

# A Framework for High Level Synthesis using TED

(Taylor Expansion Diagram)

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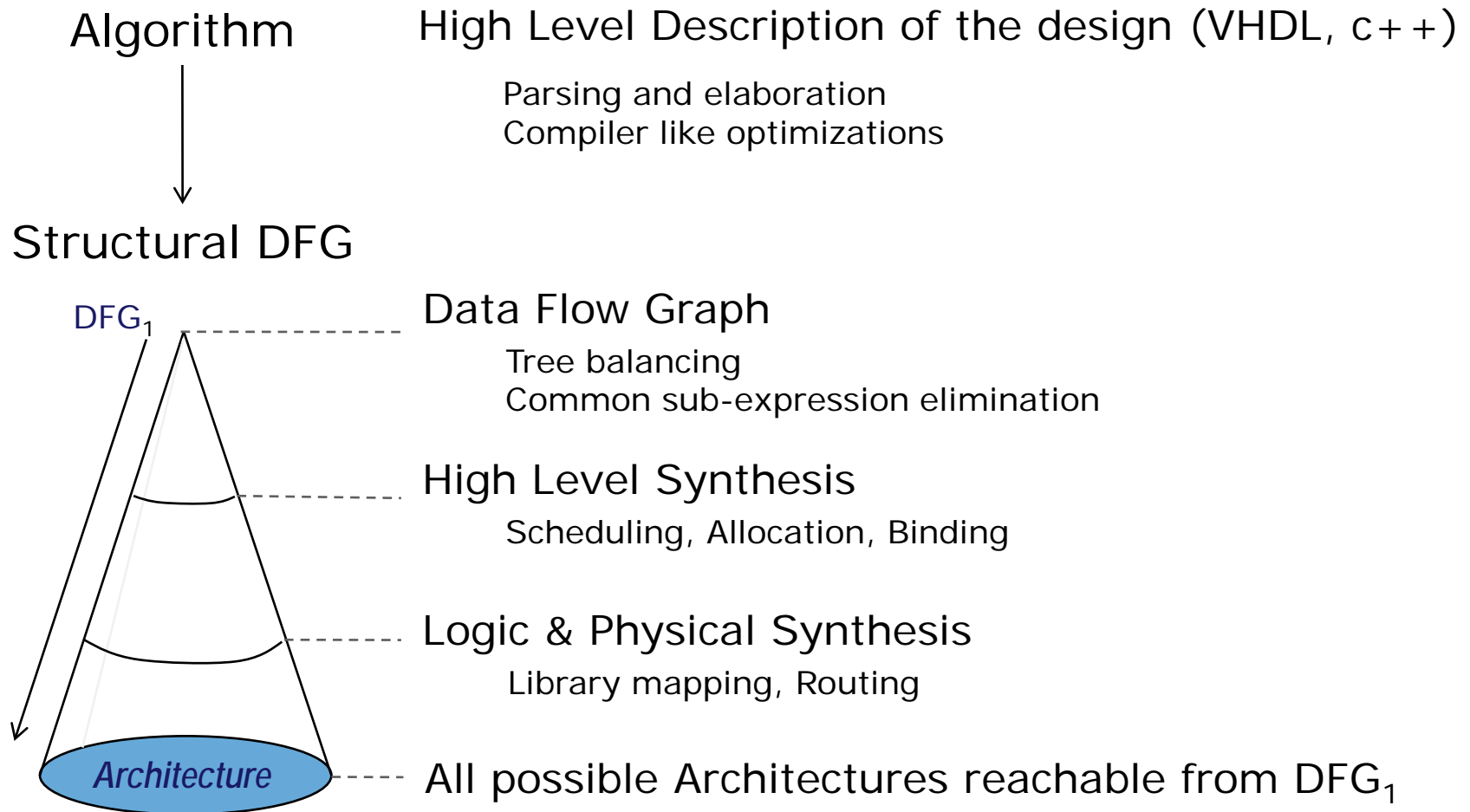
Aug 10 - 2011

# Outline

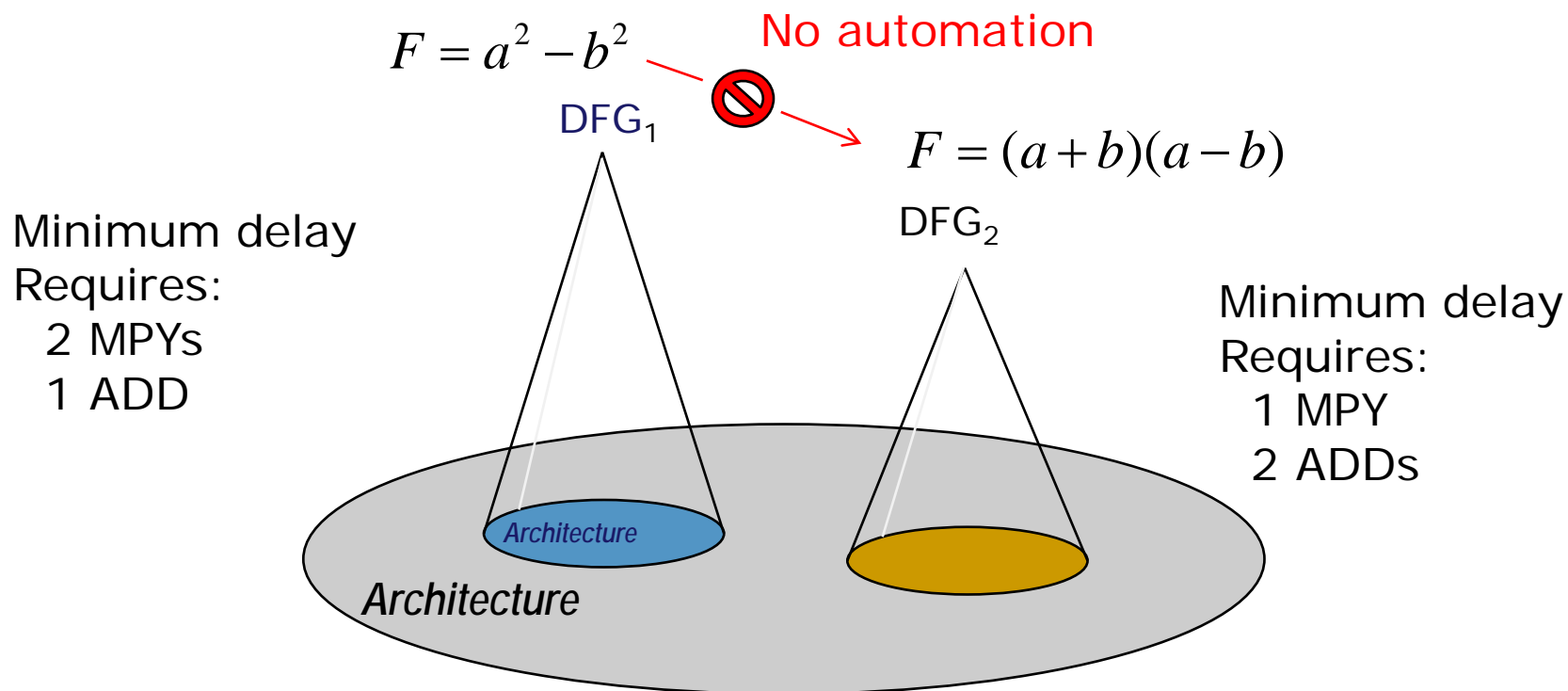
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- Introduction
  - Overview of Taylor Expansion Diagrams (TED)
  - Optimizing DFGs for HW Implementations
  - Functional Retiming
  - Computational Accuracy
- Overview of the data structures used
- Other Projects

