

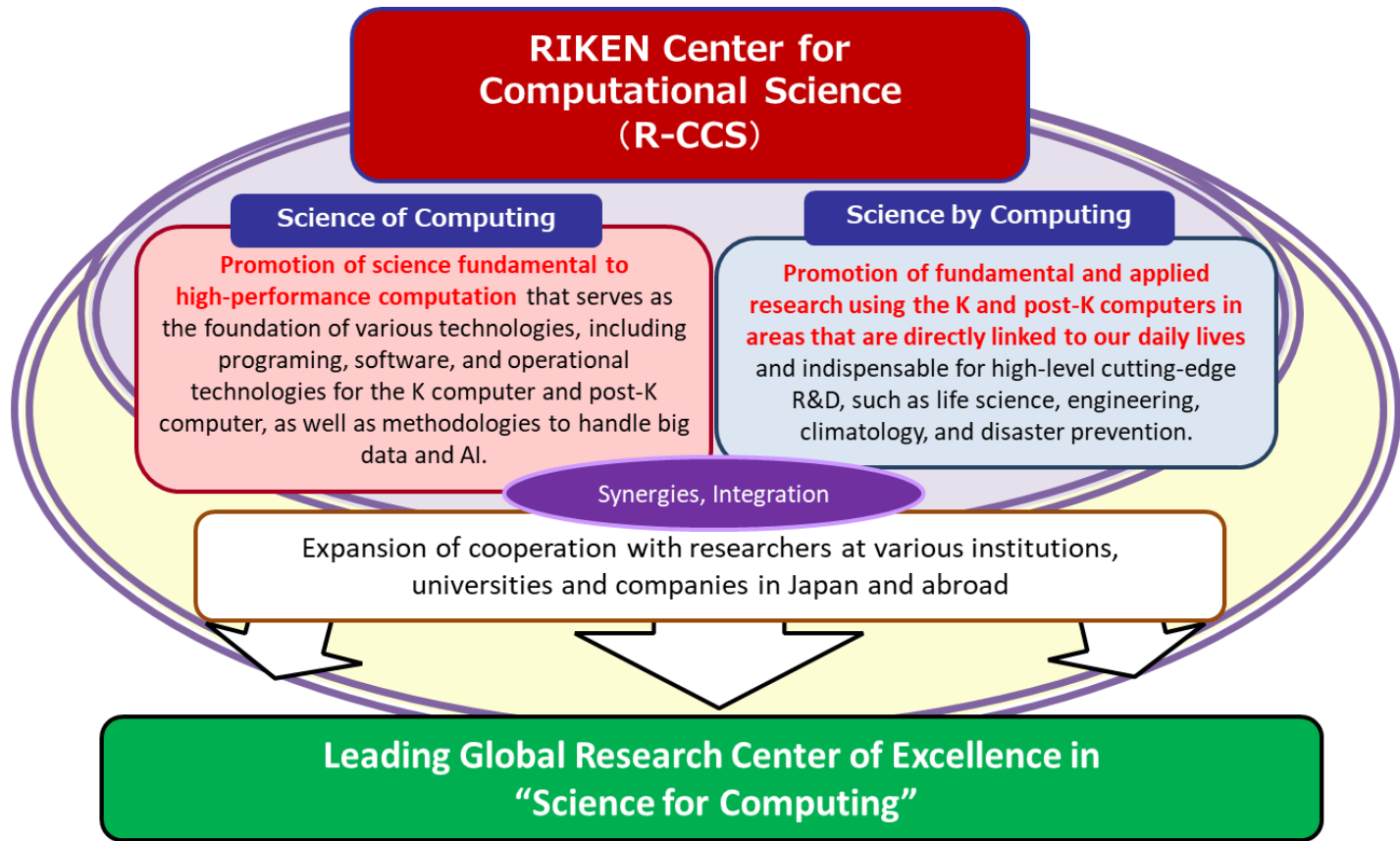
# ***Fugaku: The first 'Exascale' Supercomputer with Real Application Performance as the Primary Target, and Towards the Future***



- **Satoshi Matsuoka**
  - **Director, RIKEN Center for Computational Science & Professor, Tokyo Institute of Technology**
  - **20190908 PPAM 2019 Keynote, Bialystok, Poland**

# Riken R-CCS: Leadership HPC Research Center

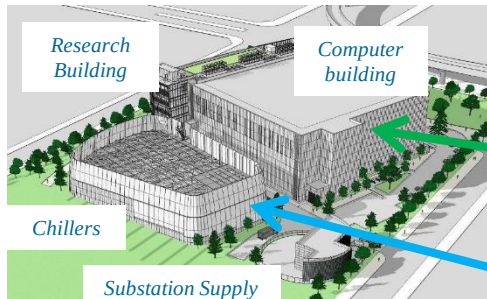
## “Science of Computing by Computing for Computing”



# R-CCS with K Computer



423 km (263 miles)  
west of Tokyo



**Computer room 50 m x 60 m = 3,000 m<sup>2</sup>**

**Electric power up to 15 MW**

**Water cooling system**

**Gas-turbine co-generation 5 MW x 2**



# K computer (decommissioned Aug. 16, 2019)

## Specifications

- Massively parallel, general purpose supercomputer
- No. of nodes: 88,128
- Peak speed: 11.28 Petaflops
- Memory: 1.27 PB
- Network: 6-dim mesh-torus (Tofu)

## Top 500 ranking

LINPACK measures the speed and efficiency of linear equation calculations.

Real applications require more complex computations.

- No.1 in Jun. & Nov. 2011
- No.20 in Jun 2019

*First supercomputer in the world to retire  
as #1 in major rankings (Graph 500)*

## Graph 500 ranking

“Big Data” supercomputer ranking  
Measures the ability of data-intensive

- No. 1 for 9 consecutive editions since 2015

## HPCG ranking

Measures the speed and efficiency of solving linear equation using HPCG

Better correlate to actual applications

- No. 1 in Nov. 2017, No. 3 since Jun 2018

## ACM Gordon Bell Prize

“Best HPC Application of the Year”

- Winner 2011 & 2012. several finalists



K computer, SPARC64 VIIIx 2.0GHz, Tofu interconnect  
RIKEN Advanced Institute for Computational Science (AICS), Japan  
is ranked  
**No. 5**  
among the World's TOP500 Supercomputers  
with 10.57 Petaflops LINPACK Performance  
in the 47th TOP500 List published at ISC16 in Frankfurt, Germany on June 29th, 2016.

Congratulations from the TOP500 Editors



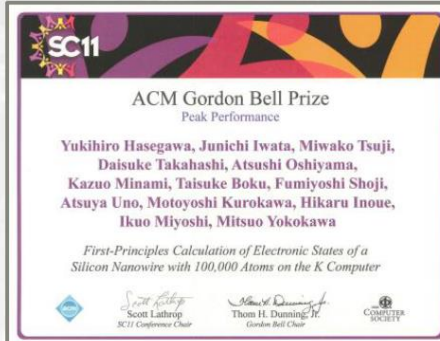
NOVEMBER 15, 2016

NUMBER 1

SYSTEM **K computer**  
RIKEN Advanced Institute  
for Computational Science  
Japan

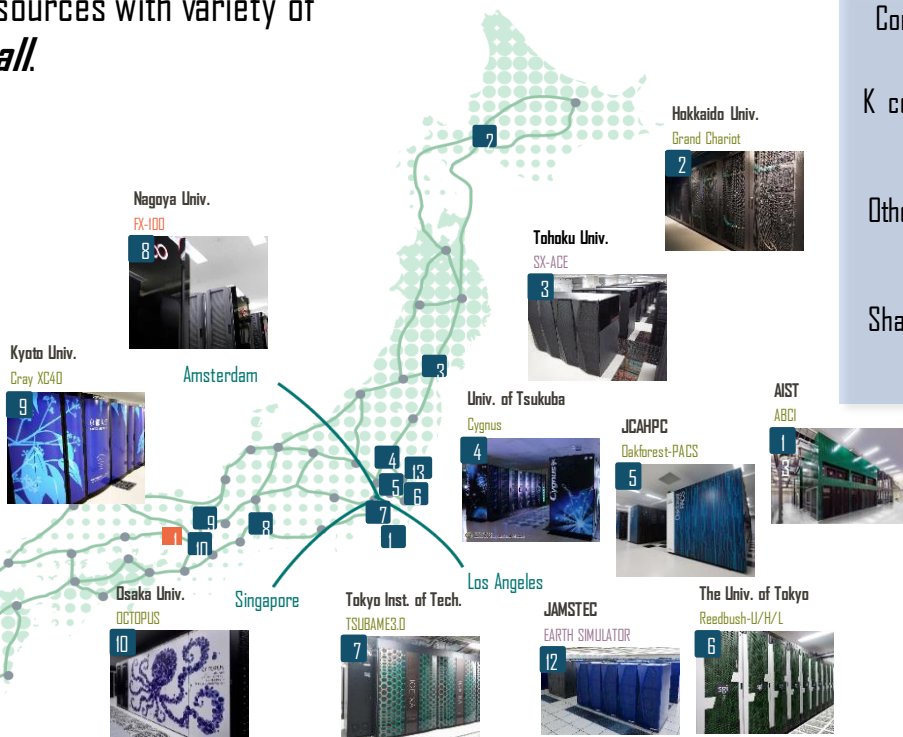
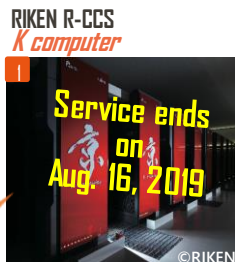
ACHIEVED **0.603**  
Pfllop/s

Signatures of the HPCG ranking officials.



# Japanese HPCI (High Performance Computing Infrastructure)

- **HPCI, High Performance Computing Infrastructure** established in 2012 as national HPC infrastructure, is a system connecting the Tier 0 flagship system and part of the Tier 1 major Universities and National Lab systems by high speed academic network (SINET-5).
- World's top class **HPCI** computing resources with variety of system type are provided to *open call*.



Computing resources allocated at the Public Call in FY 2019

K computer

**1.5 PFlops x Year**

Other HPCI machines in total

**14.2 PFlops x Year**

Shared Storage

**45 PB**

SINET-5 (100 Gbps)

- : node
- : domestic line
- : international line

As of June 2019



# The Nex-Gen "Fugaku" 富岳 Supercomputer

*Mt. Fuji representing  
the ideal of supercomputing*

High-Peak --- Acceleration of  
Large Scale Application  
(Capability)

