

#### How HLS and SystemC is Delivering on its Promise of Design and Verification Productivity

Stuart Swan – HLS Technologist at Mentor, A Siemens Business Mike Meredith – Product Engineering Group Director for Stratus HLS at Cadence Design Systems, Inc. Matthew Bone – HLS and Design Methodology Expert at Intel Corp. Rangharajan Venkatesan – Senior Research Scientist at NVIDIA Corp.











#### **Speakers**



Stuart Swan HLS Technologist Mentor, A Siemens Business Mike Meredith Product Engineering Group Director for Stratus HLS Cadence Design Systems, Inc.



Matthew Bone HLS & Design Methodology Expert Intel Corp.



Rangharajan Venkatesan Senior Research Scientist NVIDIA Corp.





#### Agenda

- Stuart Swan: A Brief Introduction to High-Level Synthesis
- Mike Meredith: Accellera SystemC Synthesizable Subset Standard
- Matthew Bone: Techniques for Optimization of Power and Performance using HLS
- Rangharajan Venkatesan: MatchLib-based Object-Oriented HLS Methodology

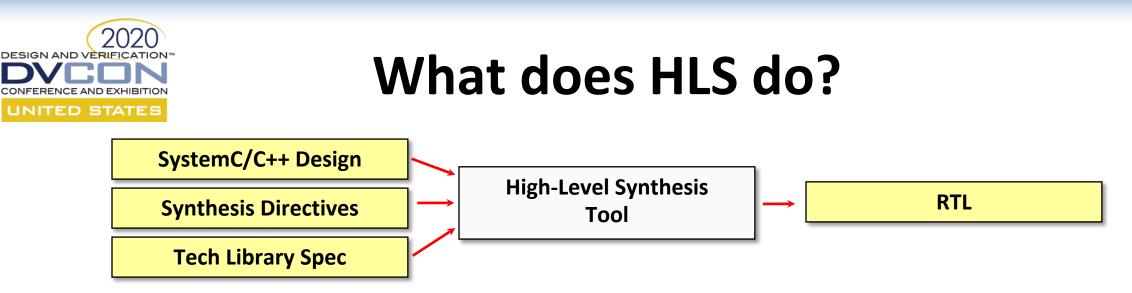




Stuart Swan, Mentor, A Siemens Business

#### **A BRIEF INTRODUCTION TO HIGH-LEVEL SYNTHESIS**





- The HLS tool:
  - precisely characterizes delay/area of all operations in design
  - schedules all the operations over the available clock cycles
  - can optionally increase latency
    - to share resources and reduce area
    - to enable positive slack at gate level
  - generates RTL that is functionally equivalent to input SystemC/C++
    - HLS automatically creates FSMs, muxes, etc for pipelining and resource sharing





– Unrolling

- Pipelining

#### **Core HLS Optimization Concepts**

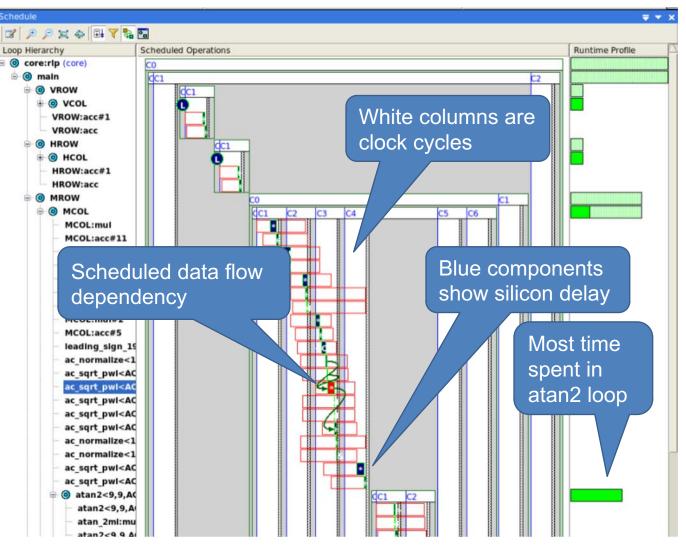
- conv2d 3 \$ Loop optimizations Iteration Count: Interface InputImg:rsc (2073600x3) Unrol (D) kernelirsc (1x288 2 Pinelin Architectur Loops in stall design Loops can be Merger Automatic merging for (int i=0;i<4;i++) {</pre> acc += data in[i] \* coef in[i] ; 1+ lata written o **Register Lifetime** t1 t2 dout Shared resource - + 1+ dout Shared register
- Scheduling
  - Automatic timing closure based on target technology
- **Register and Resource sharing** 
  - Automatic lifetime and mutual exclusivity analysis and optimization





## Graphical Analysis of HW Performance

- Designers need to know what is happening during HLS
- HLS tools provide a view of the timed design
- Cross-probe back to source
- Understand dataflow, timing and dependencies





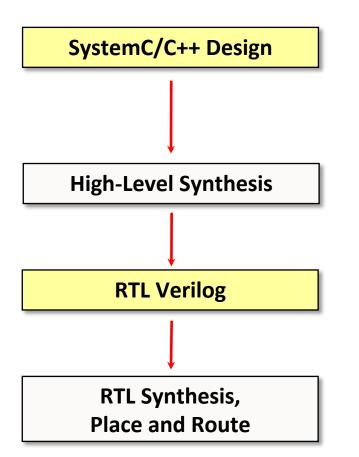


#### **Coding Style is Key to Good QOR**

- Need to properly capture HW architecture when you write your code!
  - I/O and memory architecture
  - Process structure
  - Useful to have rough idea what RTL will be generated and how expensive it will be.
    - E.g. still need to constrain bitwidths of variables (unlike SW programming)
  - Leave the details of loop pipelining, microarchitecture optimization, memory access scheduling, etc to the HLS tool to optimize







# **Typical HLS Flow**

- Write, verify, refine C++ code
- Typical testbench environments: SystemC/C++, Matlab, SV UVM, ...
- Perform code/functional coverage closure on SystemC/C++ model
- Explore and refine microarchitecture (using HLS directives)

 Achieve RTL code/functional coverage closure on RTL by leveraging existing SystemC/C++ testbench, SV UVM testbench, ...