# Current CAD Flow



## But some DFGs produce better Architectures



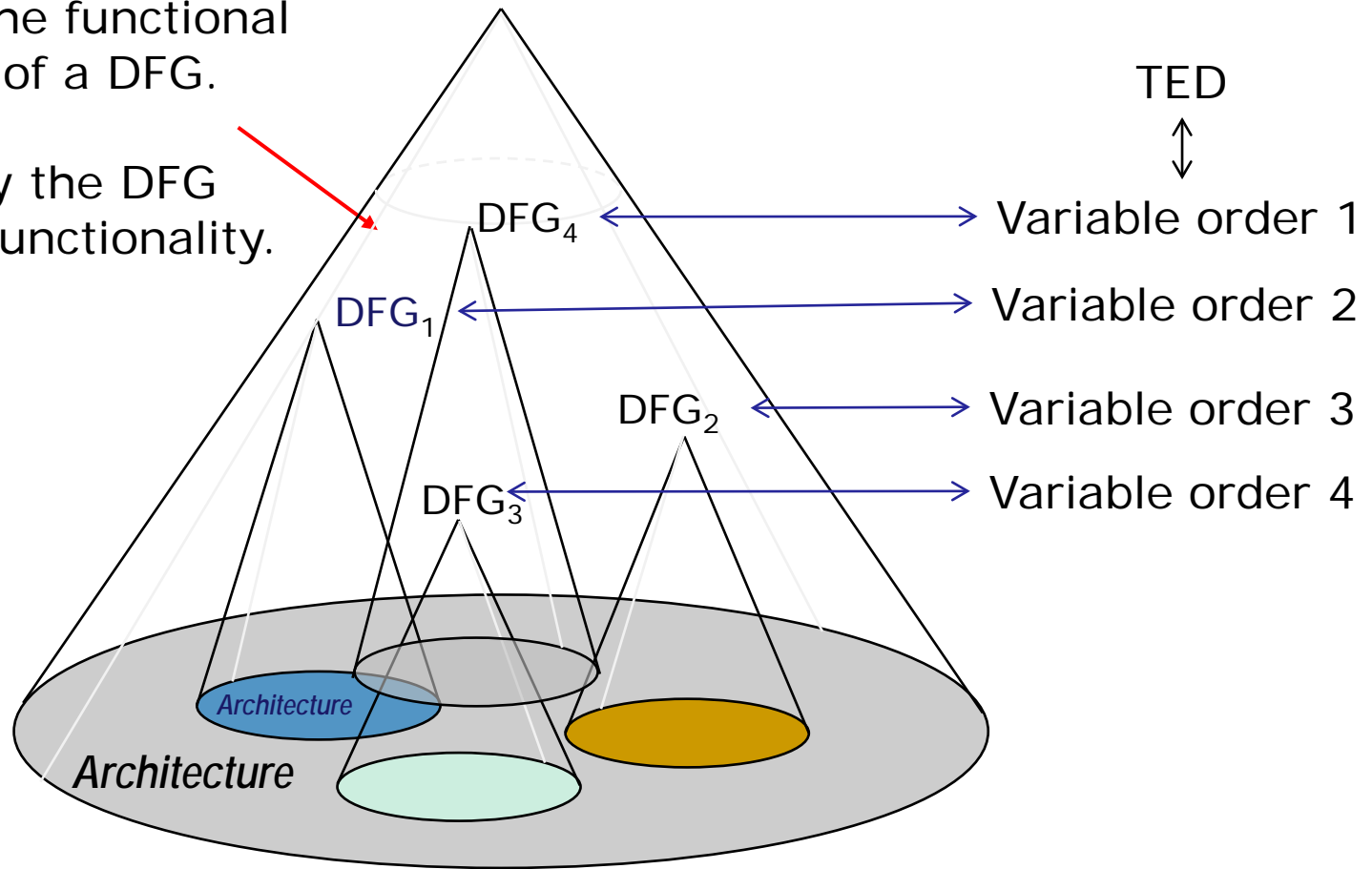
How do we find the best DFG?

How do we generate another functionally equivalent DFG?

# Taylor Expansion Diagrams

TED captures the functional representation of a DFG.

TED can modify the DFG preserving its functionality.



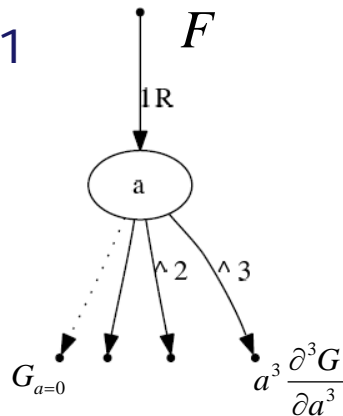
# TED Graph Notation

Follows Taylor decomposition:

$$F_{(a,\dots)} = G_{(a,\dots)}^{1R}$$

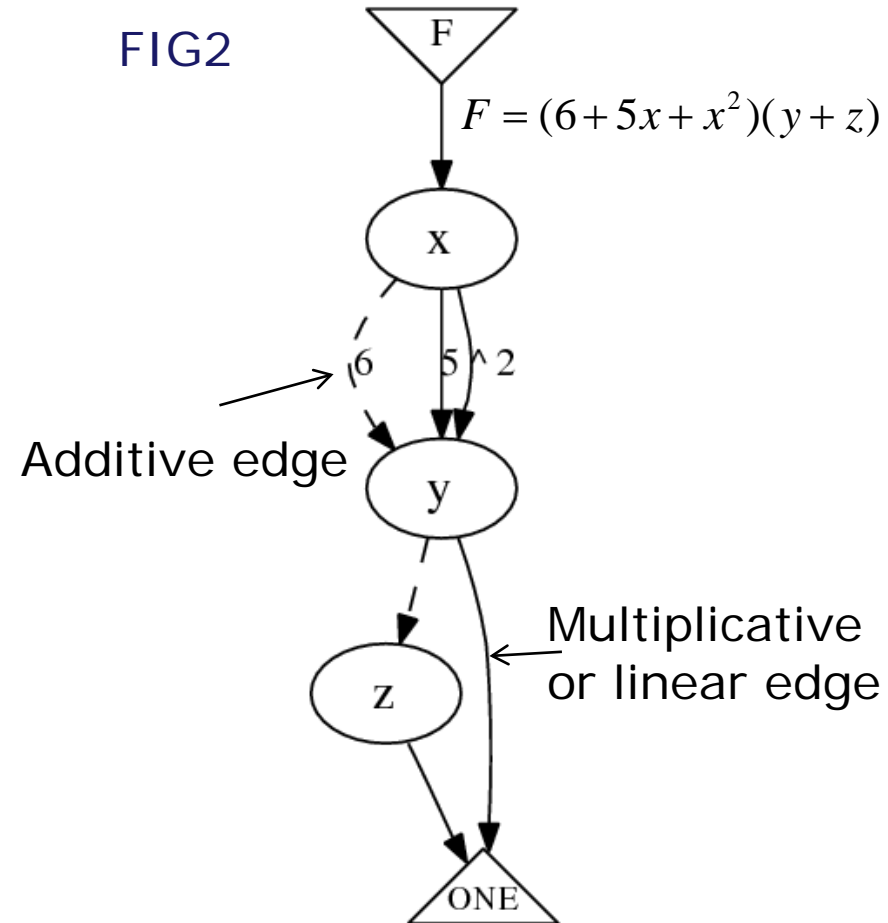
$$G = G_{(a=0)} + a \frac{\partial G}{\partial a} \Big|_{a=0} + a^2 \frac{\partial^2 G}{\partial a^2} \Big|_{a=0} + a^3 \frac{\partial^3 G}{\partial a^3} \Big|_{a=0}$$