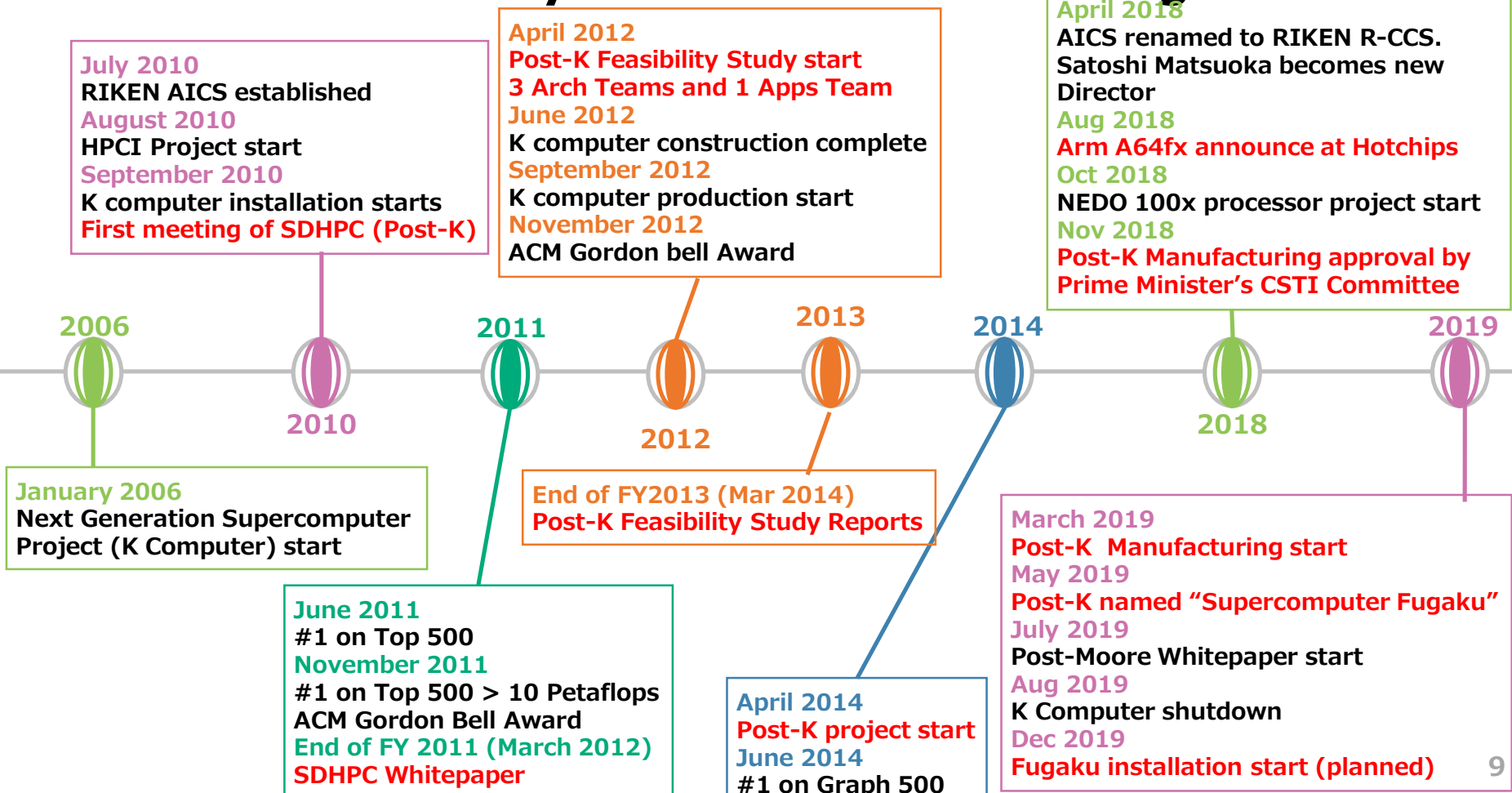
Broad Base --- Applicability & Capacity  
Broad Applications: Simulation, Data Science, AI, ...  
Broad User Base: Academia, Industry, Cloud Startups, ...

# Arm64fx & Fugaku 富岳 /Post-K are:

- **Fujitsu-Riken design A64fx ARM v8.2 (SVE), 48/52 core CPU**
  - ***HPC Optimized:*** Extremely high package high memory BW (1TByte/s), on-die Tofu-D network BW (~400Gbps), high SVE FLOPS (~3Teraflops), various AI support (FP16, INT8, etc.)
  - Gen purpose CPU – Linux, Windows (Word), other SCs/Clouds
  - Extremely power efficient – > **10x power/perf efficiency for CFD benchmark** over current mainstream x86 CPU
- **Largest and fastest supercomputer to be ever built circa 2020**
  - > 150,000 nodes, superseding LLNL Sequoia
  - > 150 PetaByte/s memory BW
  - Tofu-D 6D Torus NW, 60 Petabps injection BW (10x global IDC traffic)
  - 25~30PB NVMe L1 storage
  - many endpoint 100Gbps I/O network into Lustre
  - The first 'exascale' machine (not exa64bitflops but in apps perf.)



# Brief History of R-CCS towards Fugaku



# SDHPC (2011-2012) Candidate of ExaScale Architecture

<https://www.exascale.org/mediawiki/images/a/aa/Talk-3-kondo.pdf>

## ► Four types of architectures are considered

### ► General Purpose (GP)

- Ordinary CPU-based MPPs
- e.g.) K-Computer, GPU, Blue Gene, x86-based PC-clusters

### ► Capacity-Bandwidth oriented (CB)

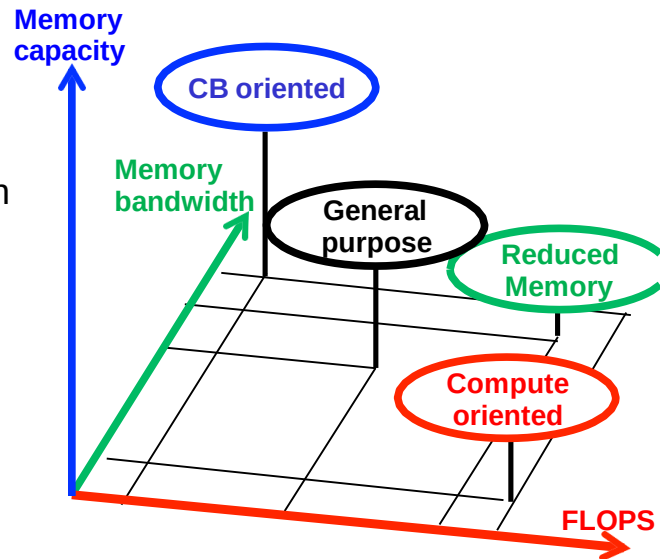
- With expensive memory-I/F rather than computing capability
- e.g.) Vector machines

### ► Reduced Memory (RM)

- With embedded (main) memory
- e.g.) SoC, MD-GRAPE4, Anton

### ► Compute Oriented (CO)

- Many processing units
- e.g.) ClearSpeed, GRAPE-DR



# SDHPC (2011-2012) Performance Projection

- Performance projection for an HPC system in 2018
  - Achieved through continuous technology development
  - Constraints: 20 – 30MW electricity & 2000sqm space

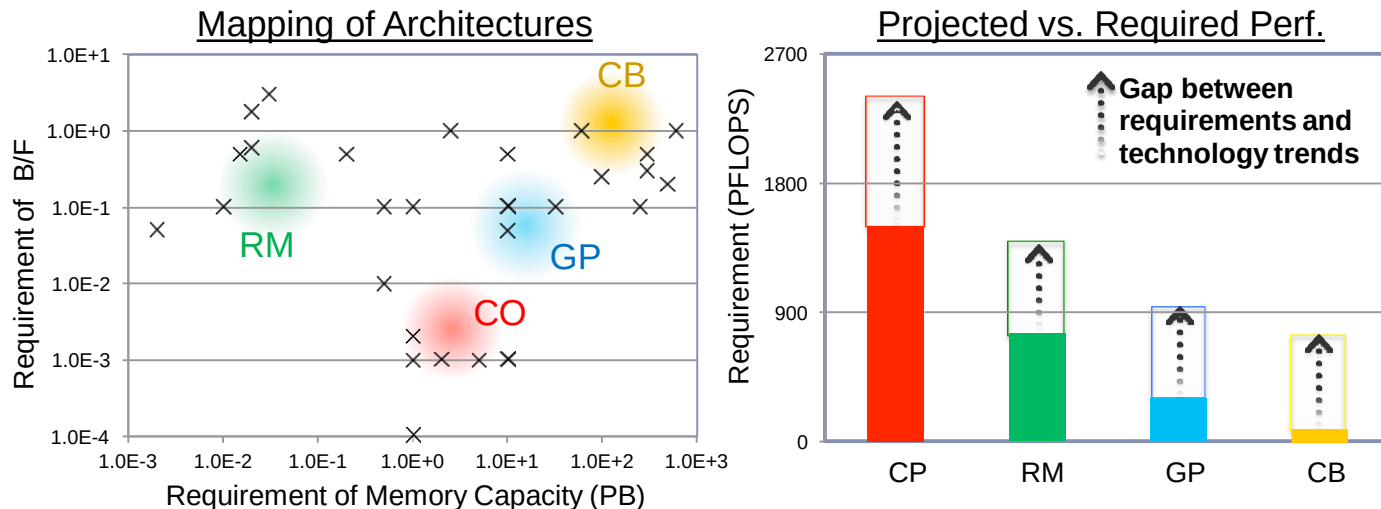
## Node Performance

|                      | Total CPU Performance (PetaFLOPS) | Total Memory Bandwidth (PetaByte/s) | Total Memory Capacity (PetaByte) | Byte / Flop |
|----------------------|-----------------------------------|-------------------------------------|----------------------------------|-------------|
| General Purpose      | 200~400                           | 20~40                               | 20~40                            | 0.1         |
| Capacity-BW Oriented | 50~100                            | 50~100                              | 50~100                           | 1.0         |
| Reduced Memory       | 500~1000                          | 250~500                             | 0.1~0.2                          | 0.5         |
| Compute Oriented     | 1000~2000                         | 5~10                                | 5~10                             | 0.005       |

| Node                   | Injection | P-to-P  | Bisection | Latency | Latency | 1 EB                              | 10TB/s                                                  |
|------------------------|-----------|---------|-----------|---------|---------|-----------------------------------|---------------------------------------------------------|
|                        |           |         |           |         |         | 100 times larger than main memory | For saving all data in memory to disks within 1000-sec. |
| High-radix (Dragonfly) | 32 GB/s   | 32 GB/s | 2.0 PB/s  | 200 ns  | 1000 ns |                                   |                                                         |

# SDHPC (2011-2012) Gap Between Requirement and Technology Trends

- Mapping four architectures onto science requirement
- Projected performance vs. science requirement
  - Big gap between projected and required performance



*Needs national research project for science-driven HPC systems*

# Post-K Feasibility Study (2012-2013)

- **3 Architecture Teams, from identified architectural types in the SDHPC report**
  - General Purpose --- balanced
  - Compute Intensive --- high flops and/or low memory capacity & high memory BW
  - Large Memory Capacity --- also w/high memory BW
- **The A64fx processor satisfied multiple roles - basically balanced but also compute intensive**
- **Application Team (Tomita, Matsuoka)**
  - Put all the K-Computer applications stakeholders into one room
  - Templated reporting of science impact possible on exascale machines and their computational algorithms / requirements
  - 600 page report (English summary available)

# Post-K Application Feasibility Study 2012-2013

[https://hpci-aplfs.r-ccs.riken.jp/document/roadmap/roadmap\\_e\\_1405.pdf](https://hpci-aplfs.r-ccs.riken.jp/document/roadmap/roadmap_e_1405.pdf)

## Computational Science Roadmap

### -Overview-

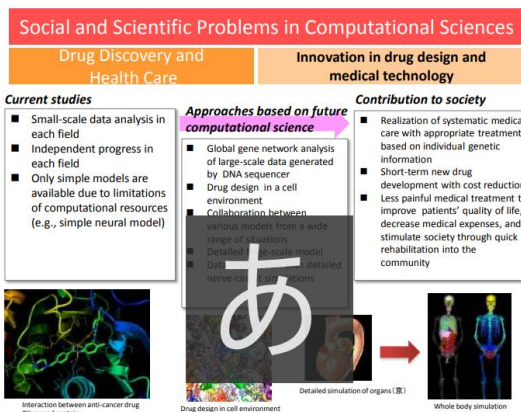
*Social Contributions and Scientific Outcomes  
Aimed for by Innovations through Large-Scale  
Parallel Computing*



May, 2014

Feasibility Study on Future HPC Infrastructures  
(Application Working Group)

mechanisms, such as blood clot formation in the heart or brain infarctions, and will be effective in improving patients' Quality of Life (QOL) through the development of minimally invasive treatments, which only pose a slight burden to the patient, and of the medical devices required for these treatments. It will further be effective in revitalizing society through patients' early re-entry into the community and in reducing costs of medical treatment.



The supercomputer's vast computational power will undoubtedly greatly contribute to the development of various aspects in the field of life science, such as detailed neural and cellular simulations, simulations over extended periods of time and space, and almost real-time assimilation<sup>4</sup> of those data. Eventually it could form an important scientific basis for innovative drug design and medical technologies.

