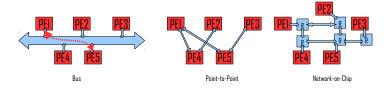
#### Traditional on-chip communication methods

**Bus**: a shared connection between PE (Processing Elements). In a clock cycle, only one communication is performed.

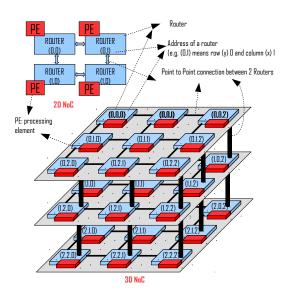
Point-to-Point: direct connection between two PEs.

#### Network-on-Chip idea

PEs are attached to routers. A communication is done by routing the packets from the source node to the destination node.



#### **NoC** Annotation



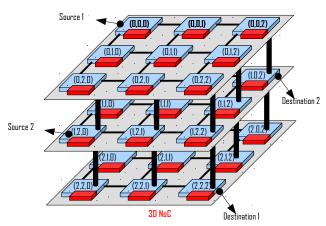
#### Detail of Benchmark

| Benchmark      | Description                                             | Citation |
|----------------|---------------------------------------------------------|----------|
| Transpose      | Each node $(a,b,c)$ in a network with $(X,Y,Z)$         | [1]      |
|                | sends packets to node (X-a, Y-b, Z-c)                   |          |
| Uniform        | Each node in a network sends packets to all             | [2]      |
|                | nodes                                                   |          |
| Matrix-        | Performs $C=A*B$ . Matrix A is stored in                | [3, 4]   |
| multiplication | layer-1, is sent to layer-2 which has matrix            |          |
|                | B. The final values are accumulated in layer-           |          |
|                | 3 as matrix C.                                          |          |
| Hotspot 10%    | Each node in a network sends packets to all             | [5]      |
|                | nodes. $X$ ( $X=1$ or 2 or more) nodes have             |          |
|                | additional 10% amount of traffic.                       |          |
| Realistic      | Generate from task graphs which provide the             | [6, 7]   |
| Traffic Pat-   | connections (e.g. node $A\rightarrow B$ ) and the traf- |          |
| tern           | fic (e.g: 100 packets).                                 |          |

⇒ The following slides will explain these benchmarks in details.

#### **Transpose**

**Transpose** is a communication pattern which is based on transposed matrix. Each nodes sends messages to a reversed dimension index node. A network with size (X,Y,Z). Node (a,b,c) in this network will send to node (X-a-1, Y-b-1, Z-c-1).



#### Transpose (cnt)

Why not (X-a,X-b,Z-c)? Consider a network with size (3,3,3). The lowest index is 0 and the highest index is 2. If we use (X-a, Y-b, Z-c), router with index 0 will send to router with index 3 (the correct index is 2). What if the index start from 1 instead 0? Consider a network with size (3,3,3). The lowest index is 1 and the highest index is 3. If we use (X-a, Y-b, Z-c), router with index 1 will send to router with index 2 (the correct index is 3).  $\Rightarrow$  In this case, the correct index is (X+1-a, Y+1-b, Z+1-c). Characteristic:

- Consists of long and short communication hops. For example: A network of  $3 \times 3 \times 3$  has 7 hopes connections (e.g  $(0,0,0) \rightarrow (2,2,2)$ ) and 1 hopes connections (e.g  $(1,1,1) \rightarrow (1,1,1)$ ). Matlab code
- Bottle-neck: the vertical connection is shared between several connections. A network of  $X \times Y \times Z$  has floor(Z/2) pairs of node share a vertical communication. For example: (X=6,Y=6,Z=6), vertical connection between  $(0,0,2) \rightarrow (0,0,3)$  is shared between 3 pairs:  $(0,0,2) \rightarrow (0,0,3), (0,0,1) \rightarrow (0,0,4)$  and  $(0,0,0) \rightarrow (0,0,5)$ .