FIG1

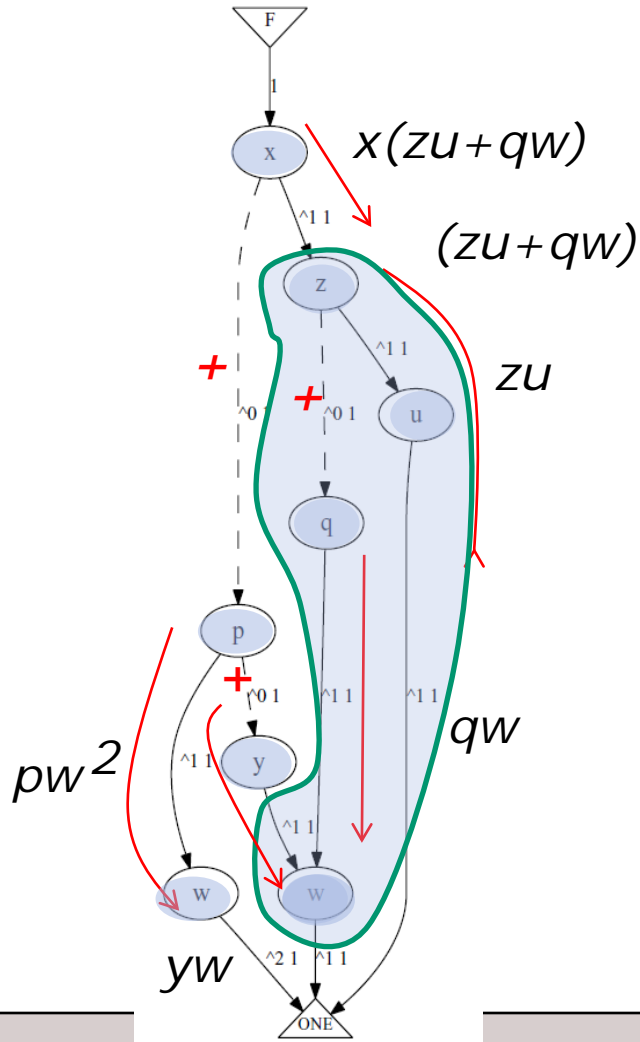


It is a canonical data structure

FIG2



# TED Construction

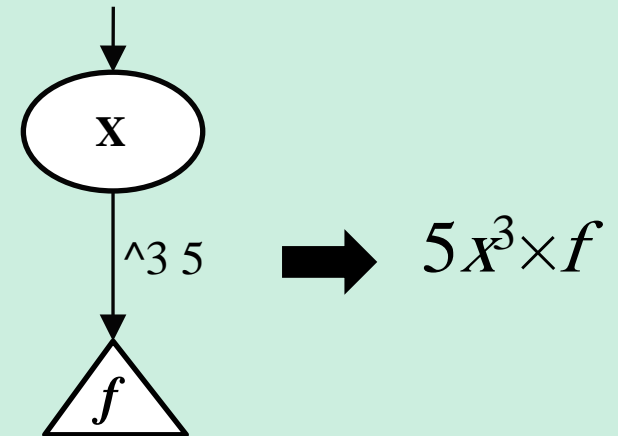


## 1 TED & TDS Overview

$$x(zu + qw) + pw^2 + yw$$

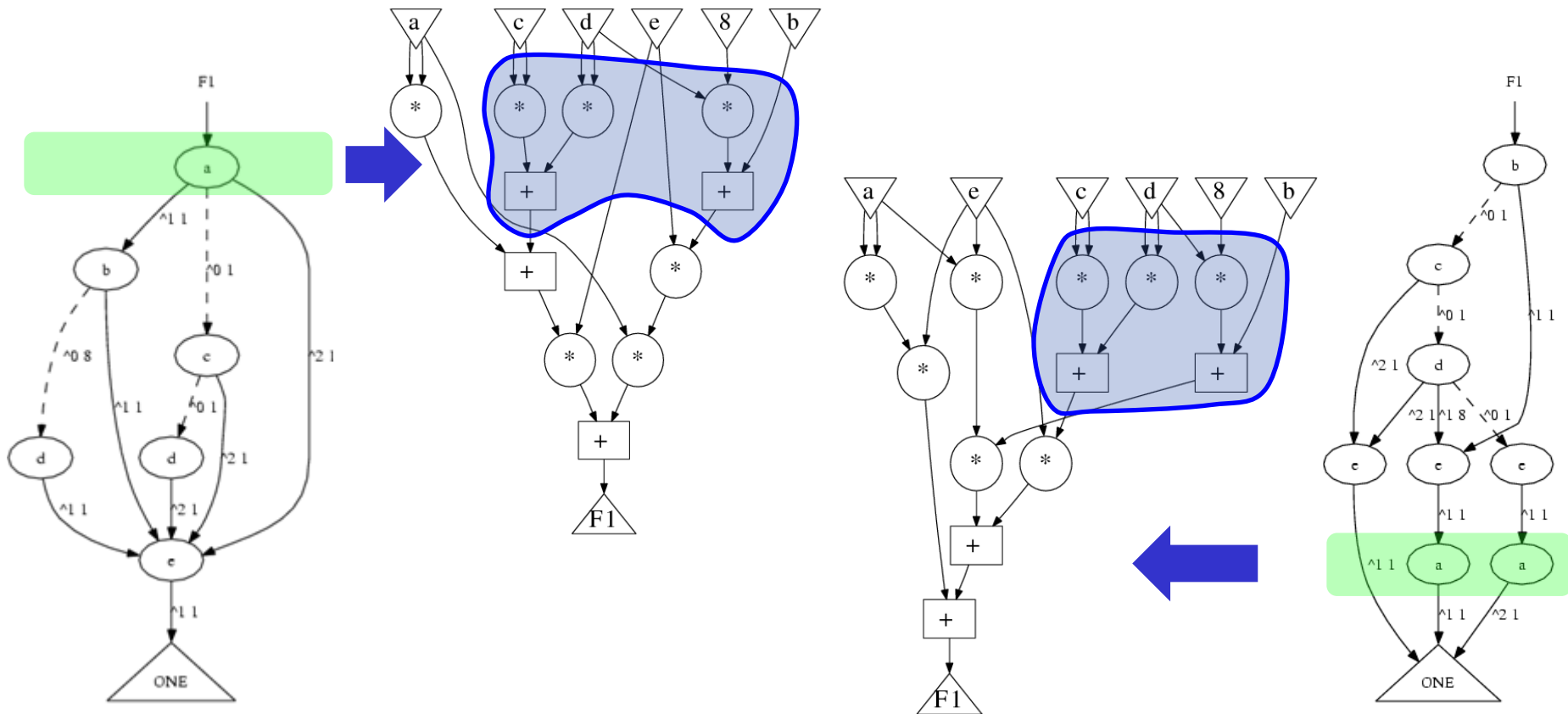
Canonical for the given order:  
 $x, z, u, q, p, y, w$

Notation:



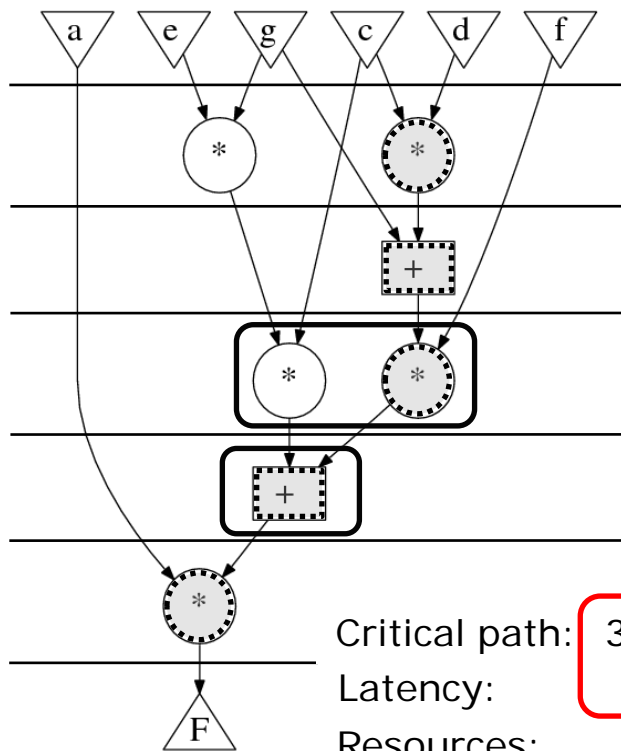
# TED Variable Ordering

$$F1 = e(a^2 + c^2 + d^2 + a(b + 8d))$$



# TED optimizes HW not operation count

$$F = a \cdot (f \cdot (g + d \cdot c) + c \cdot e \cdot g) \quad \left. \vphantom{F = a \cdot (f \cdot (g + d \cdot c) + c \cdot e \cdot g)} \right\} 5\text{MUL}, 2\text{ADD}$$