The table below lists the computational performance required in the future for the respective areas of drug discovery and healthcare.

| Subject                                                                                                                                                       | Performance (PFLOPS) | Memory bandwidth (PB/s) | Memory size per case (PB) | Storage size per case (PB) | Elapsed Time /Case (hour) | Number of Cases | Total operation count (EFLOP) | Summary and numerical method                                                         | Problem size                                                                                                     | Notes                                                                                                                            |
|---------------------------------------------------------------------------------------------------------------------------------------------------------------|----------------------|-------------------------|---------------------------|----------------------------|---------------------------|-----------------|-------------------------------|--------------------------------------------------------------------------------------|------------------------------------------------------------------------------------------------------------------|----------------------------------------------------------------------------------------------------------------------------------|
| Personal Genome Analysis                                                                                                                                      | 0.0054               | 0.0001                  | 1.6                       | 0.1                        | 0.7                       | 200000          | 2700                          | Sequence matching                                                                    | Cancer Genome Analysis: Short read mapping and mutation identification of 200,000 people's genomes               | 1 case = 1 person<br>Integer operations are dominant.<br>*Total operation count: total instruction count (Total FLOP = 46 EFLOP) |
| Gene Network Analysis                                                                                                                                         | 25                   | 89                      | 0.08                      | 0.016                      | 0.34                      | 26000           | 780000                        | Bayesian network estimation and L1-regularization                                    | 40,000 transcripts x 26,000 data sets consisting of 2,800,000 arrays                                             | B/F=0.4<br>Supposed to run 100-1000 cases simultaneously.<br>Memory size per case is estimated for a 100 nod run.                |
| MD and Free-energy calculation for drug design and so on                                                                                                      | 1000                 | 400                     | 0.0001                    |                            | 0.0012                    | 1000000         | 4300000                       | Molecular dynamics simulation with all-atom model                                    | Number of Cases: 100,000 ligands X 10 target proteins                                                            |                                                                                                                                  |
| MD simulations under cellular environments or MD simulations of Virus                                                                                         | 490                  | 49                      | 0.2                       | 1.2                        | 43                        | 10              | 60000                         | Molecular dynamics simulation with atom-grained model                                | 100,000,000 particles                                                                                            | B/F=0.1                                                                                                                          |
| Simulations of cellular signaling pathways                                                                                                                    | 42                   | 100                     | 10                        | 10                         | 240                       |                 |                               | Molecular dynamics simulation with coarse-grained model                              | 1,000 to 10,000 cells                                                                                            | integer operations                                                                                                               |
| Precise Structure-Based Drug Design                                                                                                                           | 0.83                 | 0.14                    | 1                         | 0.001                      | 1                         | 100             |                               | Quantum mechanical calculations on the interactions between proteins and drugs       | proteins (500 residues) + ligands to dump 1TB dataset per second                                                 | 1TB/s IO speed required                                                                                                          |
| Design of Biological Devices                                                                                                                                  | 1.1                  | 0.19                    | 1                         | 0.001                      | 1                         | 100             |                               | Spectroscopic analyses                                                               | more than 100,000 orbitals                                                                                       | 1TB/s IO speed required to dump 1TB dataset per second                                                                           |
| Multi-scale simulation of a blood clot                                                                                                                        | 400                  | 64                      | 1                         | 1                          | 170                       | 10              | 2500000                       | Semi-implicit FDM simulation of fluid-structure interaction with chemical factors    | Length: 100mm, D: 100um, Calculation Time: 10s, Grid size: 0.1um, Velocity: 10 <sup>-3</sup> ~2m/s, Delta T: 1us |                                                                                                                                  |
| High Intensity Focused Ultrasound                                                                                                                             | 380                  | 460                     | 54                        | 64                         | 240                       | 10              | 3300000                       | Explicit FDM simulation of sound wave and heat transfer                              | Area: 400mm <sup>2</sup> , Grid: 225x10 <sup>12</sup> Steps: 1493200, FLOP/grid/step: 1000                       |                                                                                                                                  |
| Simulations of Brain and Neural Systems                                                                                                                       | *                    | *                       | *                         | *                          | 0.28                      | 100             | 700                           | Single compartment model                                                             | 100 billion neurons, 10000 synapses/neuron, 10 <sup>5</sup> Steps                                                |                                                                                                                                  |
| Data assimilation of whole insect brain via communication between a physiological experiment and a simulation, Parameter estimator in insect brain simulation | 71                   | 60                      | 0.2                       | 20                         | 28                        | 20              | 140000                        | Multi-compartment 194 model with local Crank-Nicolson method, evolutionary algorithm | 1940 neurons, 10 <sup>6</sup> genes, 100 generations                                                             | Supposing 100 MB/s communication to external environment will be required                                                        |

<sup>4</sup> One of the methods to merge different observational and experimental data into a numerical model at a high degree.

Figures marked with a \* are still under examination. The website will show more accurate figures as they become available.

# Co-Design Activities in Fugaku

Multiple Activities since 2011

Science by Computing

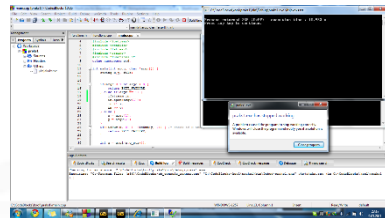
Science of Computing

- 9 Priority App Areas: High Concern to General Public: Medical/Pharma, Environment/Disaster, Energy, Manufacturing, ...



Select representatives from 100s of applications signifying various computational characteristics

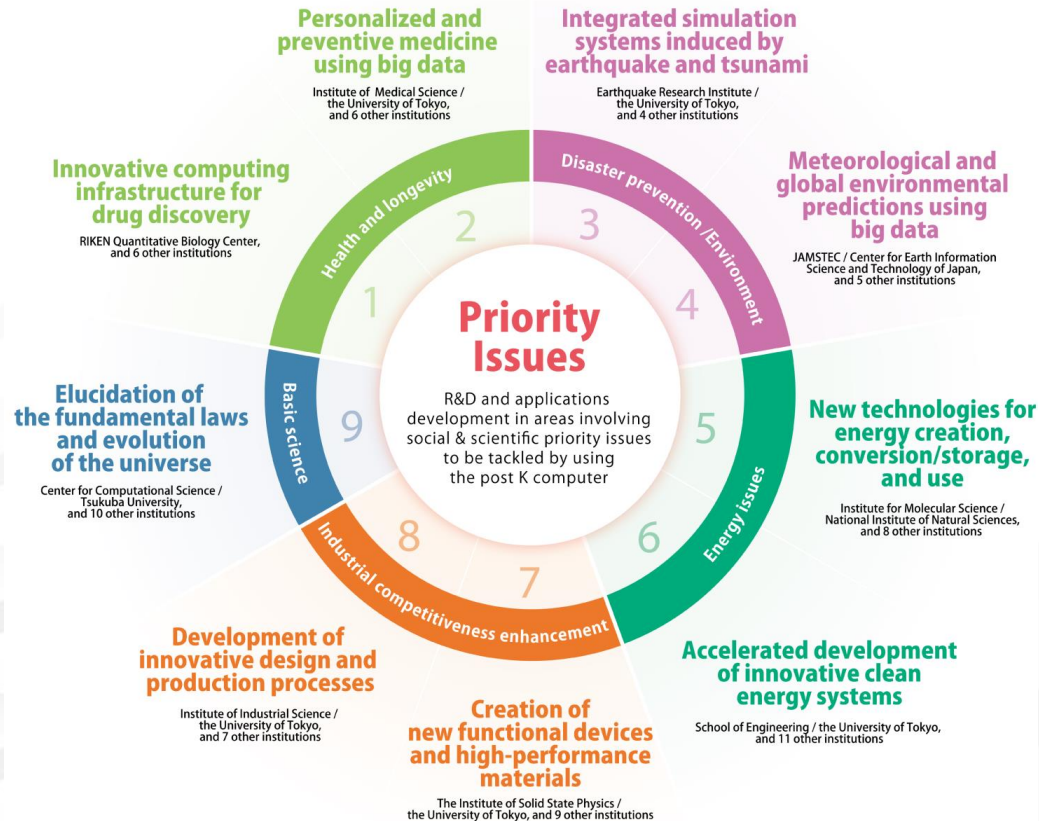
Design systems with parameters that consider various application characteristics



- Extremely tight collaborations between the Co-Design apps centers, Riken, and Fujitsu, etc.
- Chose 9 representative apps as “target application” scenario
- Achieve up to **x100 speedup** c.f. K-Computer
- Also ease-of-programming, broad SW ecosystem, very low power, ...

# Research Subjects of the Post-K Computer

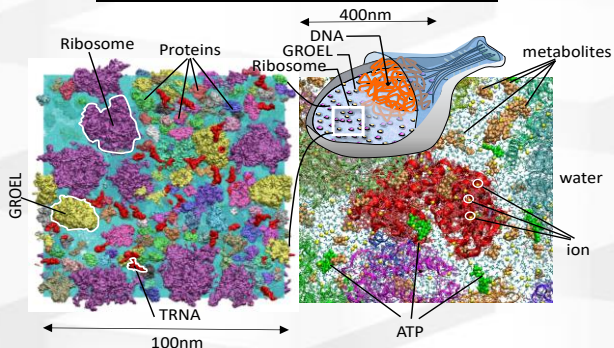
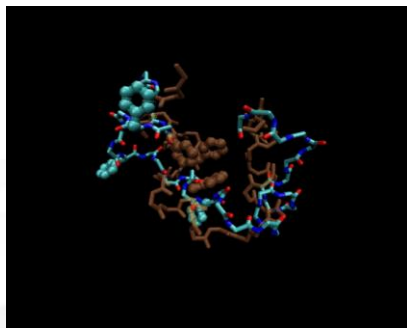
The post K computer will expand the fields pioneered by the K computer, and also challenge new areas.



## Protein simulation before

- Simulation of a protein in isolation

Folding simulation of Villin, a small protein with 36 amino acids

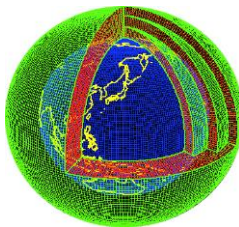
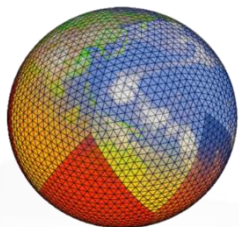


## Protein simulation with K

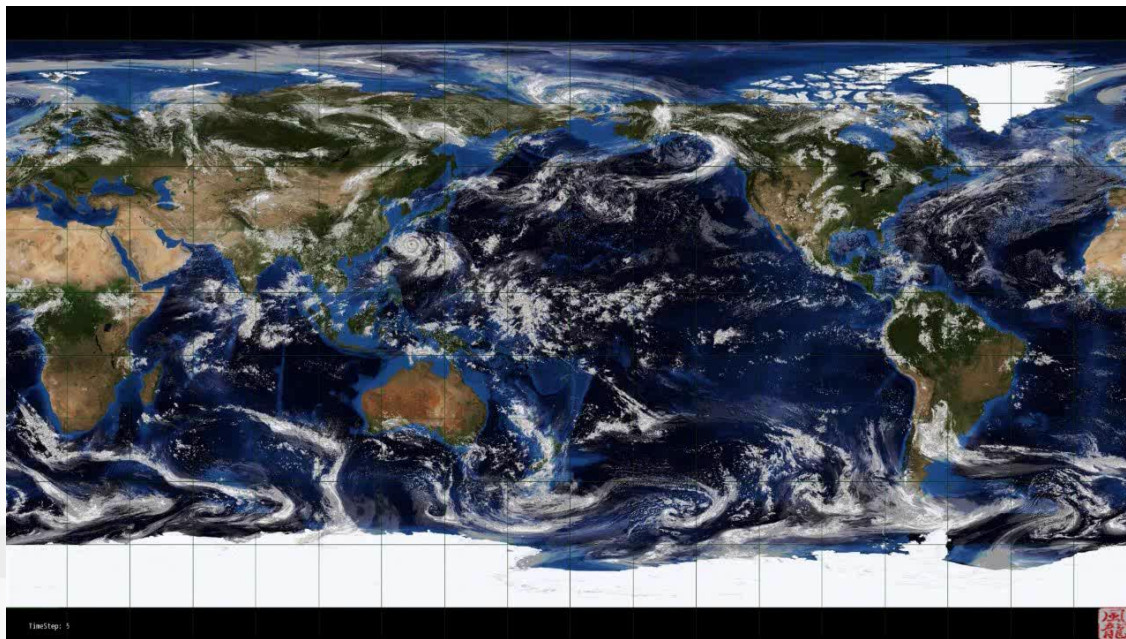
- all atom simulation of a cell interior
- cytoplasm of Mycoplasma genitalium



- Global cloud resolving model **with 0.87 km-mesh** which allows resolution of cumulus clouds
- Month-long forecasts of Madden-Julian oscillations in the tropics is realized.