#### Why is HLS Beneficial?

- Model is higher abstraction:
  - Smaller, fewer mistakes
  - More easily reusable (parameterizable, etc)
  - Easier to retarget to different silicon technologies
- Verification is faster and easier
- Enables ability to quickly explore PPA tradeoffs
- QOR very competitive to hand-written RTL





Mike Meredith, Cadence Design Systems

#### ACCELLERA SYSTEMC SYNTHESIZABLE SUBSET STANDARD





#### **General Principles**

- Define a meaningful minimum subset
  - Establish a baseline for transportability of code between HSL tools
  - Leave open the option for vendors to implement larger subsets and still be compliant
- Include useful C++ semantics if they can be known statically eg templates
- Covers behavioral model in SystemC for synthesis
- Covers RTL model in SystemC for synthesis
- Main emphasis of the document is on behavioral model synthesizable subset for High-Level Synthesis





#### Scope Of The Standard

#### **SystemC Elements**

- Modules
- Processes
  - SC\_CTHREAD
  - SC\_THREAD
  - SC\_METHOD
- Reset
- Signals, ports, exports
- SystemC datatypes

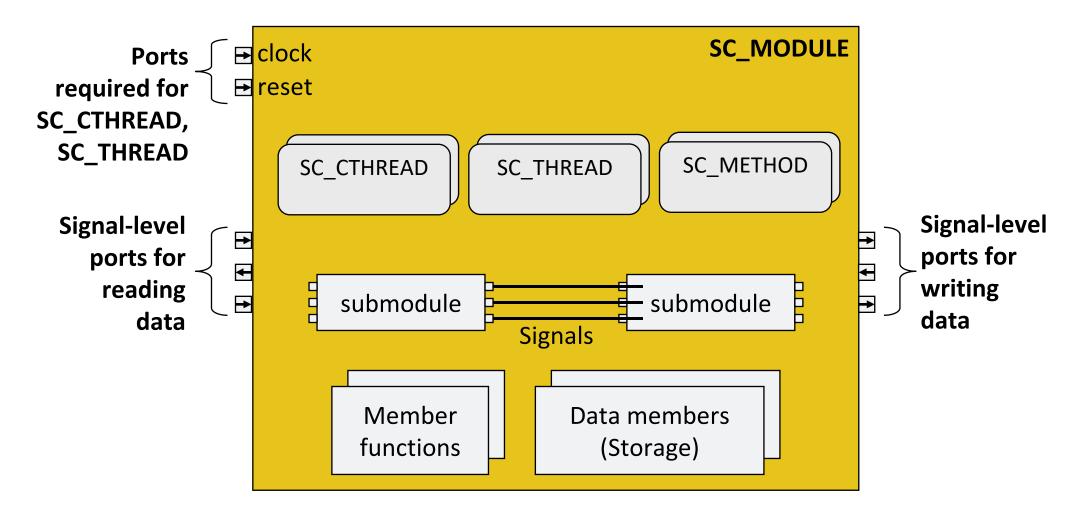
#### C++ Elements

- C++ datatypes
- Expressions
- Functions
- Statements
- Namespaces
- Classes
- Overloading
- Templates

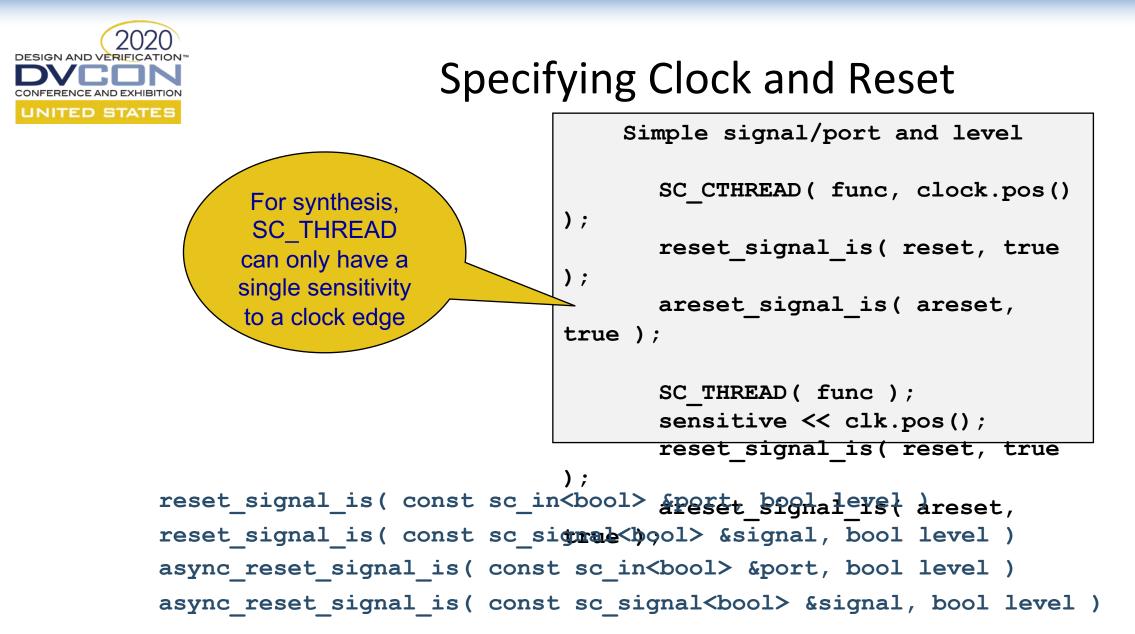




#### Module Structure for Synthesis











#### Module Declaration

- Module definition
  - SC\_MODULE macro or
  - Derived from sc\_module
  - SC\_CTOR or
  - SC\_HAS\_PROCESS
- Classes that derive from modules are supported

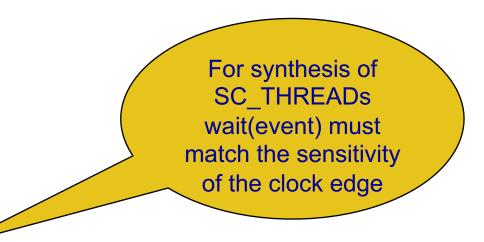
```
// A module declaration
SC MODULE ( my module1 ) {
       sc in< bool> X, Y, Cin;
       sc out< bool > Cout, Sum;
       SC_CTOR( my_module1 ) {...}
};
// A module declaration
SC MODULE( my module1 ) {
       sc in< bool> X, Y, Cin;
       sc out< bool > Cout, Sum;
  SC HAS PROCESS ( my module1 );
      my module1(const sc module name
name )
              : sc module(name)
 {...}
};
```





# Use Of wait()

- For synthesis, wait(...) can only reference the clock edge to which the process is sensitive
- For SC\_CTHREADs
  - wait()
  - wait(int)
- For SC\_THREADs
  - wait()
  - wait(int)
  - wait(clk.posedge\_event())
  - wait(clk.negedge\_event())







#### Data Types

- Primary SystemC data types
  - sc\_int, sc\_uint
    - Fixed bit widths <=64
  - sc\_bigint, sc\_biguint
    - Arbitrary fixed bit widths
  - sc\_fixed, sc\_ufixed
    - Fixed point with configurable rounding and saturation

Additional SystemC data types

-sc\_bv

• Bit vector, no arithmetic

- sc\_logic

- Single-bit 4 state logic, but "X" and "Z" are not supported
- -sc\_lv
  - Vectors of sc\_logic
- C++ integral types
  - All C++ integral types except wchar\_t
  - char is signed (undefined in C++)





#### Pointers

- Supported for synthesis
  - "this" pointer
  - "Pointers that are statically determinable are supported.
     Otherwise, they are not supported."
  - If a pointer points to an array, the size of the array must also be statically determinable.