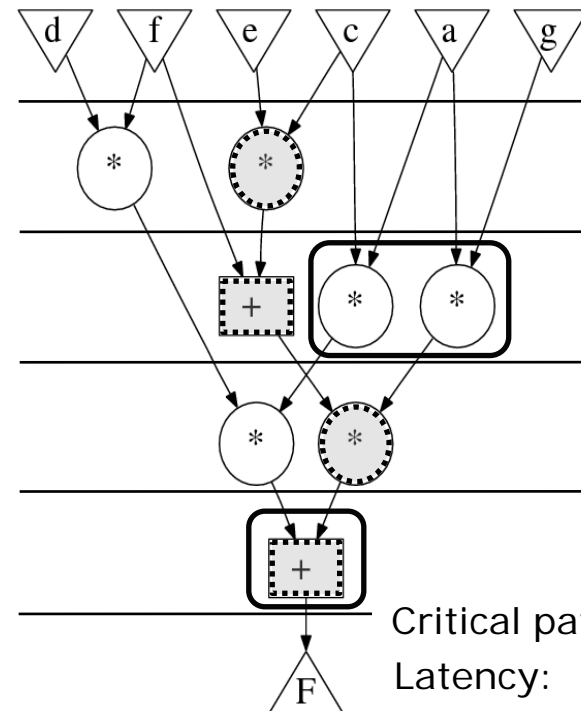


Critical path:  $3d_{\text{MPY}} + 2d_{\text{ADD}}$   
 Latency: 5 steps  
 Resources: 2MPY  
 1ADD

CSE  
 optimizes  
 operations

FIG1

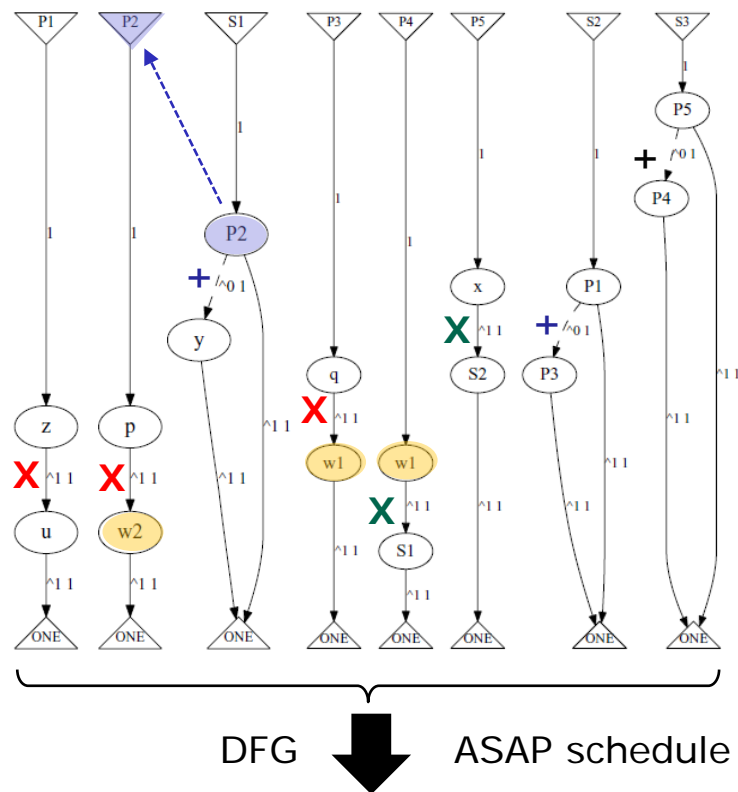
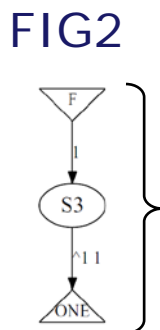
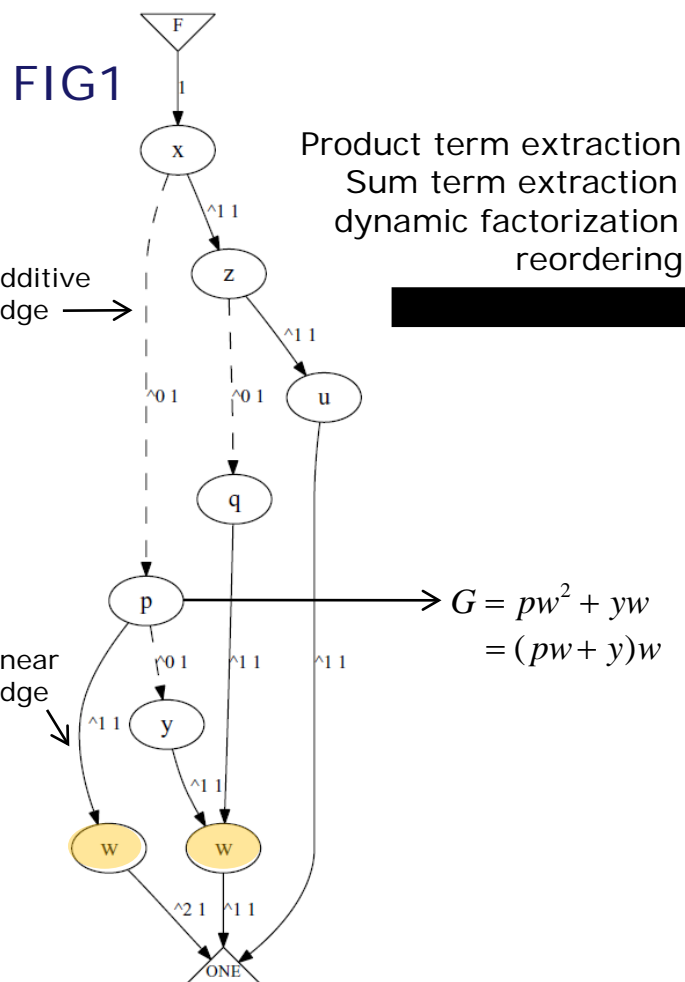
$$F = a \cdot g \cdot (f + c \cdot e) + a \cdot f \cdot d \cdot c \quad \left. \vphantom{F = a \cdot g \cdot (f + c \cdot e) + a \cdot f \cdot d \cdot c} \right\} 6\text{MUL}, 2\text{ADD}$$



Critical path:  $2d_{\text{MPY}} + 2d_{\text{ADD}}$   
 Latency: 4 steps  
 Resources: 2MPY  
 1ADD

FIG2  
 TED  
 optimizes  
 HW objectives

# Optimizing DFGs for HW (TED Decomposition)

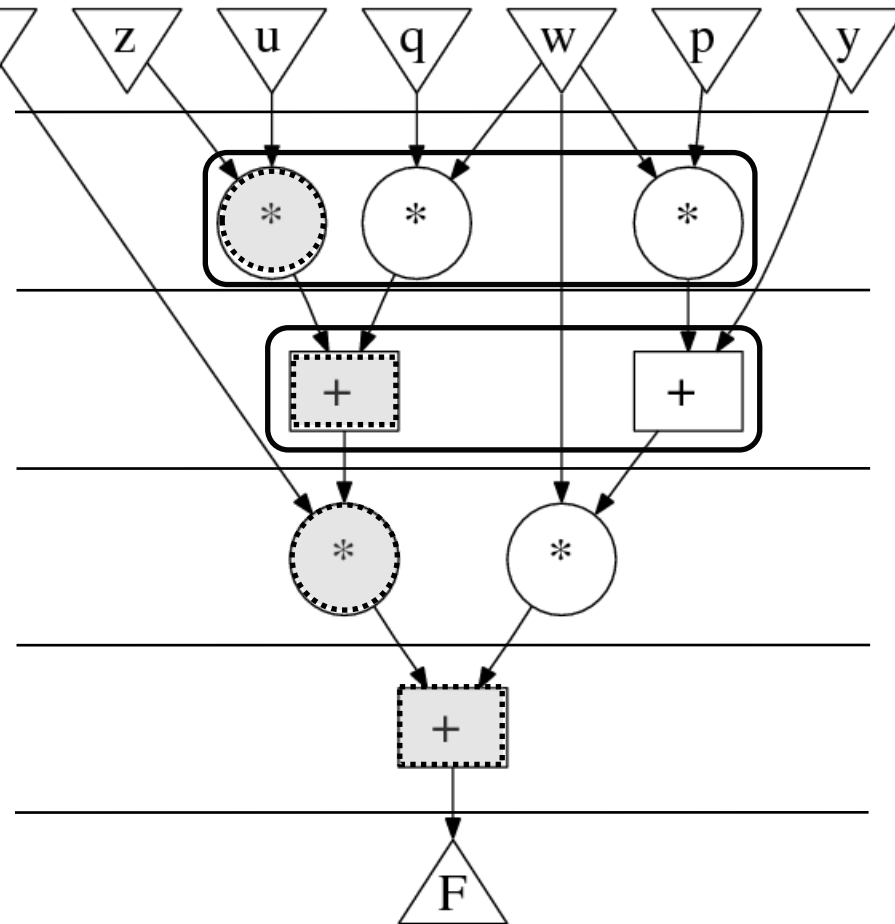
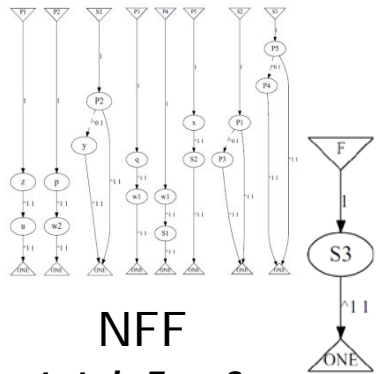