#### Transpose: Communication Length Distribution

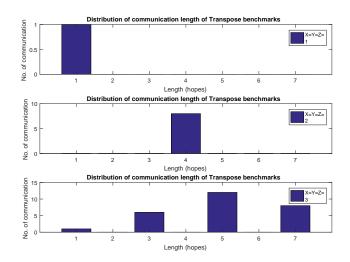


Figure 1: Distribution of communication length. Matlab code

#### Transpose: Communication Length Distribution

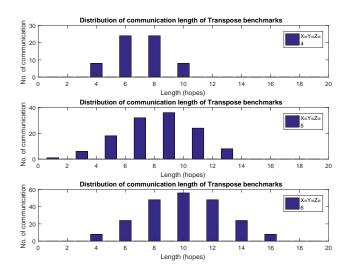


Figure 2: Distribution of communication length.

#### Transpose: Communication Length Distribution

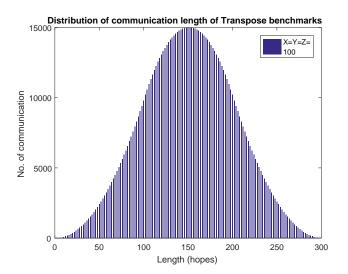
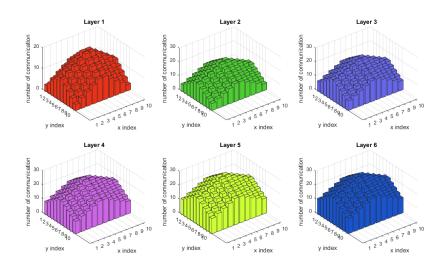


Figure 3: Distribution of communication length. Network size: (100,100,100)

#### Transpose: Bottle-neck Analysis / network (10,10,10)



*Note:* This analysis is based on XYZ routing. Each bar represents for the communication of one router.

#### Transpose algorithm

#### **Algorithm 1:** Transpose Algorithm.

```
// Network Input: Network(X,Y,Z) // Amount of data for each communication Input: D // Communication set Output: C = \{c_i : (source \rightarrow destination, amount of data)\} 1 foreach node\ (a,b,c)\ in\ Network(X,Y,Z)\ do 2 | add ((a,b,c)\rightarrow (X-a-1,Y-b-1,Z-c-1),\ D\ packets)\ to\ C end return C
```

#### Uniform

**Uniform** is one of standard benchmarks for Network-on-Chip. Each nodes send messages to every node with an equal probability. For example: a network with size (3,3,3). A node (a,b,c) sends the same amount of packets to all node  $(0,0,0) \rightarrow (2,2,2)$ . In a network (X,Y,Z), probability of source node (a,b,c) is:

$$P_{S==(a,b,c)} = 1/(X \times Y \times Z) \tag{1}$$

Probability of destination node (m,n,p) from source node (a,b,c):

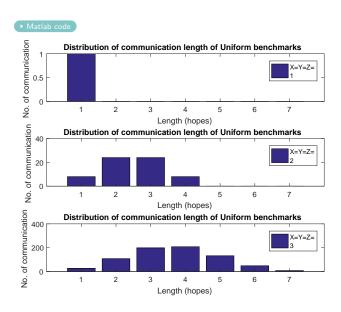
$$P_{D==(m,n,p)} = 1/(X \times Y \times Z) \tag{2}$$

Therefore, probability of a communication is:

$$P_{S==(a,b,c) \text{ and } D==(m,n,p)} = 1/(X \times Y \times Z)^2$$
 (3)

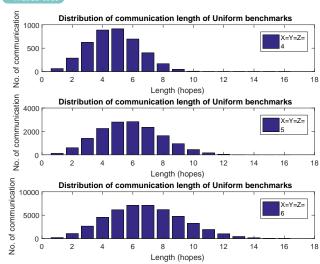
Note: if (a,b,c) is eliminated from the destination list,  $P_{D==(m,n,p)}=1/(X\times Y\times Z-1)$  and  $P_{S==(a,b,c) \text{ and } D==(m,n,p)}=1/((X\times Y\times Z)(X\times Y\times Z-1))$ 