Global cloud  
resolving model



Miyamoto et al (2013) , Geophys. Res. Lett., 40, 4922–4926, doi:10.1002/grl.50944.

# “Big Data Assimilation” NICAM+LETKF

High-precision Simulations



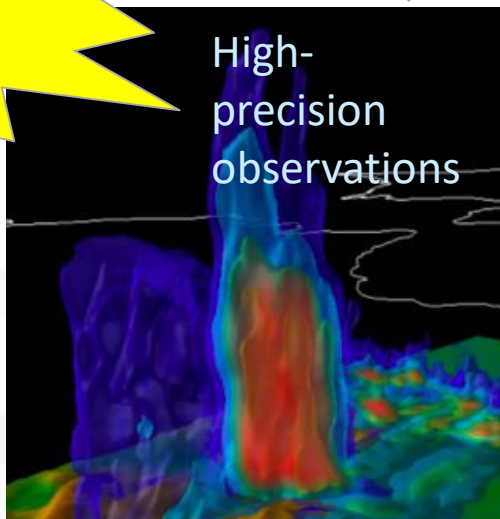
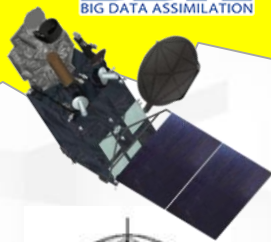
Future-generation  
technologies  
available 10 years in advance



Mutual feedback



**BDA**  
BIG DATA ASSIMILATION



High-  
precision  
observations



# Co-design from Apps to Architecture

- **Architectural Parameters to be determined**

- #SIMD, SIMD length, #core, #NUMA node, O3 resources, specialized hardware
- cache (size and bandwidth), memory technologies
- Chip die-size, power consumption
- Interconnect

- **We have selected a set of target applications**

- **Performance estimation tool**

- Performance projection using Fujitsu FX100 execution profile to a set of arch. parameters.

- **Co-design Methodology (at early design phase)**

1. Setting set of system parameters
2. Tuning target applications under the system parameters
3. Evaluating execution time using prediction tools
4. Identifying hardware bottlenecks and changing the set of system parameters



Target applications representatives of almost all our applications in terms of computational methods and communication patterns in order to design architectural features.

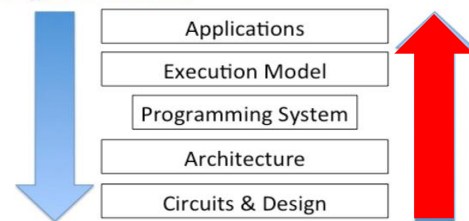
| Target Application |            |                                                                                             |
|--------------------|------------|---------------------------------------------------------------------------------------------|
|                    | Program    | Brief description                                                                           |
| ①                  | GENESIS    | MD for proteins                                                                             |
| ②                  | Genomon    | Genome processing (Genome alignment)                                                        |
| ③                  | GAMERA     | Earthquake simulator (FEM in unstructured & structured grid)                                |
| ④                  | NICAM+LETK | Weather prediction system using Big data (structured grid stencil & ensemble Kalman filter) |
| ⑤                  | NTChem     | molecular electronic (structure calculation)                                                |
| ⑥                  | FFB        | Large Eddy Simulation (unstructured grid)                                                   |
| ⑦                  | RSDFT      | an ab-initio program (density functional theory)                                            |
| ⑧                  | Adventure  | Computational Mechanics System for Large Scale Analysis and Design (unstructured grid)      |
| ⑨                  | CCS-QCD    | Lattice QCD simulation (structured grid Monte Carlo)                                        |

# Co-design of Apps for Architecture

## ● Tools for performance tuning

- Performance estimation tool
  - Performance projection using Fujitsu FX100 execution profile
  - Gives “target” performance
- **Post-K processor simulator**
  - **Based on gem5, O3, cycle-level simulation**
  - **Very slow, so limited to kernel-level evaluation**

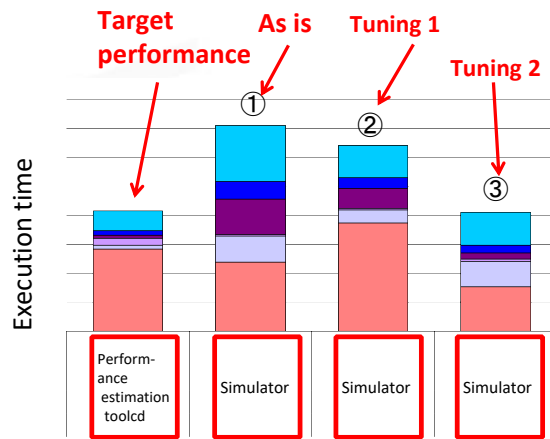
*Analysis of applications to devise the most efficient solutions*



*Issues and opportunities to exploit*

## ● Co-design of apps

1. Estimate “target” performance using performance estimation tool
2. Extract kernel code for simulator
3. Measure exec time using simulator
4. Feed-back to code optimization
5. Feed-back to compiler

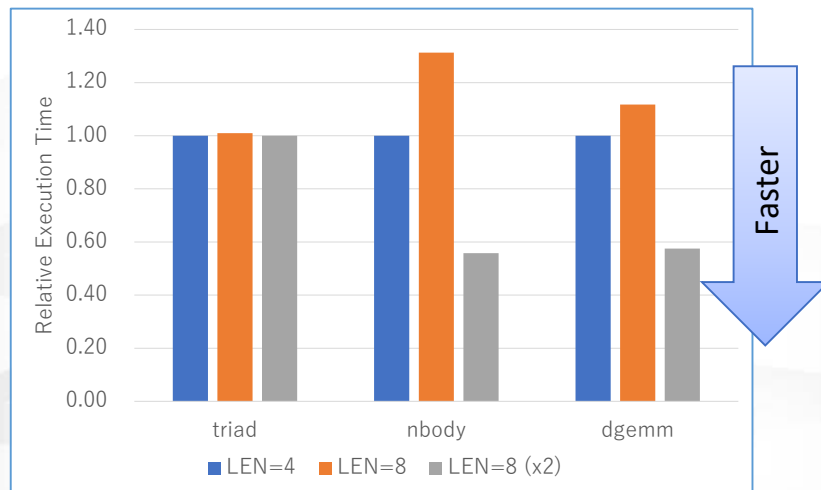


# ARM for HPC - Co-design Opportunities

- ARM SVE **Vector Length Agnostic** feature is very interesting, since we can examine vector performance using the same binary.
- We have investigated how to improve the performance of SVE keeping hardware-resource the same. (in “Rev-A” paper)
  - ex. “512 bits SVE x 2 pipes” vs. “1024 bits SVE x 1 pipe”
  - Evaluation of **Performance and Power** ( in “coolchips” paper) by using our gem-5 simulator (with “white” parameter) and ARM compiler.
  - Conclusion: Wide vector size over FPU element size will improve performance if there are enough rename registers and the utilization of FPU has room for improvement.

Note that these researches are not relevant to “post-K” architecture.

- Y. Kodama, T. Oajima and M. Sato. “Preliminary Performance Evaluation of Application Kernels Using ARM SVE with Multiple Vector Lengths”, In Re-Emergence of Vector Architectures Workshop (Rev-A) in 2017 IEEE International Conference on Cluster Computing, pp. 677-684, Sep. 2017.
- T. Odajima, Y. Kodama and M. Sato, “Power Performance Analysis of ARM Scalable Vector Extension”, In IEEE Symposium on Low-Power and High-Speed Chips and Systems (COOL Chips 21), Apr. 2018



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  - Gen purpose CPU – Linux, Windows (Word), other SCs/Clouds
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  - The first 'exascale' machine (not exa64bitflops but in apps perf.)



# Fugaku: The Game Changer



## 1. Heritage of the K-Computer, HP in simulation via extensive Co-Design

- High performance: up to x100 performance of K in real applications
- Retain BYTES/FLOP of K (0.4~0.5) for real application performance
- Simultaneous high performance and ease-of-programming

**Global leadership not just in the machine & apps, but as cutting edge IT**



ARM: Massive ecosystem from embedded to HPC

## 2. New Technology Innovations of Fugaku

### • High Performance, esp. via high memory BW

Performance boost by “factors” c.f. mainstream CPUs in many HPC & Society5.0 apps via BW & Vector acceleration

### • Very Green e.g. extreme power efficiency

Ultra Power efficient design & various power control knobs

### • Arm Global Ecosystem & SVE contribution

Top CPU in ARM Ecosystem of 21 billion chips/year, SVE co-design and world’s first implementation by Fujitsu

### • High Perf. on Society5.0 apps incl. AI

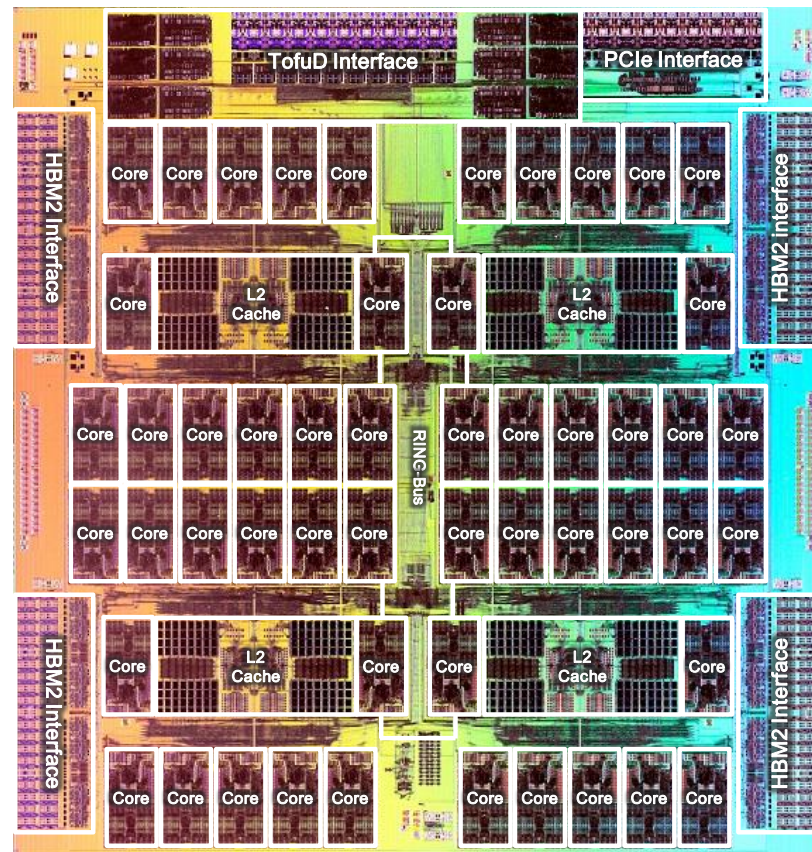
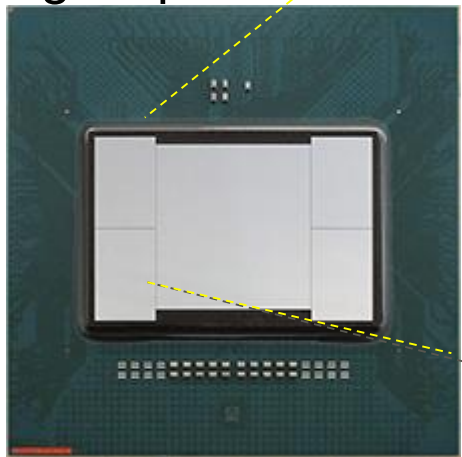
Architectural features for high perf on Society 5.0 apps based on Big Data, AI/ML, CAE/EDA, Blockchain security, etc.