Resources: 3MPY  
2ADD

Latency: 4

|   |  |  |  |  |  |  |  |  |
|---|--|--|--|--|--|--|--|--|
| 1 |  |  |  |  |  |  |  |  |
| 2 |  |  |  |  |  |  |  |  |
| 3 |  |  |  |  |  |  |  |  |
| 4 |  |  |  |  |  |  |  |  |

# Data Flow Graph



Reordering cost

Path delay  $2d_{\text{MPY}} + 2d_{\text{ADD}}$

Latency 4 steps

Resource 3MPY & 2ADD

# Functional Retiming in TED

The retime operator  $()^R$  is lineal because it is the convolution  $*$  with the time delayed delta Dirac  $\delta$ .

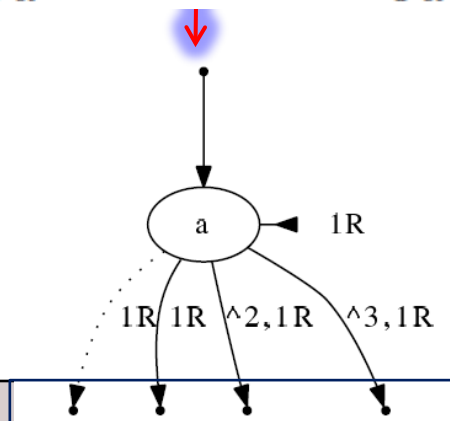
Because  $()^R$  is a lineal operator, it can be applied to the TED graph.

Taylor decomposition:

$$G = G_{(a=0)} + a \frac{\partial G}{\partial a} \Big|_{a=0} + a^2 \frac{\partial^2 G}{\partial a^2} \Big|_{a=0} + a^3 \frac{\partial^3 G}{\partial a^3} \Big|_{a=0}$$

Lineal operator  $()^R$ :

$$F = G_{(a=0)}^{1R} + a^{1R} \left( \frac{\partial G}{\partial a} \right)_{|a=0}^{1R} + (a^{1R})^2 \left( \frac{\partial^2 G}{\partial a^2} \right)_{|a=0}^{1R} + (a^{1R})^3 \left( \frac{\partial^3 G}{\partial a^3} \right)_{|a=0}^{1R}$$



# Example of Functional Retiming

$$F = d^{1R}(b+a)^{1R} + (ca+bc)^{1R}$$

Classic data  
path retiming

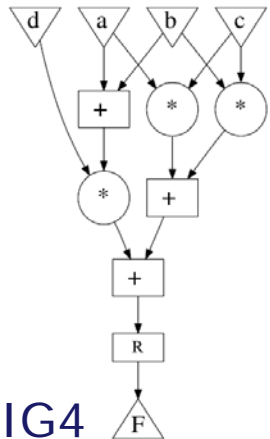


FIG4

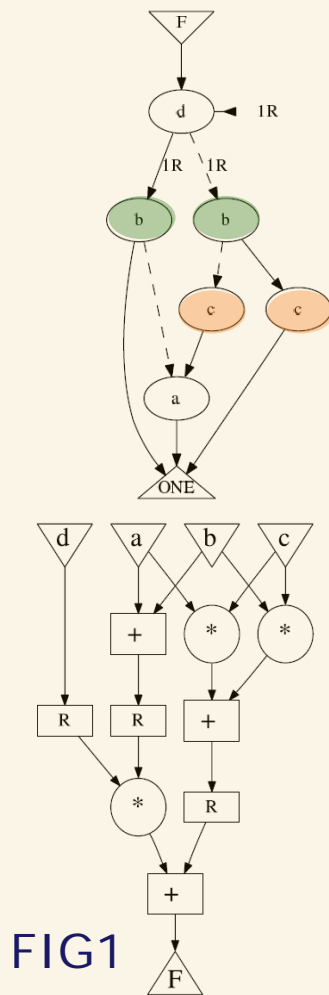


FIG1

ordering

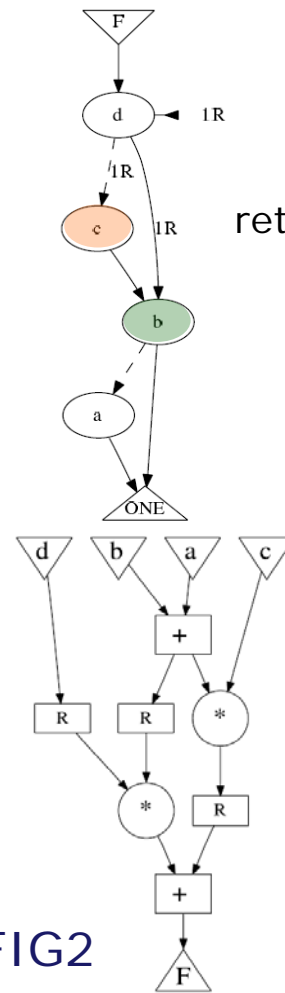


FIG2

retiming

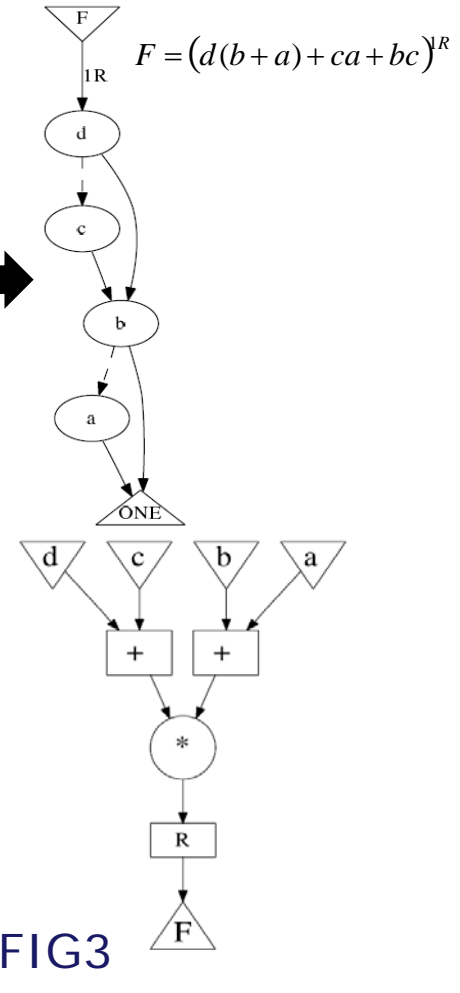
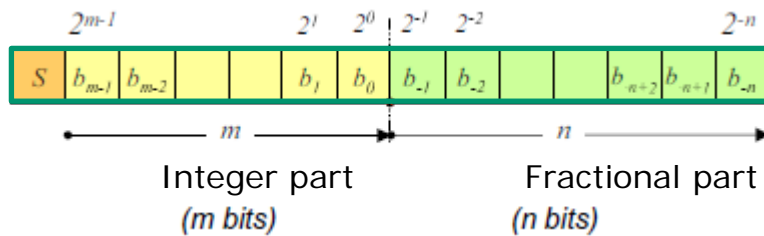