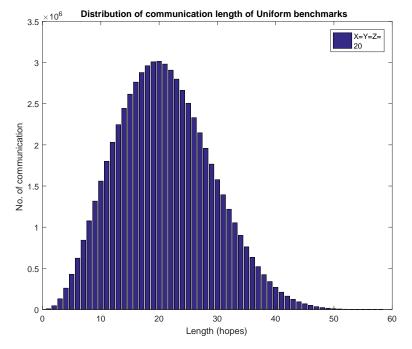
#### Uniform Distribution: Communication Length



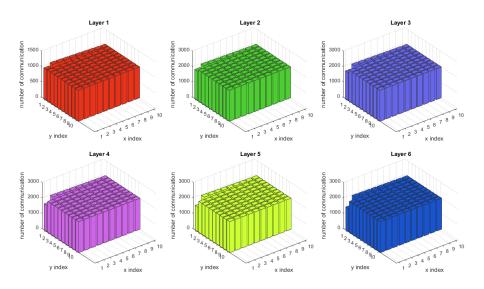
#### Uniform Distribution: Communication Length (2)







#### Uniform: Bottle-neck Analysis / network (10,10,10)



*Note:* This analysis is based on XYZ routing. Each bar = one router.

#### Uniform algorithm

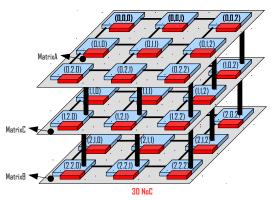
#### **Algorithm 2:** Uniform Algorithm.

```
// Network Input: Network(X, Y, Z) // Amount of data for each communication Input: D // Communication set Output: C = \{c_i : (source \rightarrow destination, amount of data)\} 1 foreach node\ (a,b,c)\ in\ Network(X,Y,Z)\ do 2 | foreach node\ (m,n,p)\ in\ Network(X,Y,Z)\ do 3 | add ((a,b,c)\rightarrow (m,n,p),\ D\ packets)\ to\ C 4 | end 5 end 6 return C
```

#### Matrix-multiplication

**Matrix multiplication** is one the most common functions for: scientific application, image/video processing, financial calculation. The calculation can be accelerated by utilizing the parallelism of NoC.

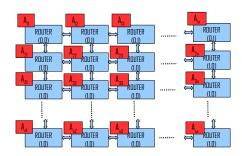
Let consider a multiplication:  $C = A \times B$  where A,B,C has size (n,n). To calculate the function, matrix A, B, C are mapped to separated layers.



#### Matrix-multiplication: Mapping of matrix A

This is how matrix A is mapped. The similar idea is applied for matrix B and C.

$$\begin{bmatrix} A_{11} & A_{12} & A_{13} & \dots & A_{1n} \\ A_{21} & A_{22} & A_{23} & \dots & A_{2n} \\ \dots & \dots & \dots & \dots \\ A_{n1} & A_{n2} & A_{n3} & \dots & A_{nn} \end{bmatrix}$$



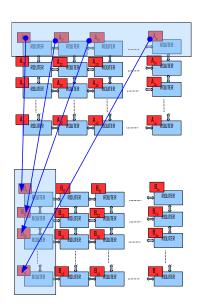
#### Matrix-multiplication: Sending data from A to B

Final equation:

$$C_{ij} = \sum_{k=1}^{n} A_{ik} \times B_{kj}$$
 (4)

Step 1: Element  $A_{ik}$  of matrix A is sent and **multiplied** to element  $B_{ji}$  of matrix B.

$$R_{ji} = A_{ij} \times B_{ji} \tag{5}$$



#### Matrix-multiplication: Sending data from A to B

Step 2: Result  $R_{ij}$  is sent and **accumulated** to obtain matrix C.