**Technology not just limited to Fugaku, but into societal IT infrastructures e.g. Clouds**

# A64FX Leading-edge Si-technology

## ■ TSMC 7nm FinFET & CoWoS

- Broadcom SerDes, HBM I/O, and SRAMs
- 87.86 billion transistors
- 594 signal pins



# “Fugaku” Chronology

*(Disclaimer: below includes speculative schedules and subject to change)*

- May 2018 A0 Chip came out, almost bug free
- 1Q2019 B0 Chip on hand, bug free, exceeded perf. target
- Mar 2019 “Fugaku” manufacturing budget approval by the Diet, actual manufacturing contract signed **(now w/Society 5.0 AI mission also)**
- ➡ ● Aug 2019 End of K-Computer operations
- 4Q2019 “Fugaku” installation starts
- 1H2020 “Fugaku” preproduction operation starts
- 1~2Q2021 “Fugaku” production operation starts (hopefully)
- And of course we move on...

# Co-Design Activities in Fugaku

Multiple Activities since 2011

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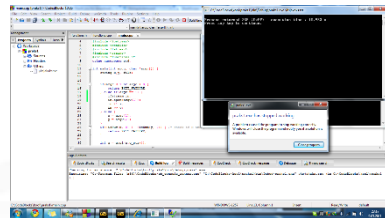
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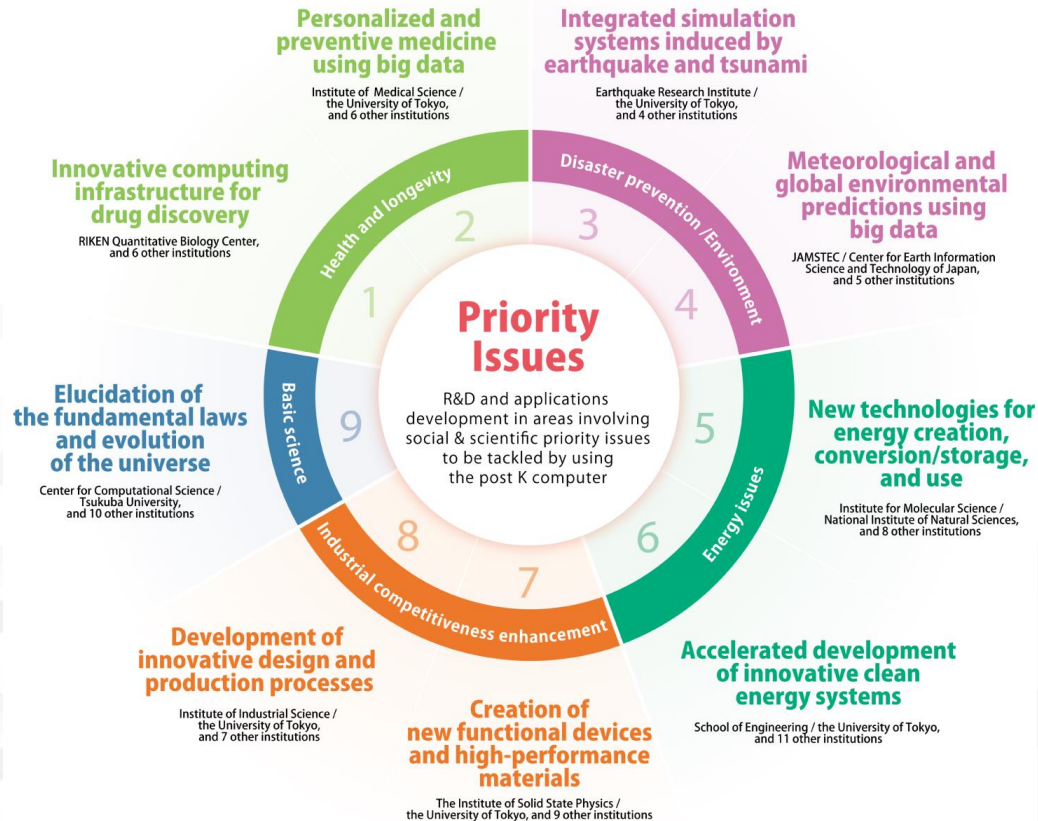
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- Interconnect

- **We have selected a set of target applications**

- **Performance estimation tool**

- Performance projection using Fujitsu FX100 execution profile to a set of arch. parameters.

- **Co-design Methodology (at early design phase)**

1. Setting set of system parameters
2. Tuning target applications under the system parameters
3. Evaluating execution time using prediction tools
4. Identifying hardware bottlenecks and changing the set of system parameters



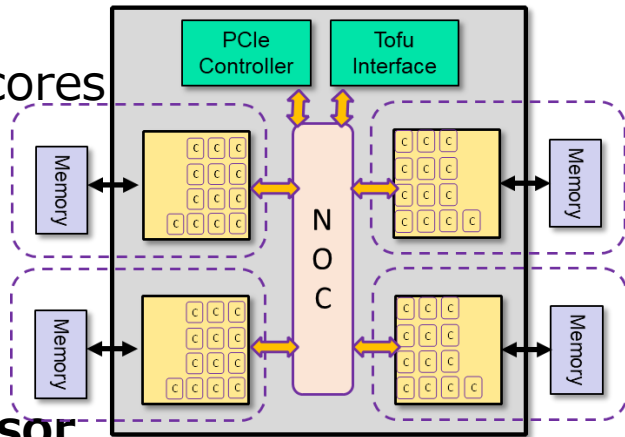
Target applications representatives of almost all our applications in terms of computational methods and communication patterns in order to design architectural features.

| Target Application |            |                                                                                             |
|--------------------|------------|---------------------------------------------------------------------------------------------|
|                    | Program    | Brief description                                                                           |
| ①                  | GENESIS    | MD for proteins                                                                             |
| ②                  | Genomon    | Genome processing (Genome alignment)                                                        |
| ③                  | GAMERA     | Earthquake simulator (FEM in unstructured & structured grid)                                |
| ④                  | NICAM+LETK | Weather prediction system using Big data (structured grid stencil & ensemble Kalman filter) |
| ⑤                  | NTChem     | molecular electronic (structure calculation)                                                |
| ⑥                  | FFB        | Large Eddy Simulation (unstructured grid)                                                   |
| ⑦                  | RSDFT      | an ab-initio program (density functional theory)                                            |
| ⑧                  | Adventure  | Computational Mechanics System for Large Scale Analysis and Design (unstructured grid)      |
| ⑨                  | CCS-QCD    | Lattice QCD simulation (structured grid Monte Carlo)                                        |

# Fugaku's FUJitsu A64fx Processor is...

- **an Many-Core ARM CPU...**

- 48 compute cores + 2 or 4 assistant (OS) cores
- Brand new core design
- Near Xeon-Class Integer performance core
- ARM V8 --- 64bit ARM ecosystem
- Tofu-D + PCIe 3 external connection



- **...but also an accelerated GPU-like processor**

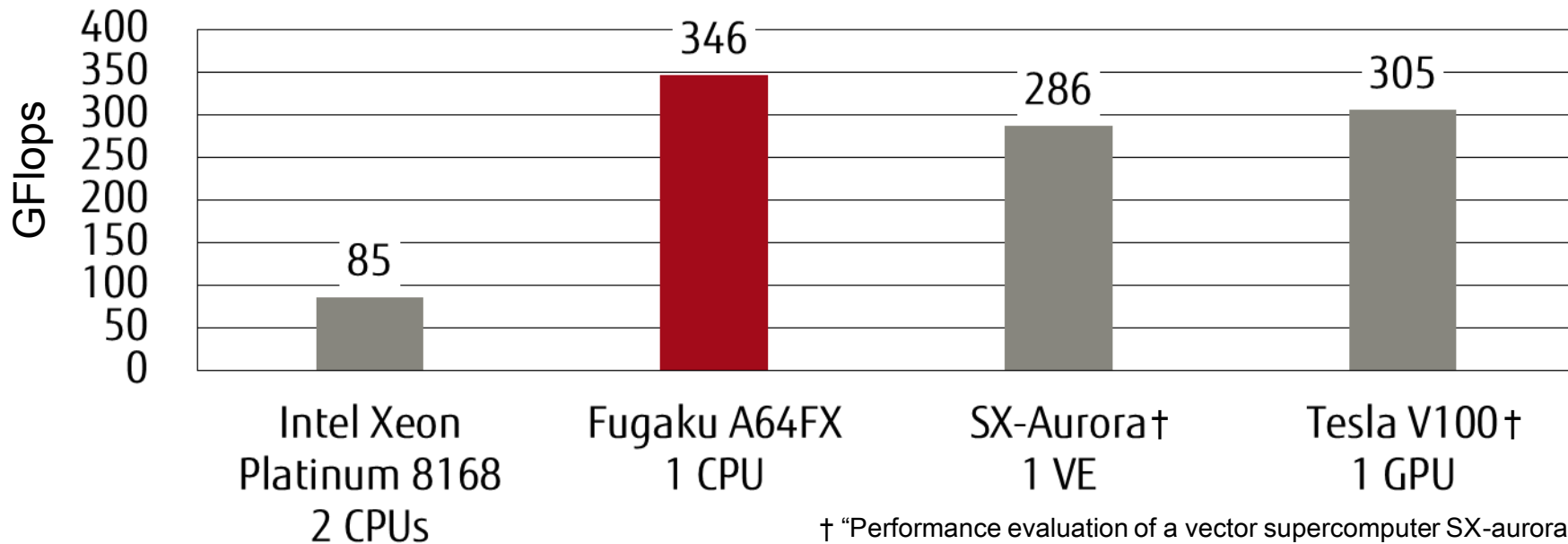
- SVE 512 bit x 2 vector extensions (ARM & Fujitsu)
  - Integer (1, 2, 4, 8 bytes) + Float (16, 32, 64 bytes)
- Cache + scratchpad-like local memory (sector cache)
- HBM2 on package memory – Massive Mem BW (Bytes/DPF ~0.4)
  - Streaming memory access, strided access, scatter/gather etc.
- Intra-chip barrier synch. and other memory enhancing features