- Not Supported
  - Pointer arithmetic
  - Testing that a pointer is zero
  - The use of the pointer value as data
    - eg hashing on a pointer is not supported for synthesis





Matthew Bone, Intel Corp.

# TECHNIQUES FOR OPTIMIZATION OF POWER AND PERFORMANCE USING HLS





#### Intro

- Growth of HLS usage seen in many design domains at Intel
  - Powerful tools enable new design methodology
  - Benefits for datapath and control dominated designs
  - Benefits break down roughly into three categories:
    - Schedule/TTM, power/performance, SW quality and code sharing
  - Case studies have been hand-picked to focus on power/performance and design space exploration





#### The Challenge

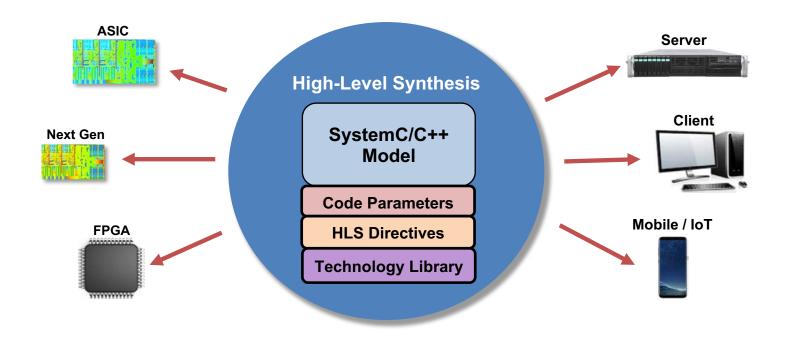
- Massive scale of designs and shortened schedules
  - Finishing functionality for many pieces is a large effort
  - Limited time available to explore power and performance
- Power is often the important metric
  - Mobile devices have passed desktop devices for web access
  - Datacenter costs (power, cooling)
- Using Traditional (RTL) Methodology
  - Power/performance estimates available later in the design phase
  - High-effort to make changes to address power/performance
  - Language improves (System Verilog), but still 35 year old abstractions





#### **High-Level Synthesis**

- SystemC source more concise expression than RTL
  - Tool directives select parallelism, throughput, latency, storage types
  - Technology library provides parts information
    - e.g. the area and delay of a 16x16 multiplier

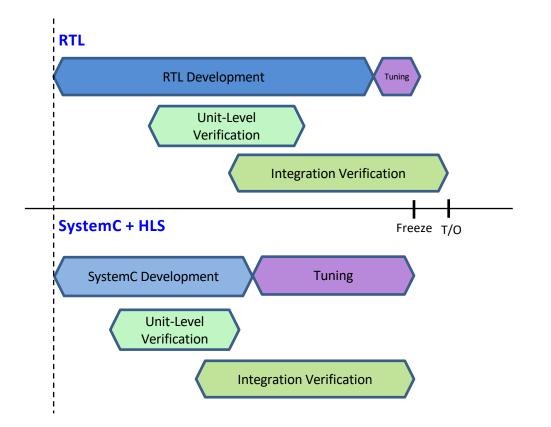






#### Why HLS? #1: Faster TTM

- Designer benefits:
  - Concise code (3-10X fewer lines than RTL)
  - Powerful directives for uarch decisions
  - Effort savings in tracking spec changes
- Verification benefits:
  - Begin earlier
  - Simulation acceleration (100X faster than RTL)
- Physical design benefits:
  - High quality RTL with good timing/routing characteristics

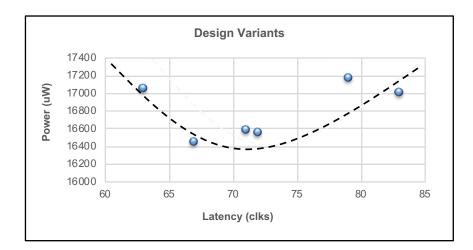


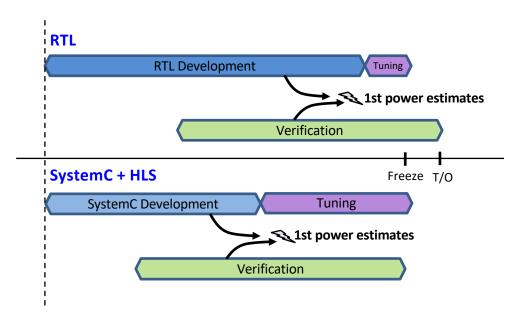




#### Why HLS? #2: Better PnP

- Exploration
  - Low effort for arch/uarch variants
- Earlier power estimates
  - Time to react with architectural changes, or "tuning" HLS directives
- Custom RTL
  - Targets specific process node library (or FPGA)



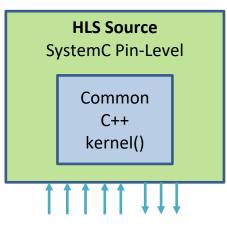




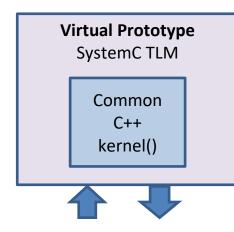


# Why HLS? #3: SW/FW Quality

- SystemC language:
  - Opportunity for re-use of SC/HLS model as SW Virtual Prototype (or arch/perf model)
- Two styles of re-use seen:
  - Use SC/HLS model *as-is* for VP
  - Re-use the "core" portions of the SC/HLS model, with changes for VP speed-up



#### Use HLS model as-is: Fast enough for SW/FW verification in many cases



#### Use "core" of HLS model: Fastest simulation may require using TLM interfaces, and disabling some HW details





### Exploration: Power/Performance

- Seeking best power/perf will be referred to as **design space exploration**, or just **tuning** later in the design phase
- Many RTL variants can be created by changing only HLS tool directives
  - "Micro-architectural" changes
  - Goal frequency, throughput, latency
  - Storage scheme (registers, latch arrays, RFs, SRAMs)
- Some exploration requires edits to the SystemC source
  - "Architectural" changes
  - Usually more significant changes to partitioning or ordering of an algorithm
  - Edits in SystemC are less effort than RTL