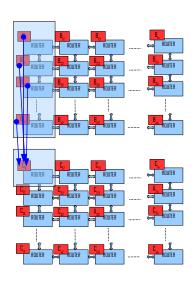
$$C_{ij} = \sum_{k=1}^{n} R_{ki} \tag{6}$$

Where:

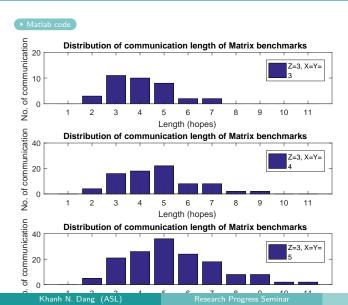
$$R_{ji} = A_{ij} \times B_{ji} \tag{7}$$

Therefore:

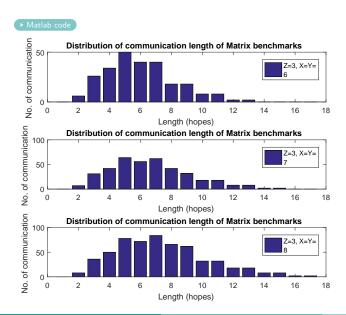
$$C_{ij} = \sum_{k=1}^{n} A_{ik} \times B_{kj}$$
 (8)

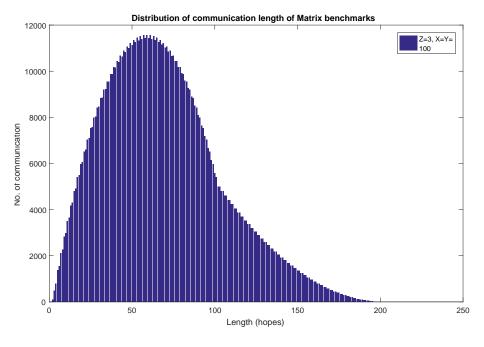


### Matrix-Multiplication Distribution: Communication Length

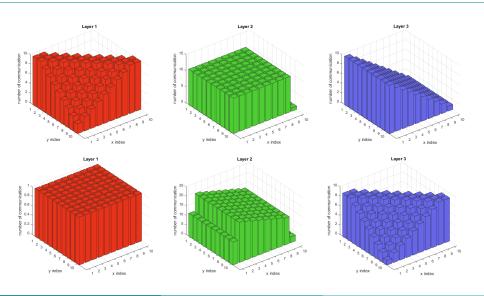


#### Matrix-Multiplication Distribution: Comm. Length (2)





# Matrix-multiplication: Bottle-neck Analysis / network (X=10,Y=10,Z=3)



#### Matrix-multiplication algorithm

#### **Algorithm 3:** Matrix-multiplication Algorithm.

```
Input: layerA(n, n), layerB(n, n), layerC(n, n),
  Input: A(n, n), B(n, n)
  Output: C(n, n)
1 foreach node (i,j) in layerA(n, n) do
        send A(i,j) \rightarrow layerB(i,i)
3 end
4 foreach node (i,j) in layerB(n,n) do
        receive A(j,i)
        R(i,j) = A(j,i) \times B(i,j)
        foreach k in 1:n do
             send R(i,i) \rightarrow layerC(i,k)
        end
10 end
11
  foreach node (i,j) in layerC(n,n) do
        foreach k in 1:n do
             send C(i,j) = C(i,j) + R(k,i)
13
        end
14
15 end
16 return C(n, n) from layerC(n, n)
```