- **A64fx/SVE a great target for OpenACC (w/o data movement)**

# “Fugaku” CPU Performance Evaluation (2/3)

## ■ Himeno Benchmark (Fortran90)

■ Stencil calculation to solve Poisson’s equation by Jacobi method



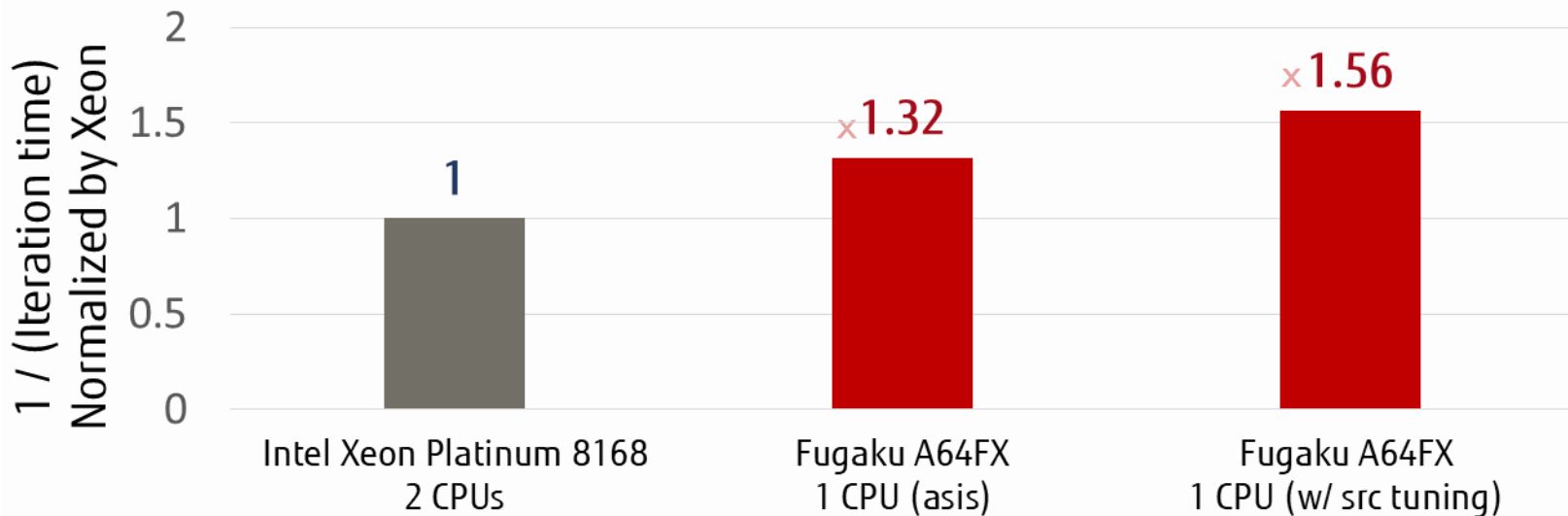
† “Performance evaluation of a vector supercomputer SX-aurora  
TSUBASA”,  
SC18, <https://dl.acm.org/citation.cfm?id=3291728>

# “Fugaku” CPU Performance Evaluation (3/3)

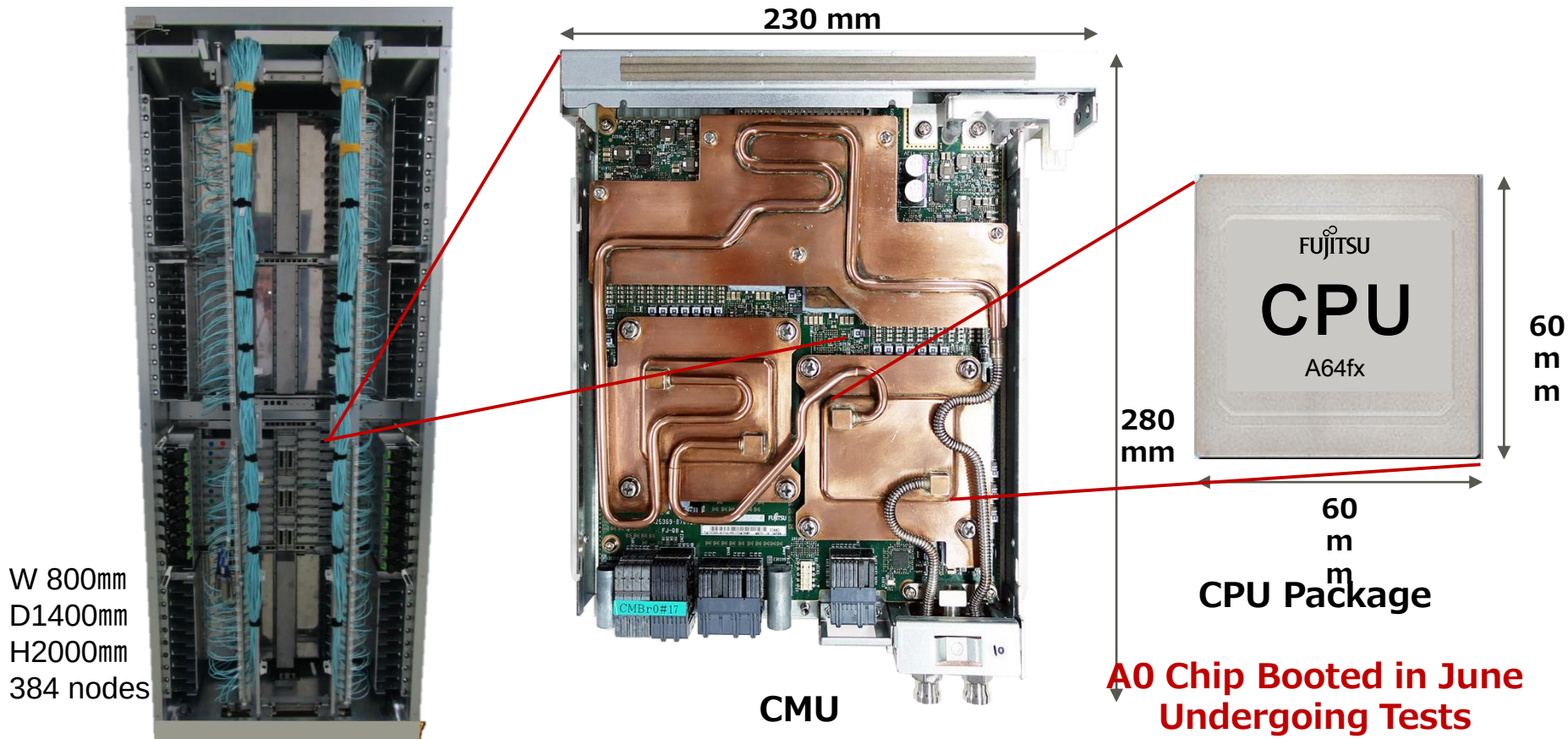
## ■ WRF: Weather Research and Forecasting model

- Vectorizing loops including IF-constructs is key optimization
- Source code tuning using directives promotes compiler optimizations

WRF v3.8.1 (48-hour, 12km, CONUS) on 48 cores



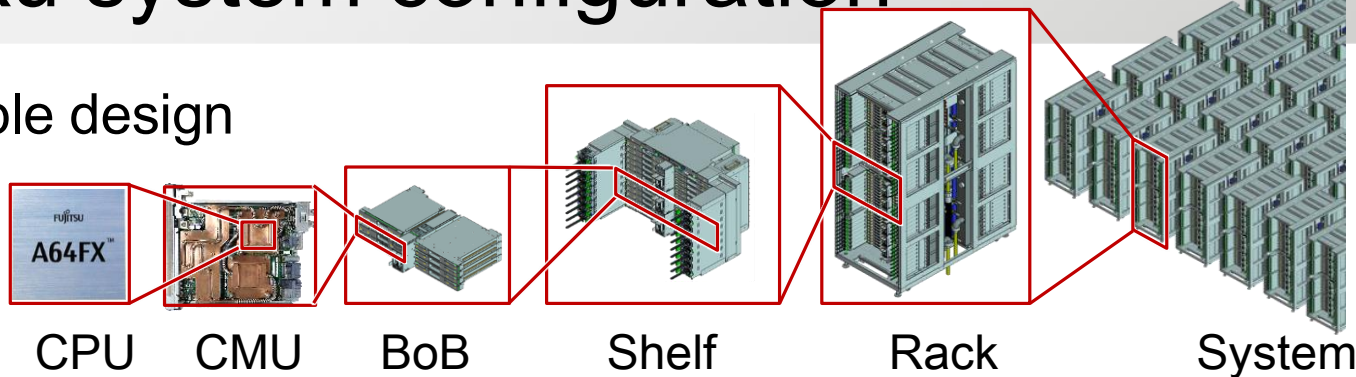
# Fugaku Chassis, PCB (w/DLC), and CPU Package





# Fugaku system configuration

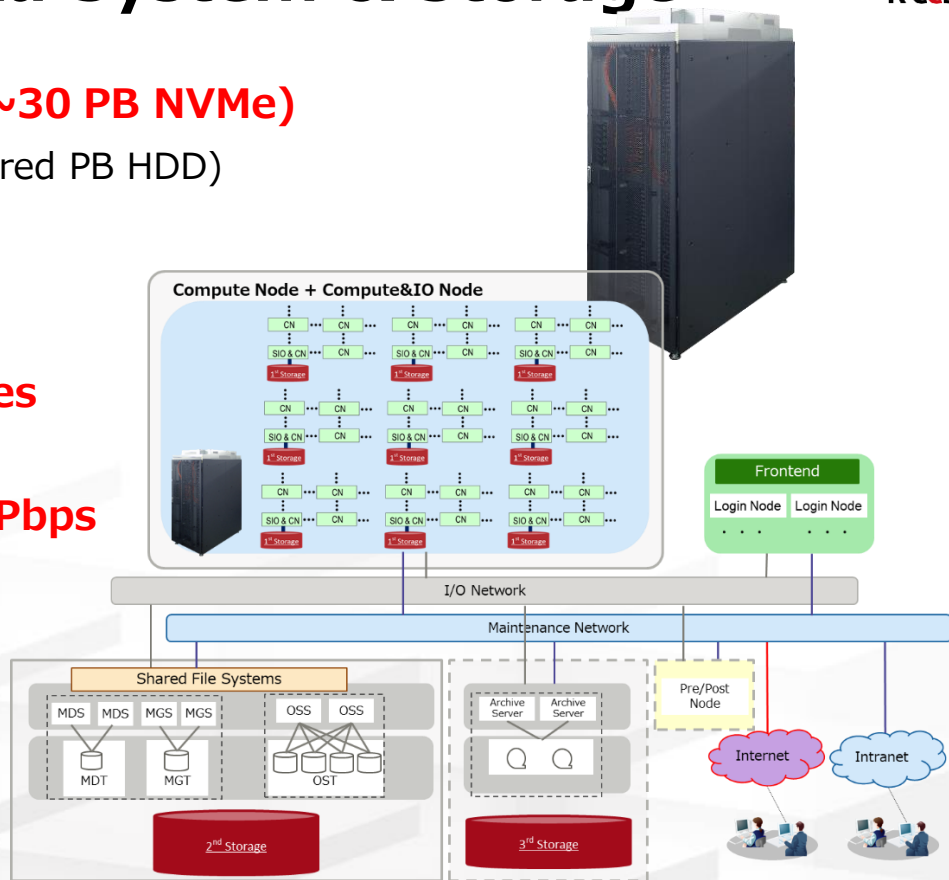
## ■ Scalable design



| Unit   | # of nodes | Description                                        |
|--------|------------|----------------------------------------------------|
| CPU    | 1          | Single socket node with HBM2 & Tofu interconnect D |
| CMU    | 2          | CPU Memory Unit: 2x CPU                            |
| BoB    | 16         | Bunch of Blades: 8x CMU                            |
| Shelf  | 48         | 3x BoB                                             |
| Rack   | 384        | 8x Shelf                                           |
| System | 150k+      | As a Fugaku system                                 |

# Overview of Fugaku System & Storage

- 3-level hierarchical storage
  - 1<sup>st</sup> Layer: GFS Cache + Temp FS (25~30 PB NVMe)
  - 2<sup>nd</sup> Layer: Lustre-based GFS (a few hundred PB HDD)
  - 3<sup>rd</sup> Layer: Off-site Cloud Storage
- Full Machine Spec
  - >150,000 nodes
  - ~8 million High Perf. Arm v8.2 Cores
  - > 150PB/s memory BW
  - Tofu-D 10x Global IDC traffic @ 60Pbps
  - ~10,000 I/O fabric endpoints
  - > 400 racks
  - ~40 MegaWatts Machine+IDC
  - PUE ~ 1.1 High Pressure DLC
  - NRE pays off: ~ 15~30 million state-of-the art competing CPU Cores for HPC workloads (both dense and sparse problems)