**Pipelining II vs. Frequency** 

uarch	Area	Latency
PIPE_II4	16490	71
PIPE_II1	31707	55
PIPE_II1_192MHz	18847	12

#### RF vs. SRAM vs. Multi-Port RAM

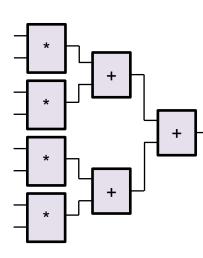
	Data Rd/Wrs			
clk				
sram	rd1 \ wr1 \ rd2 \ wr2 \ rd3 \ wr3 \ rd4 \ wr4 \			
rf	rd1 X rd2 X rd3 X rd4 X			
	wr1 \ wr2 \ wr3 \ wr4 \			
truedp	<mark>/ rd1                                   </mark>			
	7 rd2 \ rd4 \			
	<u>wr1 x wr3 x</u>			
	wr2 \ wr4 \			

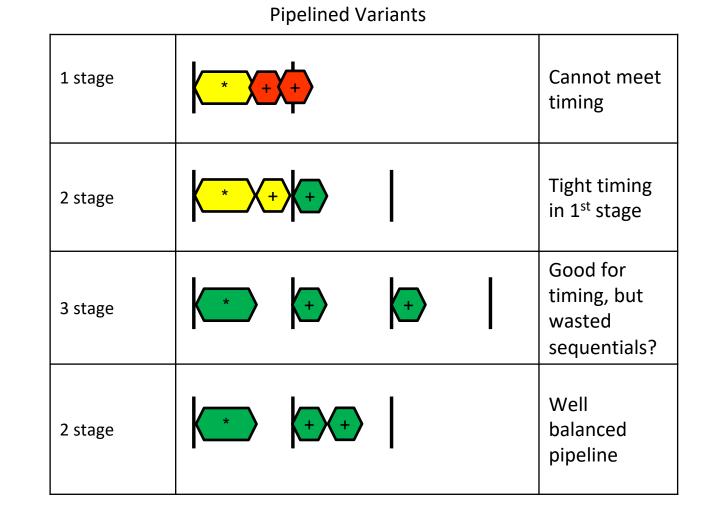




### **Exploration:** Pipelining

- Pipelining example
  - FIR filter





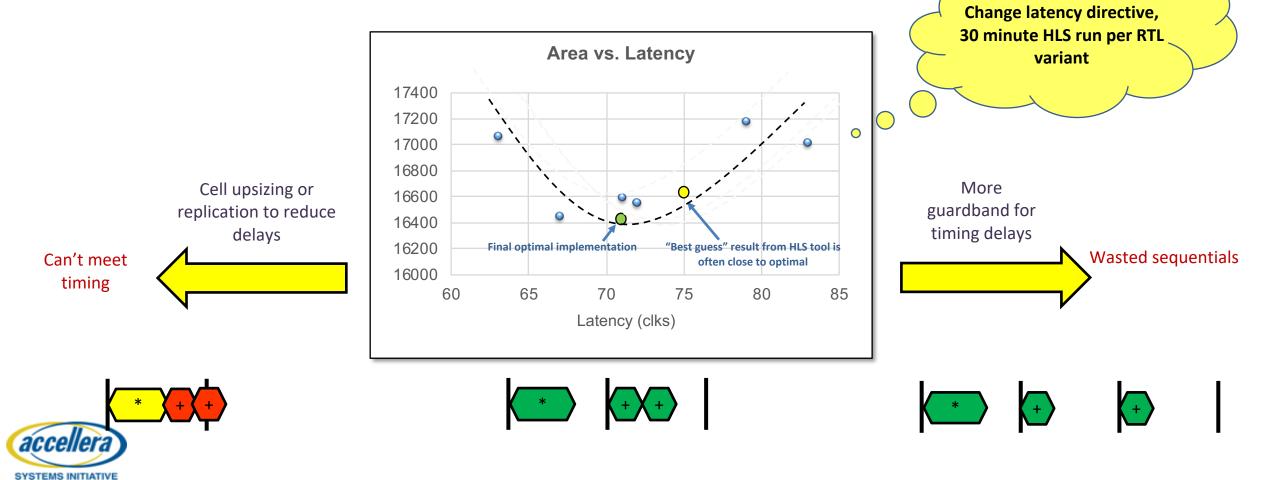


NOTE: Similar multiply and accumulate trees are common in AI/NN domain



### **Exploration: Pipelining 2**

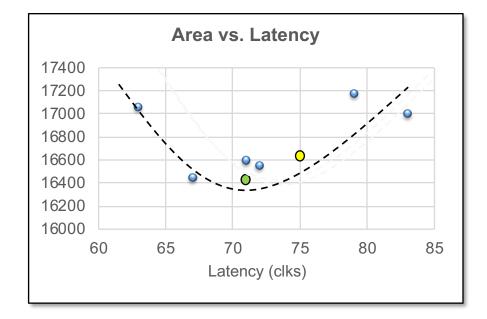
• **Case Study:** Signal Processing, 5G MMSE (datapath)





# Exploration: Pipelining 3

- Existing RTL vs. HLS Results
  - Area:
    - 21.9k -> 16.4k (34% savings)
    - Multipliers shared efficiently by HLS
  - Latency:
    - 102 -> 71 clocks (29% savings)
    - Existing RTL developed on previous tech node
  - Throughput:
    - 1 per 4 clocks -> 1 per clock (4X)
    - HLS gives options:
      - 4X the throughput for 2X the area
      - Same throughput at 1/4<sup>th</sup> the clock freq (power)