FIG3

# Fixed Point Arithmetic



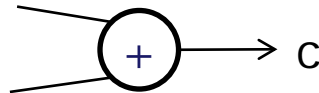
$$x = -2^m S + \sum_{i=-n}^{m-1} b_i 2^i$$

$$q = 2^{-(n)}$$

$$\mathcal{D} = [-2^m; 2^m - q]$$

## Addition

a  $Q(m_a, n_a)$



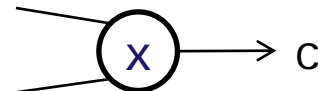
b  $Q(m_b, n_b)$

$$n_c = \max(n_a, n_b)$$

$$m_c = \max(m_a, m_b) + 1$$

## Multiplication

a  $Q(m_a, n_a)$



b  $Q(m_b, n_b)$

$$n_c = n_a + n_b$$

$$m_c = m_a + m_b$$

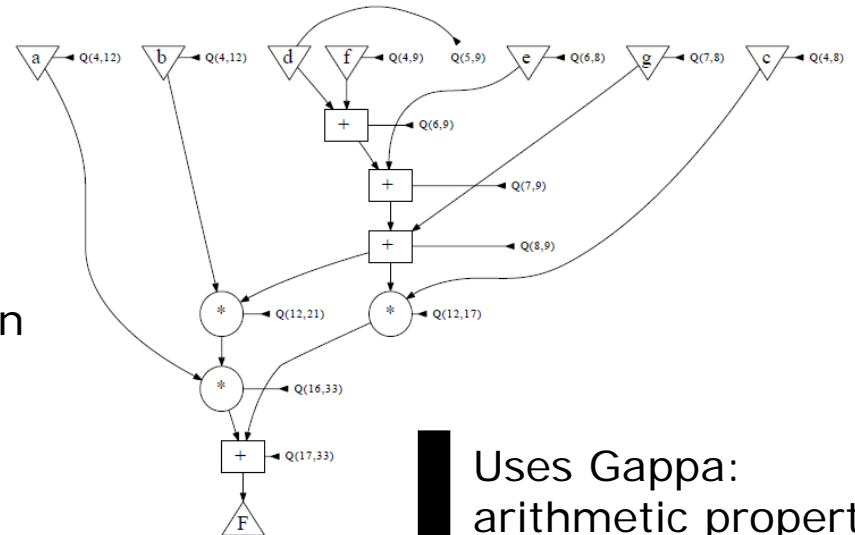
# TED With Fixed Point Arithmetic



## Bit-accurate computation



## Bit-width minimization



Uses Gappa:  
arithmetic property tool

DFG optimization under accuracy constraints  
HW accuracy certification

# Integration with GAUT

GAUT 2.2.0 build 24/01/2008 - Lester Lab, UBS University, Lorient (France)

Library: notech\_16b

Opened file :

```

C/C++ Compiler  Graph
int main( int a, int b, int c, int d, int e, int f, int g, int h, int * F) {
    int t;

    if (a+b>c+d) {
        t = a+b;
    } else {
        t = c+d;
    }

    *F = t*d*f*g + t*e*h*c + c*t*g*f + t*d*f*h + t*e*c*g
        + t*d*e*g + t*f*c*h + t*d*e*h;
    /*F= t*(c+d)*(e+f)*(g+h);
    return 0;
}

```

Synthetic/semantic verification and graph generation...

generate cdg file : simple2.cdg ...

end of cdg file generation : simple2.cdg

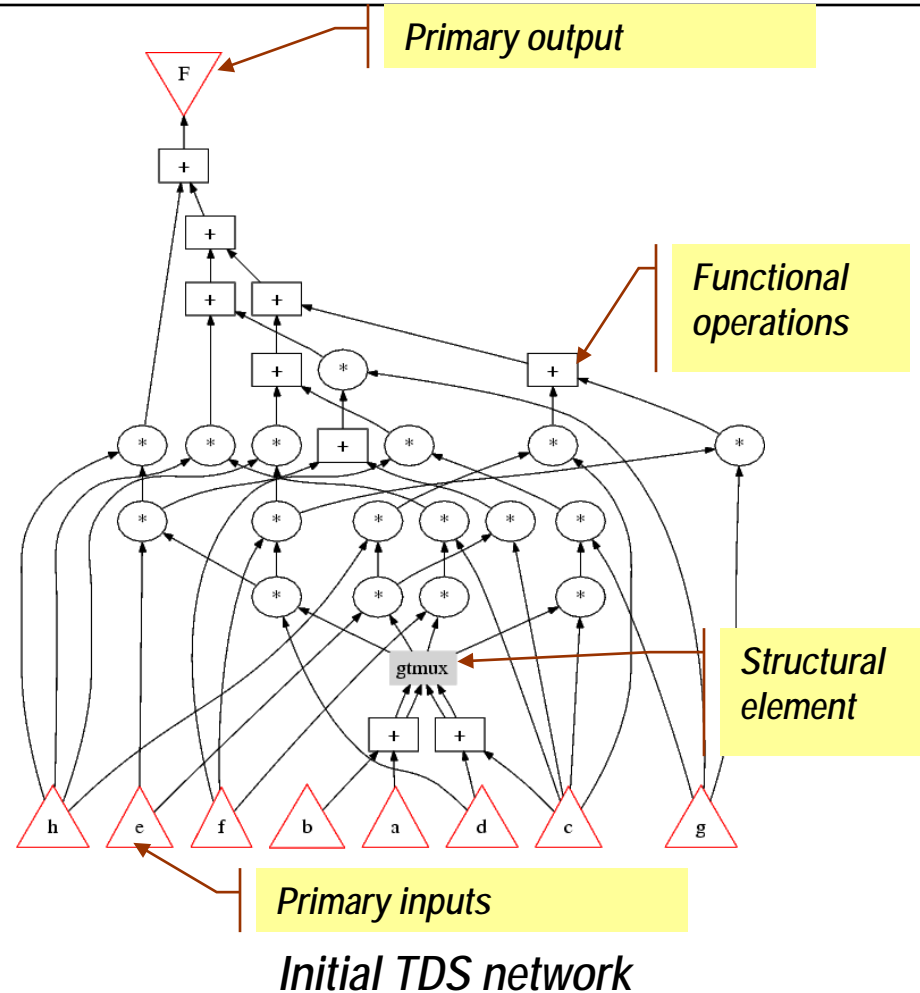
C:\GAUT2\test\simple2\simple2.c:14:2: warning: no newline at end of file

End of semantic verification with gcc...

Time used for compilation: 188 ms

Line 1 Column 1

*Example behavioral design in C*



*Initial TDS network*

# Experiments & Results

|           | Design       | Original design |      | CSE solution |      | TDS solution |      |
|-----------|--------------|-----------------|------|--------------|------|--------------|------|
|           | Latency (ns) | +, ×, <, -      | Area | +, ×, <, -   | Area | +, ×, <, -   | Area |
| SG        | DFG →        | 2,16,6,0        |      | 4,14,3,0     |      | 6,11,3,0     |      |
|           | L=120        | -               | -    | 1,5,2,0      | 439  | 1,4,1,0      | 348  |
|           | L=160        | 1,4,2,0         | 356  | 1,3,1,0      | 265  | 1,2,1,0      | 182  |
| Cosine    | DFG →        | 9,12,9,14       |      | 10,10,4,5    |      | 9,10,12,7    |      |
|           | L=110        | -               | -    | -            | -    | 3,2,4,1      | 447  |
|           | L=120        | -               | -    | 2,4,1,1      | 402  | 3,3,2,1      | 364  |
|           | L=180        | 2,5,1,1         | 476  | 1,2,1,1      | 228  | 2,2,1,1      | 236  |
| Chroma    | DFG →        | 8,13,9,3        |      | 10,6,7,8     |      | 7,13,6,0     |      |
|           | L=100        | -               | -    | -            | -    | -            | -    |
|           | L=110        | -               | -    | -            | -    | -            | -    |
| Chebyshev | DFG →        |                 |      |              |      |              |      |
|           | L=100        |                 |      |              |      |              |      |
|           | L=120        |                 |      |              |      |              |      |
|           | L=170        |                 |      |              |      |              |      |
| Quintic   | DFG →        |                 |      |              |      |              |      |
|           | L=110        |                 |      |              |      |              |      |
|           | L=140        |                 |      |              |      |              |      |
|           | L=180        |                 |      |              |      |              |      |
| Quartic   | DFG →        |                 |      |              |      |              |      |
|           | L=100        |                 |      |              |      |              |      |
|           | L=130        |                 |      |              |      |              |      |
|           | L=160        |                 |      |              |      |              |      |
| VCI       | DFG →        |                 |      |              |      |              |      |
|           | L=70         |                 |      |              |      |              |      |
|           | L=100        | 3,4,0,0         | 356  | 2,0,4,2      | 208  | 2,1,2,2      | 203  |