# Fugaku Performance Estimate on 9 Co-Design Target Apps



## Performance target goal

- ✓ 100 times faster than K for some applications (tuning included)
- ✓ 30 to 40 MW power consumption

## Peak performance to be achieved

|                            | PostK                  | K           |
|----------------------------|------------------------|-------------|
| Peak DP (double precision) | >400+ Pflops (34x +)   | 11.3 Pflops |
| Peak SP (single precision) | >800+ Pflops (70x +)   | 11.3 Pflops |
| Peak HP (half precision)   | >1600+ Pflops (141x +) | --          |
| Total memory bandwidth     | >150+ PB/sec (29x +)   | 5,184TB/sec |

## Geometric Mean of Performance Speedup of the 9 Target Applications over the K-Computer

> 37x+

As of 2019/05/14

| Category                               | Priority Issue Area                                                    | Performance Speedup over K | Application  | Brief description                                                                           |
|----------------------------------------|------------------------------------------------------------------------|----------------------------|--------------|---------------------------------------------------------------------------------------------|
| Health and longevity                   | 1. Innovative computing infrastructure for drug discovery              | 125x +                     | GENESIS      | MD for proteins                                                                             |
|                                        | 2. Personalized and preventive medicine using big data                 | 8x +                       | Genomon      | Genome processing (Genome alignment)                                                        |
| Disaster prevention and Environment    | 3. Integrated simulation systems induced by earthquake and tsunami     | 45x +                      | GAMERA       | Earthquake simulator (FEM in unstructured & structured grid)                                |
|                                        | 4. Meteorological and global environmental prediction using big data   | 120x +                     | NICAM+ LETKF | Weather prediction system using Big data (structured grid stencil & ensemble Kalman filter) |
| Energy issue                           | 5. New technologies for energy creation, conversion / storage, and use | 40x +                      | NTChem       | Molecular electronic simulation (structure calculation)                                     |
|                                        | 6. Accelerated development of innovative clean energy systems          | 35x +                      | Adventure    | Computational Mechanics System for Large Scale Analysis and Design (unstructured grid)      |
| Industrial competitiveness enhancement | 7. Creation of new functional devices and high-performance materials   | 30x +                      | RSDFT        | Ab-initio simulation (density functional theory)                                            |
|                                        | 8. Development of innovative design and production processes           | 25x +                      | FFB          | Large Eddy Simulation (unstructured grid)                                                   |
| Basic science                          | 9. Elucidation of the fundamental laws and evolution of the universe   | 25x +                      | LQCD         | Lattice QCD simulation (structured grid Monte Carlo)                                        |

# Fugaku Programming Environment

- **Programming Languages and Compilers provided by Fujitsu**

- Fortran2008 & Fortran2018 subset
- C11 & GNU and Clang extensions
- C++14 & C++17 subset and GNU and Clang extensions
- OpenMP 4.5 & OpenMP 5.0 subset
- Java

GCC and LLVM will be also available

- **Parallel Programming Language & Domain Specific Library provided by RIKEN**

- XcalableMP
- FDPS (Framework for Developing Particle Simulator)

- **Process/Thread Library provided by RIKEN**

- PiP (Process in Process)

- **Script Languages provided by Linux distributor**

- E.g., Python+NumPy, SciPy

- **Communication Libraries**

- MPI 3.1 & MPI4.0 subset
  - Open MPI base (Fujitsu), MPICH (RIKEN)
- Low-level Communication Libraries
  - uTofu (Fujitsu), LLC(RIKEN)

- **File I/O Libraries provided by RIKEN**

- Lustre
- pnetCDF, DTF, FTAR

- **Math Libraries**

- BLAS, LAPACK, ScaLAPACK, SSL II (Fujitsu)
- EigenEXA, Batched BLAS (RIKEN)

- **Programming Tools provided by Fujitsu**

- Profiler, Debugger, GUI

- **NEW: Containers (Singularity) and other Cloud APIs**

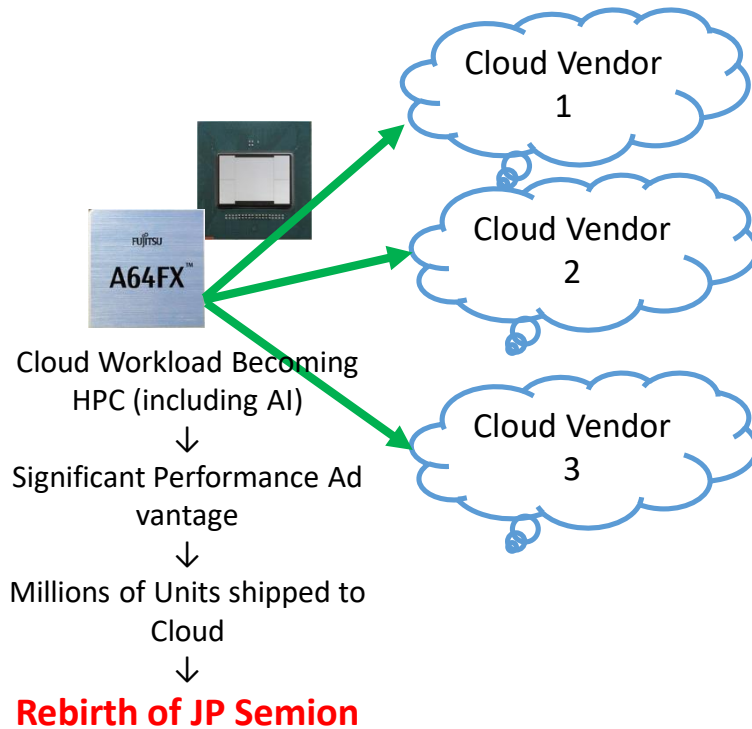
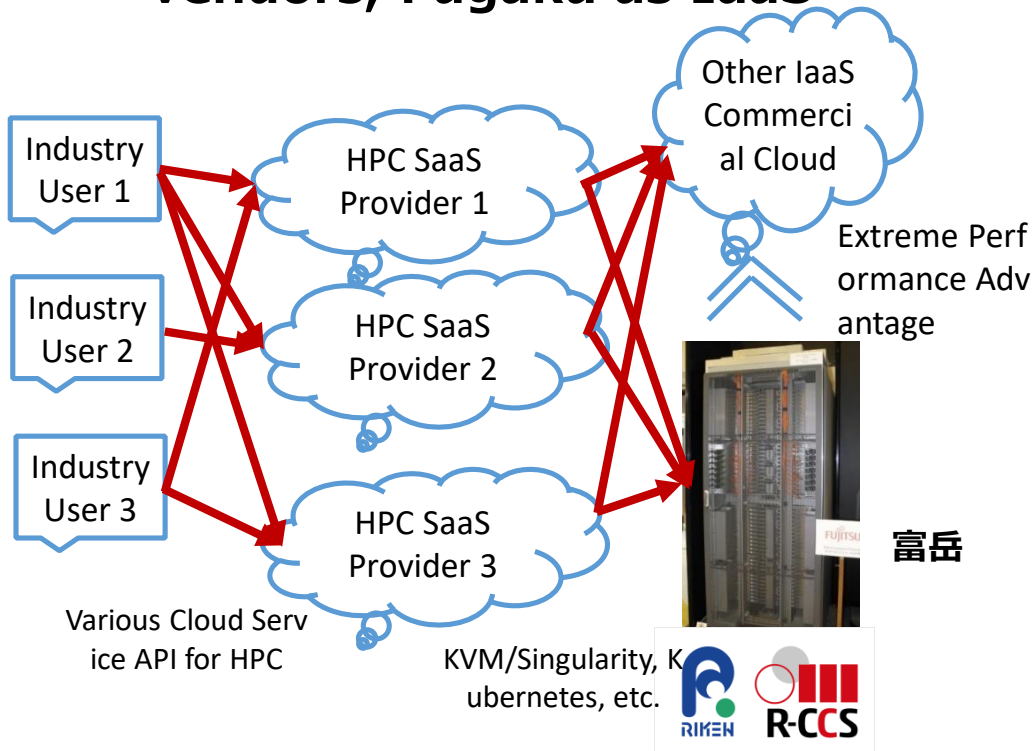
- **NEW: AI software stacks (w/ARM)**

- **NEW: DoE Spack Package Manager**

# Fugaku Cloud Strategy

- Industry use of Fugaku via intermediary cloud SaaS vendors, Fugaku as IaaS

- A64fx and other Fugaku Technology being incorporated into the Cloud



# A64fx in upcoming Stony Brook Cray System



Since 1987 - Covering the Fastest Computers  
in the World and the People Who Run Them

- ✓ Home
- ✓ Technologies
- ✓ Sectors
- ✓ AI/ML/DL
- ✓ Exascale
- ✓ Specials
- ✓ Resource Library
- ✓ Podcast
- ✓ Events
- ✓ Job Bank

Cray ARM-based 'Ookami' to Serve as Testbed for  
Computational Studies at Stony Brook

August 16, 2019

STONY BROOK, N.Y., August 16, 2019 – A \$5 million grant from the National Science Foundation (NSF) to the Institute of Advanced Computational Science (IACS) at Stony Brook University will enable researchers nationwide to test future supercomputing technologies and advance computational and data-driven research on the world's most pressing challenges.

Serving as a testbed for advanced computer technologies, the Ookami system is expected to signal a new generation of high-speed U.S. supercomputers. Using a Cray ARM-based system, Ookami will deliver remarkably high performance for scientific applications, in part due to its blazing-fast memory. Robert J. Harrison, PhD, professor of applied mathematics and statistics and director of IACS, expects that these advanced technologies will enable researchers to more quickly and effectively conduct computational investigations. The project is led by IACS faculty in partnership with co-PI Matt Jones, PhD at the State University of New York at Buffalo, whose team will lead the capture of detailed operational metrics and provision of extensive

## Awards



- Search Awards
- Recent Awards
- Presidential and Honorary Awards
- About Awards

## How to Manage Your Award

- Grant Policy Manual
- Grant General Conditions
- Cooperative Agreement Conditions
- Special Conditions
- Federal Demonstration Partnership
- Policy Office Website



## Award Abstract #1927880

**Category II : Ookami: A high-productivity path to frontiers of scientific discovery enabled by exascale system technologies**

|                            |                                                                                                                                                                                                                |
|----------------------------|----------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------|
| NSF Org:                   | OAC<br>Office of Advanced Cyberinfrastructure (OAC)                                                                                                                                                            |
| Initial Amendment Date:    | July 11, 2019                                                                                                                                                                                                  |
| Latest Amendment Date:     | August 29, 2019                                                                                                                                                                                                |
| Award Number:              | 1927880                                                                                                                                                                                                        |
| Award Instrument:          | Cooperative Agreement                                                                                                                                                                                          |
| Program Manager:           | Robert Chadduck<br>OAC Office of Advanced Cyberinfrastructure (OAC)<br>CSE Direct For Computer & Info Scle & Enginr                                                                                            |
| Start Date:                | October 1, 2019                                                                                                                                                                                                |
| End Date:                  | September 30, 2024 (Estimated)                                                                                                                                                                                 |
| Awarded Amount to Date:    | \$2,780,373.00                                                                                                                                                                                                 |
| Investigator(s):           | Robert Harrison robert.harrison@stonybrook.edu (Principal Investigator)<br>Barbara Chapman (Co-Principal Investigator)<br>Matthew Jones (Co-Principal Investigator)<br>Alan Calder (Co-Principal Investigator) |
| Sponsor:                   | SUNY at Stony Brook<br>WEST 5510 FRK MEL LIB<br>Stony Brook, NY 11794-0001 (631)632-9949                                                                                                                       |
| NSF Program(s):            | Innovative HPC                                                                                                                                                                                                 |
| Program Reference Code(s): |                                                                                                                                                                                                                |
| Program Element Code(s):   | 7619                                                                                                                                                                                                           |

## ABSTRACT

The State University of New York proposes to procure and operate for at least four years the first computer outside of Japan with the A64fx processor developed by Fujitsu for the Japanese path to exascale computing (i.e., computers capable of  $10^{18}$  operations per second). The ARM-based, multi-core, 512-bit SIMD-vector processor with ultrahigh-bandwidth memory promises to retain familiar and successful programming models while achieving very high performance for a wide range of applications including simulation and big data. The testbed significantly extends current NSF-sponsored HPC technologies and will enable the community to evaluate and demonstrate the potential of this technology for deployment in multiple settings. Through integration with NSF's Extreme Science and Engineering Discovery Environment (XSEDE), the system will be widely accessible and fully leverages existing cyber infrastructure including the XDMoD monitoring system.