#### Hotspot 10%

**Hotspot** is similar to **Uniform**. Each nodes send messages to all non-hotspot node with an equal probability. The hotspot nodes are received extra E% of probability (e.g. 10%). For example: a network with size (3,3,3). A node (a,b,c) sends the same amount of packets to all node  $(0,0,0) \rightarrow (2,2,2)$ . In a network (X,Y,Z), probability of source node (a,b,c) is:

$$P_{S==(a,b,c)} = 1/(X \times Y \times Z) \tag{9}$$

#### Hotspot algorithm

#### **Algorithm 4:** Hotspot Algorithm.

```
// Network
  Input: Network(X, Y, Z)
  // Amount of data for each communication
  Input: D
  // Extra percentage of hotspot node
  Input: E
  // Communication set
  Output: C = \{c_i : (source \rightarrow destination, amount of data)\}
  foreach node (a,b,c) in Network(X,Y,Z) do
       foreach node (m,n,p) in Network(X,Y,Z) do
            if node(m,n,p) is hotspot node then
                 add ((a, b, c) \rightarrow (m, n, p), (D+D*E/100) packets) to C
            else
                add ((a, b, c) \rightarrow (m, n, p), D packets) to C
            end
       end
10 return C
```

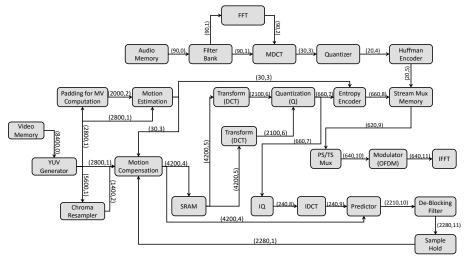
#### Realistic Traffic Pattern

Realisc Traffic Pattern is design to import a mapped task graph to perform a simulation. It requires:

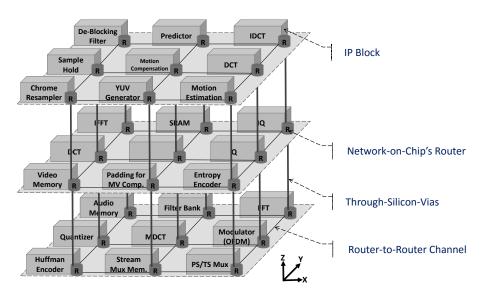
- A task graph from an application.
- Post-mapped topology from the task graph.
- Information of communication (source → destination, amount of data).
- Network on Chip model.

#### An example task graph: H.264 Encoder

A communication has an extra number: (D, O). D: amount of data (packets), O: order of communication.



#### An example of mapped application to 3D NoC



#### Algorithm of Realistic Benchmark

#### **Algorithm 5:** Realistic Benchmark Algorithm.

```
Input: Network(X, Y, Z)
   // Communication set
  Input: C = \{c_i : (source \rightarrow destination, D, O)\}
1 ProgramCounter = 0;
2 foreach node (i,j,k) in Network(X,Y,Z) do
       foreach ci in C do
            if c_i(source) == (i, j, k) and ProgramCounter == O then
                 send (i,j,k) \rightarrow c_i(destination) with c_i(D) packets.
            end
            if c_i(destination) == (i, j, k) and ProgramCounter == O then
                 receive c_i(D) packets.
            end
10
       end
11 end
      all destinations completedly receive their own c_i(D) packets then
12 if
       ProgramCounter++:
13
14 end
```

Note: The analysis for these benchmarks are not completed.

#### Conclusion

- This presentation shows the details of how the benchmarks work.
- I explain the algorithm and the distribution of the benchmarks:
  - Transpose
  - Uniform
  - Matrix-multiplication
  - Hotspot 10%
  - Realistic Traffic Pattern
- The content can be used for further research.

Current & future works:

| Task                | Deadline    | Note                              |
|---------------------|-------------|-----------------------------------|
| TSV fault-tolerance | 2017-Jan-31 | Design, simulation and comparison |
| Paper writing       | 2017-Feb-28 | Several papers                    |

#### References I

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- [2] R. Sivaram, "Queuing delays for uniform and nonuniform traffic patterns in a MIN," *ACM SIGSIM Simulation Digest*, vol. 22, no. 1, pp. 17–27, 1992.
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Thank you for your attention!