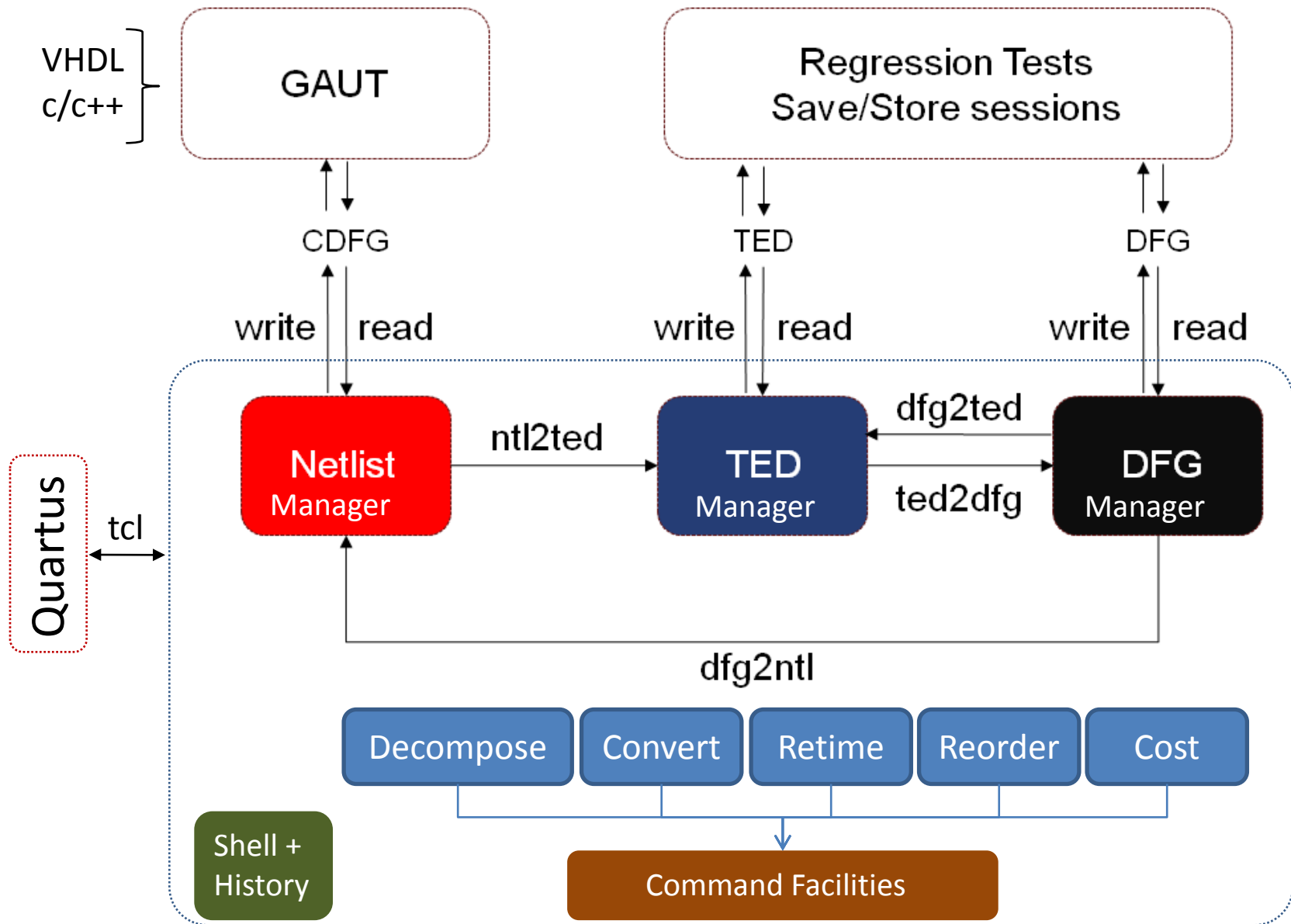
|           | Design       | Original design |                    | CSE solution |                    | TDS solution |                    |
|-----------|--------------|-----------------|--------------------|--------------|--------------------|--------------|--------------------|
|           | Latency (ns) | +, ×, <, -      | Area GAUT<br>SynDC | +, ×, <, -   | Area GAUT<br>SynDC | +, ×, <, -   | Area GAUT<br>SynDC |
| SG Filter | DFG →        | 2,16,6,0        |                    | 4,14,3,0     |                    | 6,11,3,0     |                    |
|           | L=120        | -               | -                  | 1,5,2,0      | 439                | 1,4,1,0      | 348                |
|           |              |                 |                    |              | 22,057             |              | 20,849             |
|           | L=130        | -               | -                  | 1,5,1,0      | 431                | 2,3,1,0      | 273                |
|           |              |                 |                    |              | 22,057             |              | 18,021             |
|           | L=140        | -               | -                  | 1,4,1,0      | 348                | 1,3,1,0      | 265                |
|           |              |                 |                    |              | 19,952             |              | 18,160             |
|           | L=150        | -               | -                  | 1,4,1,0      | 348                | 1,3,1,0      | 265                |
|           |              |                 |                    |              | 19,648             |              | 17,862             |
|           | L=160        | 1,4,2,0         | 356                | 1,3,1,0      | 265                | 1,2,1,0      | 182                |
|           |              |                 | 20,442             |              | 17,428             |              | 14,795             |