#### **Pipelining II vs. Frequency**

uarch	Area	Latency
PIPE_II4	16490	71
PIPE_II1	31707	55
PIPE_II1_192MHz	18847	12





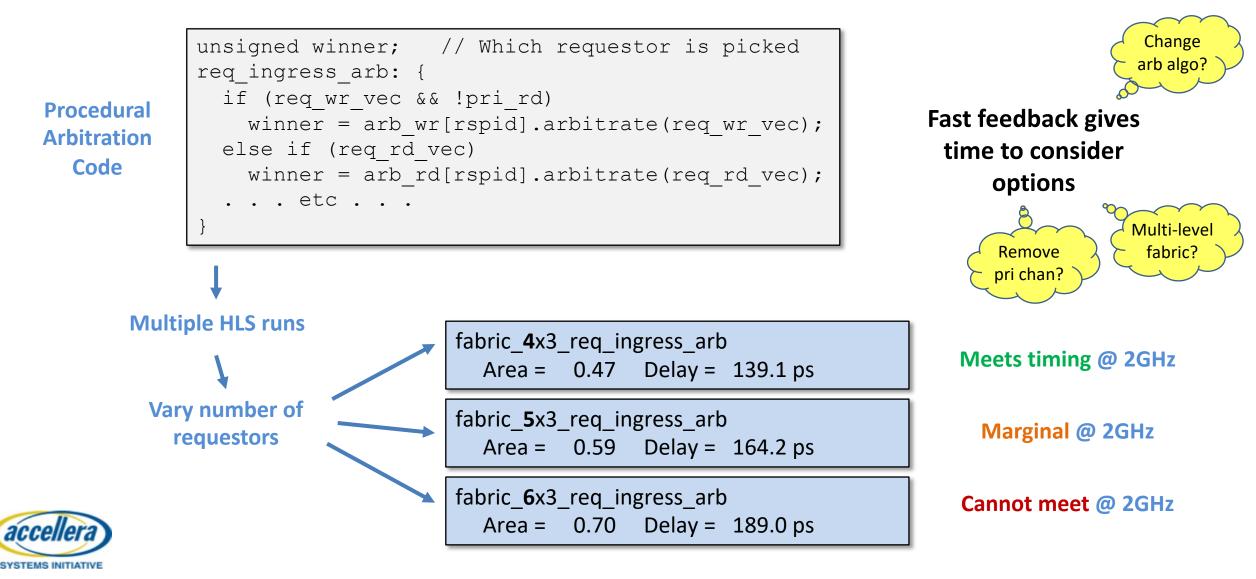
### Exploration: Max Frequency

- **Case Study:** High-Frequency Memory Fabric (control logic)
  - Maximum frequency of the fabric primarily limited by arbitration algorithms
- Challenges with traditional RTL design:
  - Timing analysis done after synthesis of entire fabric (long turnaround)
  - Timing path analysis through arbitration and fabric modules (high effort)
- With HLS design:
  - Tool does "characterization" logic synthesis for a region of code performing arbitration
  - Early information; delay for entire arbitration operation is grouped





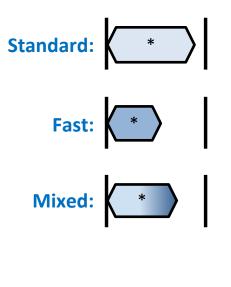
#### **Exploration: Max Frequency 2**





#### **Exploration: Static Power**

- Static (leakage) power is managed through Multi-Vt cells
  - SVT: Standard Vt "Slow" Standard delay, Low leakage
  - LVT: Low Vt
     "Fast" Shorter delay, High leakage
- Goals differ depending on design:
  - Mobile: Prioritize low leakage (battery life, always active blocks)
    - Design team may target a split like 90/10 for SVT/LVT cells
  - Server: Tolerant of higher leakage (power-down idle silicon)
    - Design team may target a split with majority LVT cells (and some ultrafast ULVT)

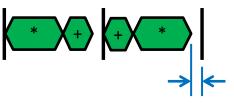




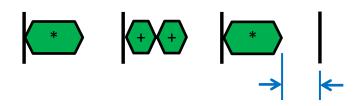


#### **Exploration: Static Power 2**

- Targeting a split like 90/10 for SVT/LVT cells:
  - "Slow" (average) cell delays, very low leakage for 90% of cells
  - Small portion of fast, high-leakage cells to resolve tight timing issues
  - In HLS tool terms:
    - "Fit as much logic as possible in each stage, reserve a very small timing guardband"
- What if low leakage is the primary goal?
  - Trade-off is latency for power
  - Slower cells require more time/stages to compute



Small guardband for routing/unpredicted delays



Large guardband for routing/unpredicted delays, no need for fastest cells

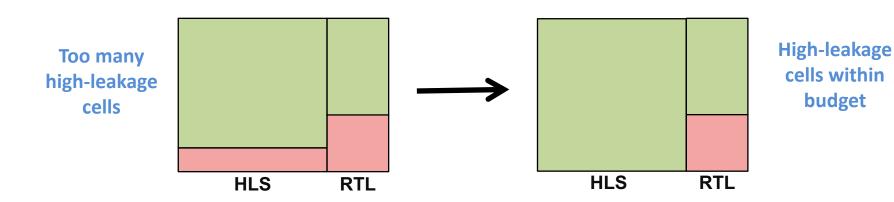




SYSTEMS INITIATIVE

### **Exploration: Static Power 3**

- **Case study:** 5G Transceiver (mostly datapath)
  - Always on (or quick wake-up); power-down is not an option
  - Must have low leakage
- Target was 90% of the total design using low-leakage cells
  - Legacy RTL and cores were using 40% high-leakage cells
  - Re-pipeline all blocks (20+) with large timing guardband
    - 1 day's effort

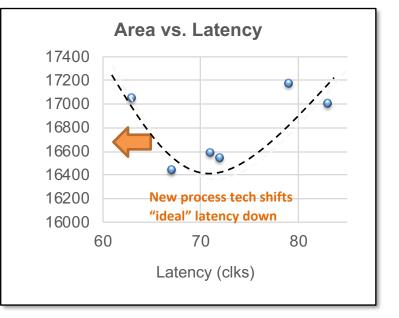




#### Efficient Reuse with HLS

- Next-gen technology
  - Change from XXnm to Ynm tech node
  - Re-generate RTL that is timing-clean and has wellbalanced (power efficient) pipelines on the new tech node

- HLS Parameterization
  - Same filter code can be used with different latency, throughput, parallelism directives
  - Re-use same SystemC IP across product spectrum:
    - Server: Fastest cells, high frequency/parallelism/throughput
    - Mobile: Low-leakage cells, latency/throughput tradeoffs







# Wrap Up

- HLS finds low power and efficient solutions
  - Design space exploration
  - Late "tuning" changes
  - Efficient designs when moving to next gen silicon tech
- SystemC-based designs
  - Less code, less effort to make design changes
  - Simulates fast quick debug iterations
  - Portions of code usable in other domains (VP, arch/perf model)
- The Investment
  - Ramping teams into new language and toolset required real investment





Rangharajan Venkatesan, NVIDIA Corp.

## MATCHLIB-BASED OBJECT-ORIENTED HLS METHODOLOGY









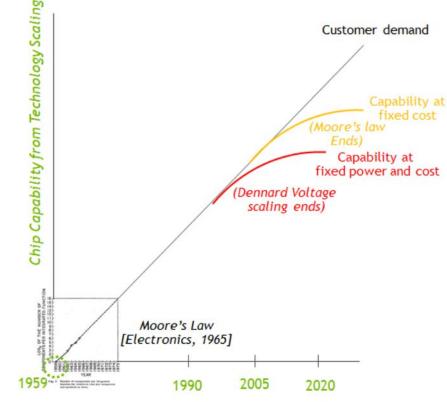
- Motivation Chip Design Complexity
- Object-oriented HLS Approach
  - A "C++/SystemC-to-Layout" Flow
  - MatchLib Opensource HLS library
  - Latency-Insensitive Channels: Connections
  - Verification Methodology
- SoC TestChip Demonstrations
- RC18: Scalable Deep Learning Accelerator
  - 128 TOPS, ~10 TOPS/W
  - Spec-to-Tapeout in 6 months with <10 researchers</li>



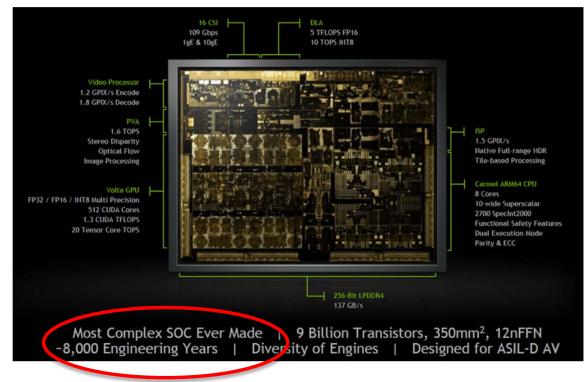


# **Chip Design Complexity**

### Customer demand for more transistors & capability, need lower design costs



#### **NVIDIA Xavier SoC [CES 2018]**

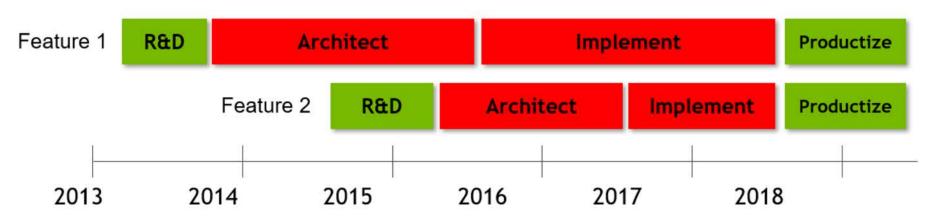






## Motivation: Shorten Development Time & Cost

### Typical development timeline: 3-5 years from R&D to product



- RTL design and verification dominates: >70% of IC design effort at NVIDIA
  - Prohibits which features make it into each SoC
- Need 10x lower design and verification effort:
  - Overlap architect & implement phases for faster time-to-market, more features





# High-productivity Design Approach

### Enables faster time-to-market and more features to each SoC

### RAISE HARDWARE DESIGN LEVEL OF ABSTRACTION

Use High-level languages e.g. C++/SystemC instead of Verilog

Use Automation

e.g. High-Level Synthesis (HLS)

Use libraries/generators

MatchLib



### **AGILE VLSI DESIGN**

Small teams, jointly working on architecture, implementation, VLSI

Continuous integration with automated tool flows

Agile project management techniques

24-hour spins from SystemC-to-layout





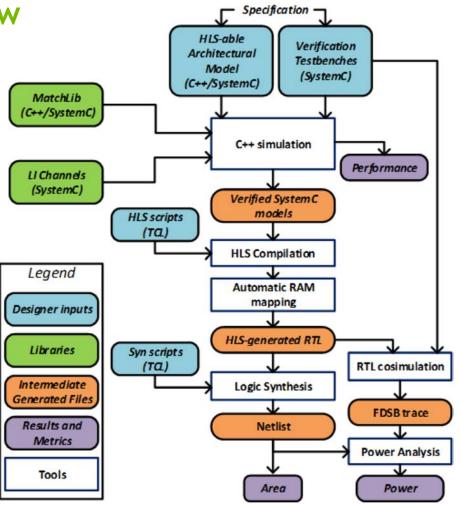


# **Object-Oriented High-Level Synthesis (OOHLS)**

### "Push-button" SystemC-to-gates flow

- Leverage HLS tools to design with C++ and SystemC models
- MatchLib: Modular Approach To Circuits and Hardware Library
  - "STL/Boost" for Hardware Design
  - Synthesizable hardware library developed by NVIDIA research
  - Highly-parameterized, high QoR implementation
  - Available open-source: <u>https://github.com/NVlabs/matchlib</u>
- Latency-Insensitive (LI) Channels
  - Enable modularity in design process
  - Decouple computation & communication architectures

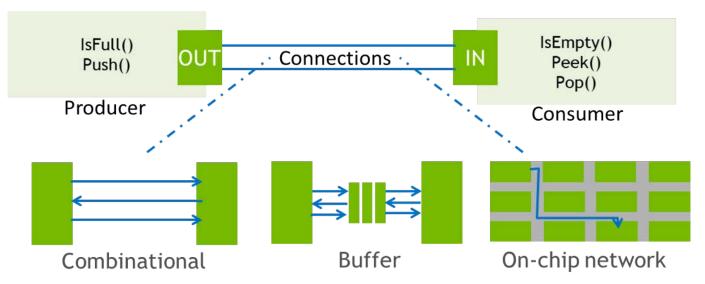






## Latency-Insensitive (LI) Channels Our approach: Connections

• Connections is a LI channel library in MatchLib



- Producer & consumer implementations are channel-agnostic, with arbitrary pipelining and scheduling
- Channels mapped to ready/valid interfaces when synthesized to RTL



# **Object-Oriented High-Level Synthesis (OOHLS)**

### **Verification Methodology**

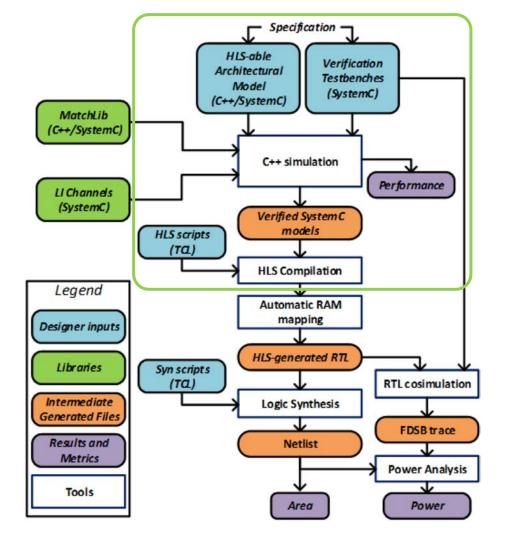
All functional verification and performance verification run natively in C++ simulation of SystemC models

- ~50x speedup over RTL
- ~3% error in performance

Leverage libraries for productivity

Use std verification approaches but in SystemC

- Constrained random generators and checkers
- Line and expression coverage
- Assertions
- All SystemC testbenches reusable with generated RTL for final verification at full-chip and unit-level
- No Formal verification Support between SystemC and RTL
  - A major challenge for widespread adoption of HLS in industry





DESIGN AND VERIFICATION"

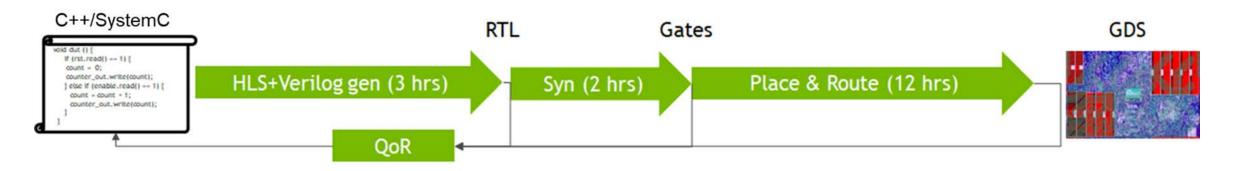
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ENCE AND EXHIBITION