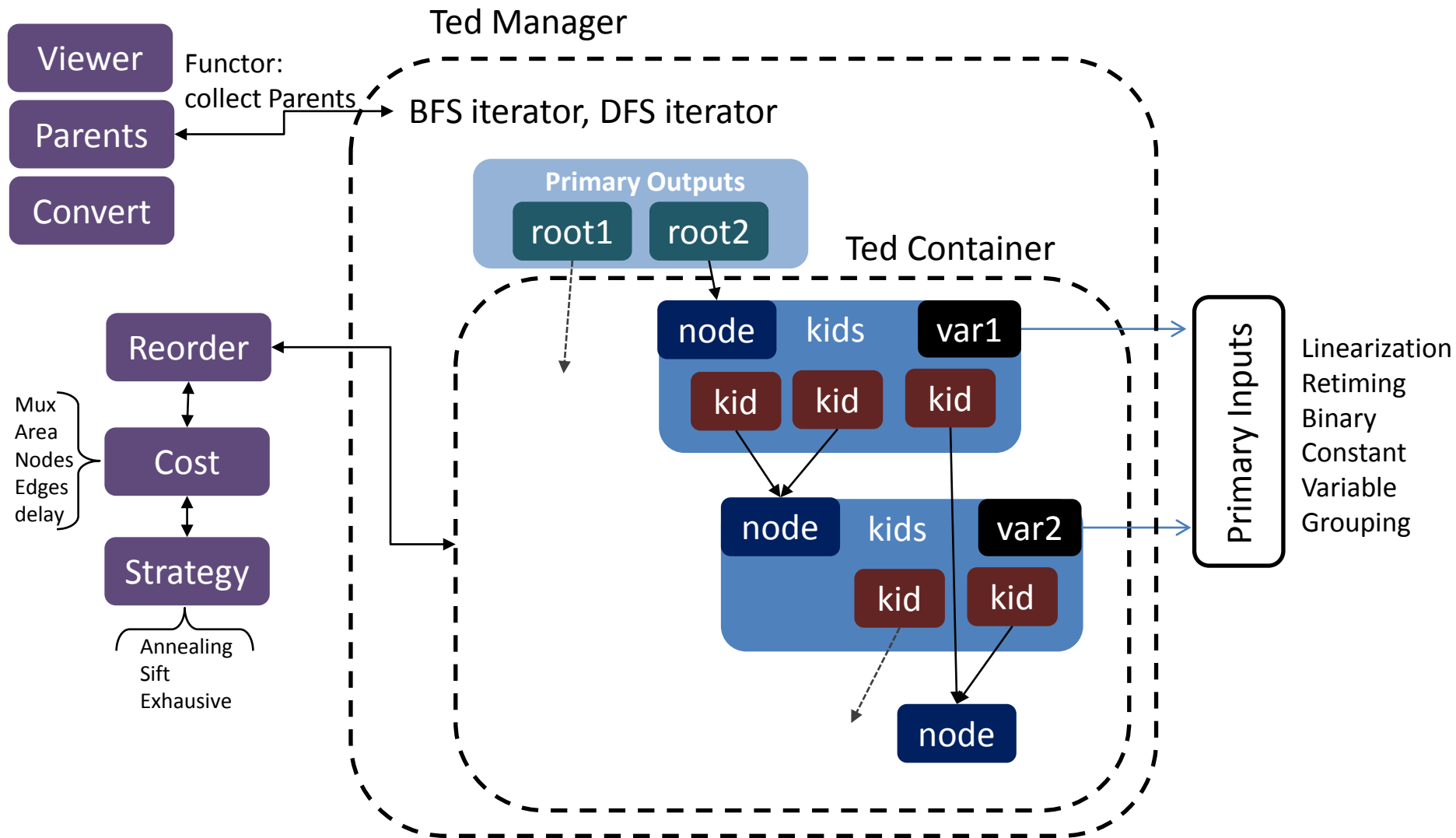
# Improvement over CSE and Original Design

|                 | Design       | Original design |      | CSE solution |      | TDS solution |      |
|-----------------|--------------|-----------------|------|--------------|------|--------------|------|
|                 | Latency (ns) | +, ×, <, -      | Area | +, ×, <, -   | Area | +, ×, <, -   | Area |
| Cosine wavelet  | DFG →        | 9,12,9,14       | —    | 10,10,4,5    | —    | 9,10,12,7    | —    |
|                 | L=110        | —               | —    | —            | —    | 3,2,4,1      | 447  |
|                 | L=120        | —               | —    | 2,4,1,1      | 402  | 3,3,2,1      | 364  |
|                 | L=130        | —               | —    | 2,4,1,1      | 402  | 2,3,2,1      | 356  |
|                 | L=140        | —               | —    | 2,3,1,1      | 319  | 2,3,2,1      | 273  |
|                 | L=150        | —               | —    | 1,3,1,1      | 311  | 2,2,2,1      | 273  |
|                 | L=160        | —               | —    | 2,2,1,1      | 236  | 1,2,2,1      | 265  |
|                 | L=170        | —               | —    | 1,2,1,1      | 228  | 2,2,1,1      | 236  |
| Chroma          | L=180        | 2,5,1,1         | 476  | 1,2,1,1      | 228  | 2,2,1,1      | 236  |
|                 | DFG →        | 8,12,0,2        | —    | 10,6,7,8     | —    | 7,13,0,9     | —    |
|                 | L=100        | —               | —    | —            | —    | 2,5,0,3      | 455  |
| Chebyshev polys | L=110        | 2,4,0,2         | 364  | 2,3,3,2      | 413  | 2,4,0,2      | 364  |
|                 | DFG →        | 3,15,5,0        | —    | 7,7,4,1      | —    | 6,7,10,6     | —    |
|                 | L=100        | —               | —    | —            | —    | 2,3,2,1      | 347  |
|                 | L=110        | —               | —    | —            | —    | 2,2,2,1      | 264  |
|                 | L=120        | —               | —    | 1,3,1,1      | 302  | 1,2,2,1      | 256  |
|                 | L=130        | —               | —    | 1,2,1,1      | 219  | 1,2,1,2      | 227  |
|                 | L=140        | —               | —    | 1,2,1,1      | 219  | 1,2,1,1      | 219  |
|                 | L=150        | —               | —    | 1,2,1,1      | 219  | 1,2,1,1      | 219  |
| Quintic Spline  | L=160        | —               | —    | 1,2,1,1      | 219  | 1,2,1,1      | 219  |
|                 | L=170        | 1,3,1,0         | 265  | 1,1,1,1      | 136  | 1,1,1,1      | 136  |
|                 | DFG →        | 5,28,2,0        | —    | 5,13,3,0     | —    | 6,14,4,0     | —    |
|                 | L=110        | —               | —    | —            | —    | 1,5,1,0      | 460  |
|                 | L=120        | —               | —    | —            | —    | 2,4,2,0      | 422  |
|                 | L=130        | —               | —    | —            | —    | 1,4,1,0      | 377  |
|                 | L=140        | —               | —    | 1,4,1,0      | 377  | 1,3,1,0      | 294  |
|                 | L=150        | —               | —    | 1,3,1,0      | 294  | 1,3,1,0      | 294  |
| Quartic Spline  | L=160        | —               | —    | 1,3,1,0      | 211  | 1,3,1,0      | 294  |
|                 | L=170        | —               | —    | 1,2,1,0      | 211  | 1,3,1,0      | 294  |
|                 | L=180        | 1,5,1,0         | 460  | 1,2,1,0      | 211  | 1,2,1,0      | 211  |
|                 | DFG →        | 4,21,2,0        | —    | 5,11,4,0     | —    | 5,13,4,0     | —    |
|                 | L=100        | —               | —    | —            | —    | 2,5,1,0      | 468  |
|                 | L=110        | —               | —    | —            | —    | 1,5,1,0      | 460  |
|                 | L=120        | —               | —    | —            | —    | 2,4,1,0      | 385  |
|                 | L=130        | —               | —    | 1,3,1,0      | 294  | 1,4,1,0      | 377  |
| VCI 4x4         | L=140        | —               | —    | 1,3,1,0      | 294  | 1,3,1,0      | 294  |
|                 | L=150        | —               | —    | 1,2,1,0      | 211  | 1,3,1,0      | 294  |
|                 | L=160        | 1,5,0,0         | 423  | 1,2,1,0      | 211  | 1,3,1,0      | 294  |
|                 | DFG →        | 11,12,0,0       | —    | 11,0,8,9     | —    | 9,2,4,6      | —    |
|                 | L=70         | 4,7,0,0         | 613  | —            | —    | 4,2,4,4      | 406  |
|                 | L=80         | 4,6,0,0         | 530  | —            | —    | 4,2,2,2      | 302  |
|                 | L=90         | 3,4,0,0         | 356  | —            | —    | 2,2,2,2      | 286  |
|                 | L=100        | 3,4,0,0         | 356  | 2,0,4,2      | 208  | 2,1,2,2      | 203  |

| Design    | TDS vs      |          |             |          |
|-----------|-------------|----------|-------------|----------|
|           | Original    |          | CSE         |          |
|           | Latency (%) | Area (%) | Latency (%) | Area (%) |
| SG Filter | 25.00       | 27.62    | 0.00        | 20.73    |
| Cosine    | 38.88       | 50.42    | 8.33        | 9.45     |
| Chrome    | 9.09        | 0.00     | 9.09        | 11.86    |
| Chebyshev | 41.17       | 48.68    | 16.66       | 15.23    |
| Quintic   | 38.88       | 54.13    | 21.42       | 22.02    |
| Quartic   | 37.50       | 30.50    | 23.07       | -28.23   |
| VCI 4x4   | 0.00        | 42.98    | 30.00       | 2.40     |
| Average   | 27.22       | 36.33    | 15.51       | 7.64     |

# Part II: Data Structure







*Thanks ...*