# Agile VLSI design Techniques

### Daily "SystemC to Layout" Spins

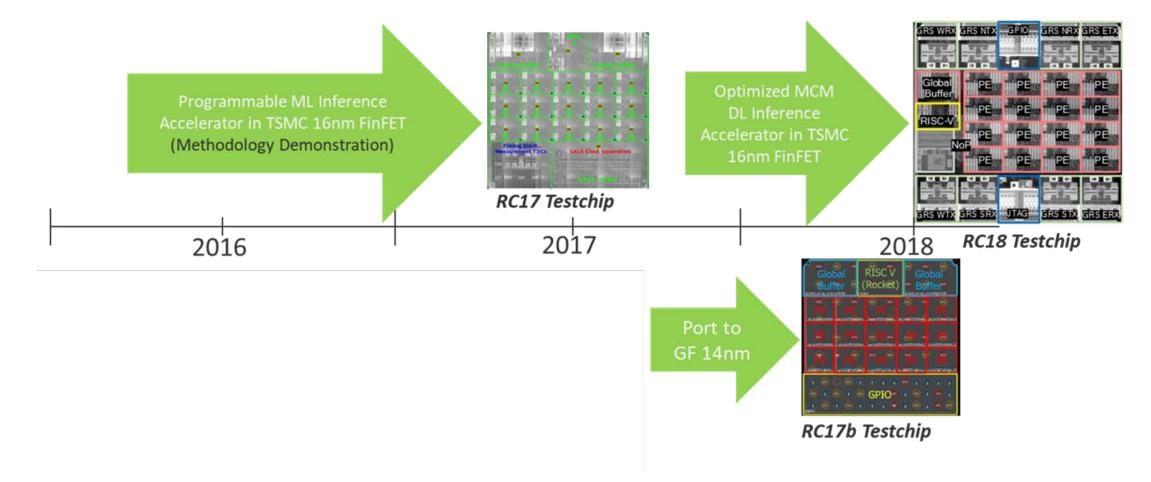


- Agile, incremental approach to design closure during march-to-tapeout phase
- Small, abutting partitions for fast place and route iterations
- RTL bugs, performance, and VLSI constraints converge together



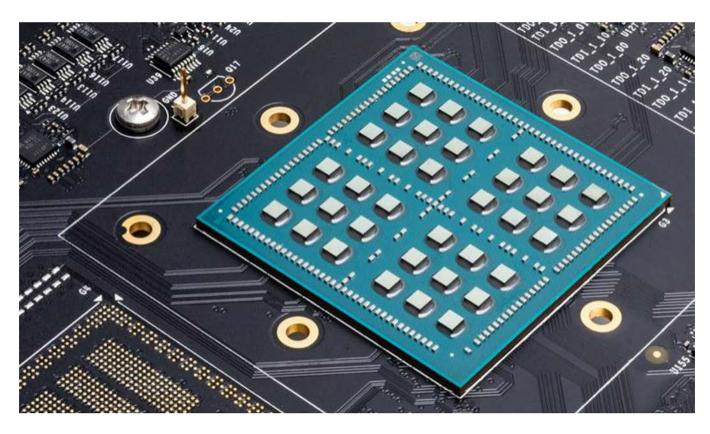


## SoC Testchip Demonstrations









### RC18: SCALABLE DEEP LEARNING INFERENCE ACCELERATOR





# RC18: Scalable DL Inference Accelerator

### **Project Goals**

- Design a state-of-the-art scalable high-performance deep learning inference accelerator
  - >100 TOPS, ~10 TOPS/W
- Demonstrate this is possible with a small team in a high-productivity
   VLSI flow



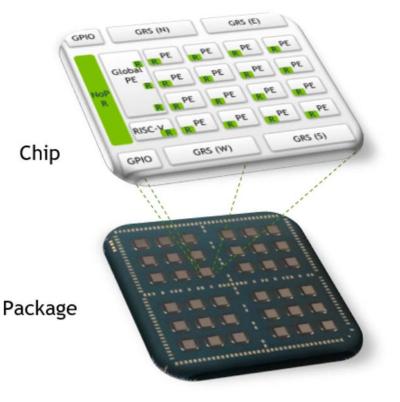




# RC18: Scalable DL Inference Accelerator

### **Tiled Architecture with Distributed Memory**

- Package
  - 6x6 Multi-Chip Modules (MCM) in a package
  - Ground-reference signaling based inter-chip communication
- Chip
  - 4x4 array of Processing Elements (PEs) per chip
  - Global Buffer/PE for 2<sup>nd</sup>-level inter-layer storage
  - RISC-V controller
  - 5x4 Mesh Network-on-Chip
  - Network-on-Package and GPIO Interface

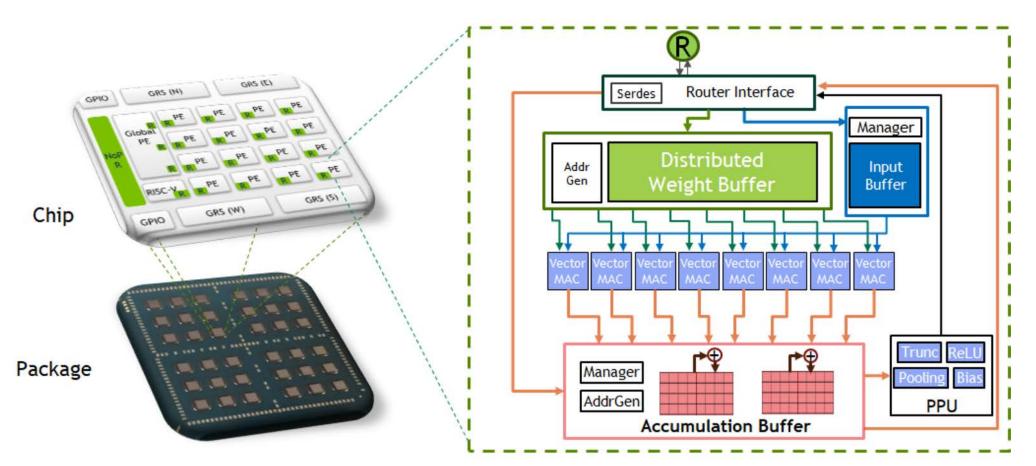






# **RC18: Scalable DL Inference Accelerator**

### **Processing Element**





Zimmer et al., VLSI 2019, Venkatesan et al. HotChips 2019



## Hierarchical Communication Architecture Network-on-Package (NoP) and Network-on-Chip (NoC)

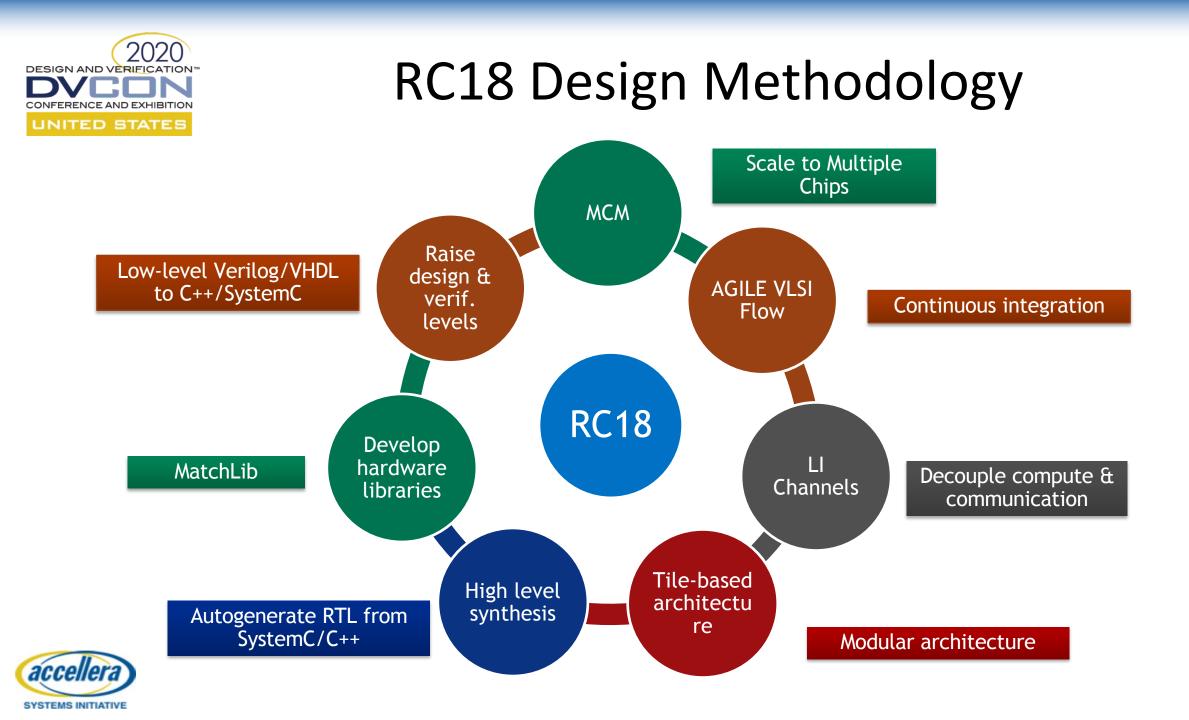
#### NETWORK-ON-CHIP (NoC)

4x5 mesh topology connects 16 PEs, one Global PE, and one RISC-V Cut-through routing with Multicast support 10ns per hop, ~70Gbps per link (at 0.72V)

### NETWORK-ON-PACKAGE (NoP)

6x6 mesh topology connects 36 chips in package. A single NoP router per chip with 4 interface ports to NoC Configurable routing to avoid bad links/chip ~20ns per hop, 100 Gbps per link (at max)

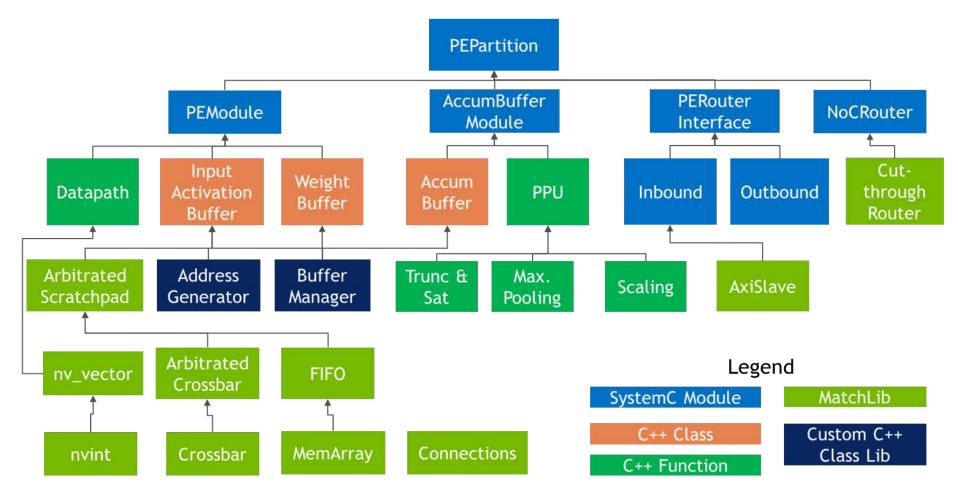






## **Processing Element Implementation**

### Reuse, Modularity, Hierarchical Design







# Fabricated MCM-based Accelerator

### NVResearch Prototype: 36 Chips on Package in TSMC 16nm Technology

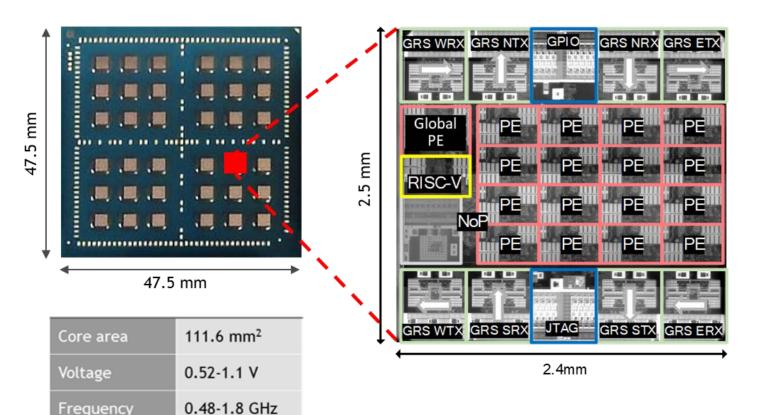
### High speed interconnects using Ground Reference Signaling (GRS) 100 Gbps per link

### **Efficient Compute tiles**

~10 TOPS/W, 128 TOPS

### Low Design Effort

Spec-to-Tapeout in 6 months with <10 researchers







## Summary

### MATCHLib-Based Object-Oriented HLS Methodology

- Design effort reduction from raising abstraction levels, tools
- Object-Oriented HLS Flow
  - Latency Insensitive Channels abstractions for all communication
  - MatchLib for capturing reuse of commonly-used hardware components
- Enables faster time-to-market and more features to each SoC
  - ~10X reduction in ASIC design and verification efforts



RC18: Scalable DL Inference Accelerator





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