What does this mean for science? Compared with the best CPUs anticipated during the deployment period, A64fx offers 2-4x better performance on memory-intensive applications such as sparse-matrix solvers found in many engineering and physics codes.



## Ookami

- Test bed for NSF researchers
  - First planned deployment of the Post-K processor outside of Japan
- Collaboration with Riken CCS
  - <http://www.riken.jp/en/research/labs/r-ccs/>
- Installation 3Q 2020
- \$5M award NSF OAC 1942140 for purchase and operations

| Node      |             |
|-----------|-------------|
| Processor | A64FX       |
| #Cores    | 48+4        |
| Peak DP   | 2.76 TOP/s  |
| Peak INT8 | 22.08 TOP/s |
| Memory    | 32GB@1TB/s  |
| System    |             |
| #Nodes    | 176         |
| Peak DP   | 486 TOP/s   |
| Peak INT8 | 3886 TOP/s  |
| Memory    | 5.6 TB      |
| Disk      | 0.5 PB      |
| Comms     | IB HDR-100  |

# Pursuing Convergence of HPC & AI (1)

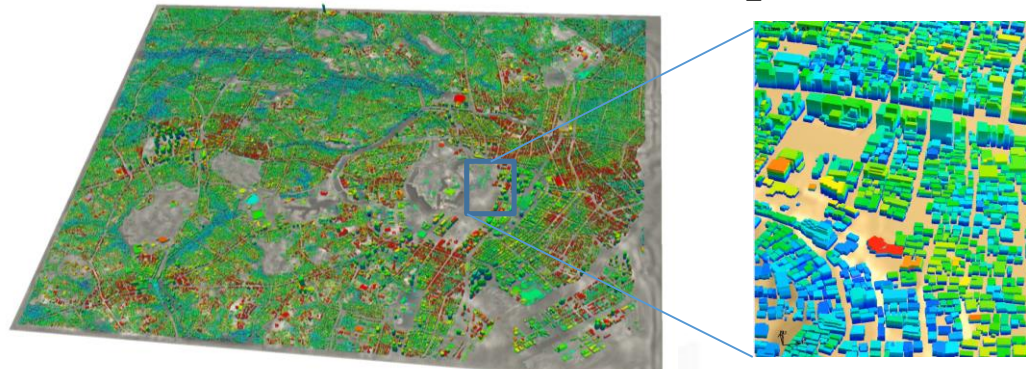
- **Acceleration of Simulation (first principles methods) with AI (empirical method) : *AI for HPC***
  - Interpolation & Extrapolation of long trajectory MD
  - Reducing parameter space on Pareto optimization of results
  - Adjusting convergence parameters for iterative methods etc.
  - *AI replacing* simulation when exact physical models are unclear, or excessively costly to compute
- **Acceleration of AI with HPC: *HPC for AI***
  - HPC Processing of training data -data cleansing
  - Acceleration of (Parallel) Training: Deeper networks, bigger training sets, complicated networks, high dimensional data...
  - Acceleration of Inference: above + real time streaming data
  - Various modern training algorithms: Reinforcement learning, GAN, Dilated Convolution, etc.

# R-CCS Pursuit of Convergence of HPC & AI (2)

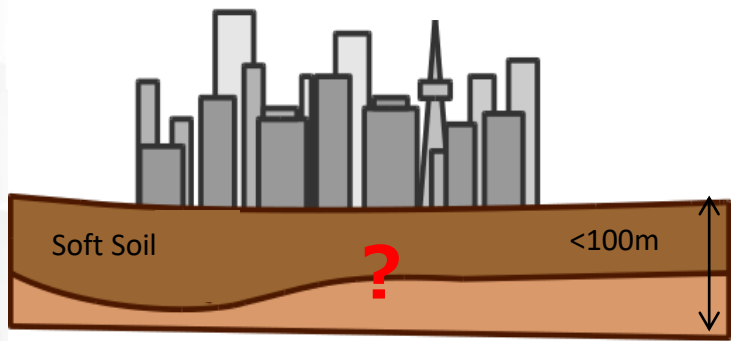
- **Acceleration of Simulation (first principles methods) with AI (empirical method) : *AI for HPC***
  - ***Most*** R-CCS research & operations teams investigating use of AI for HPC
  - 9 priority co-design issues area teams also extensive plans
  - Essential to deploy AI/DL frameworks efficiently & at scale on A64fx/Fugaku
- **Acceleration of AI with HPC: *HPC for AI***
  - New teams instituted in Science of Computing to accelerate AI
    - Kento Sato (High Performance Big Data Systems)
    - Satoshi Matsuoka (High Performance AI Systems)
    - Masaaki Kondo Next Gen (High Performance Architecture)
  - Collaborations with various projects

# Large Scale simulation and AI coming together

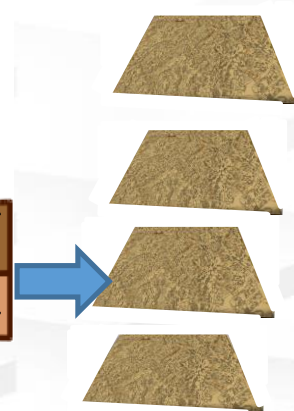
[Ichimura et. al. Univ. of Tokyo, IEEE/ACM SC17 Best Poster  
2018 Gordon Bell Finalist]



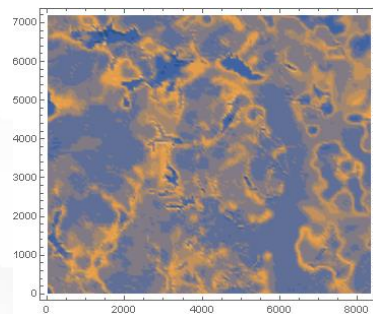
130 billion freedom  
earthquake of entire Tokyo  
on K-Computer (2018 ACM  
Gordon Bell Prize Finalist,  
SC16,17 Best Poster)



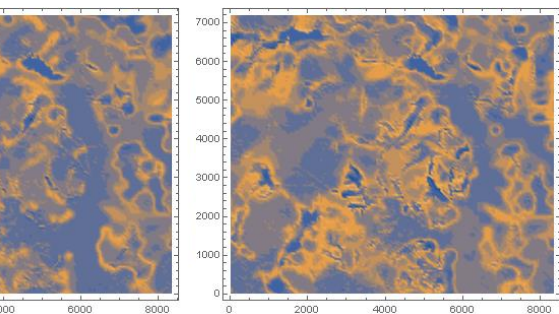
Earthquake



Too Many Instances

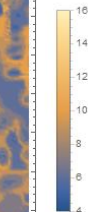


Candidate  
Underground  
Structure 1



Candidate  
Underground  
Structure 2

AI Trained by Simulation to  
generate candidate soft soil  
structure



# 4 Layers of Parallelism in DNN Training

- Hyper Parameter Search

- Searching optimal network configs & parameters
- Parallel search, massive parallelism required

- Data Parallelism

- Copy the network to compute nodes, feed different batch data, average => network reduction bound
- TOFU: Extremely strong reduction, x6 EDR Infiniband

Inter-Node

- Model Parallelism (domain decomposition)

- Split and parallelize the layer calculations in propagation
- Low latency required (bad for GPU) -> strong latency tolerant cores + low latency TOFU network

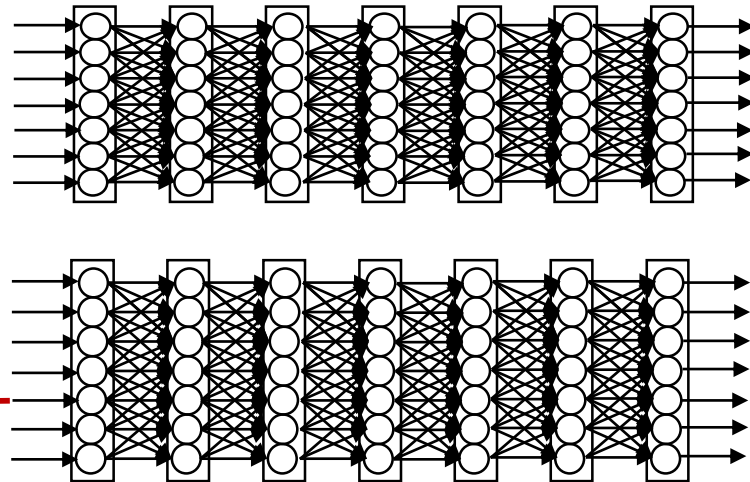
- Intra-Chip ILP, Vector and other low level Parallelism

- Parallelize the convolution operations etc.

Intra-Node

SVE FP16+INT8 vectorization support + extremely high memory bandwidth w/HBM2

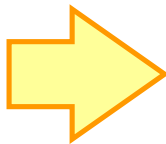
- Post-K could become world's biggest & fastest platform for DNN training!



**Massive amount of total parallelism, only possible via supercomputing**

## Post-K Processor

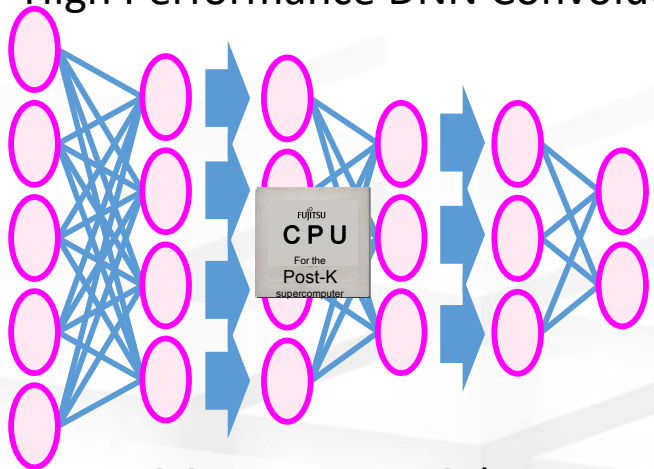
- ◆ High perf FP16&Int8
- ◆ High mem BW for convolution
- ◆ Built-in scalable Tofu network



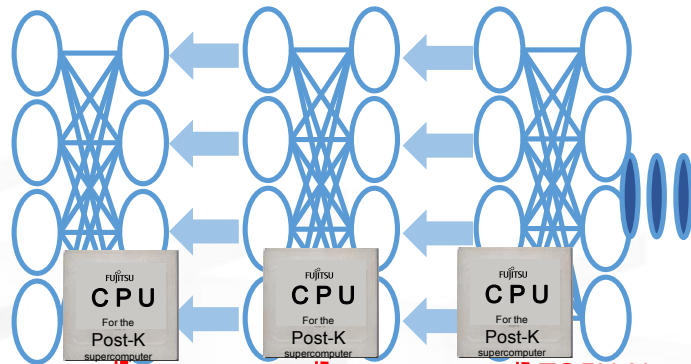
## Unprecedented DL scalability

High Performance and Ultra-Scalable Network for massive scaling model & data parallelism

High Performance DNN Convolution



Low Precision ALU + High Memory Bandwidth + Advanced Combining of Convolution Algorithms (FFT+Winograd+GEMM)



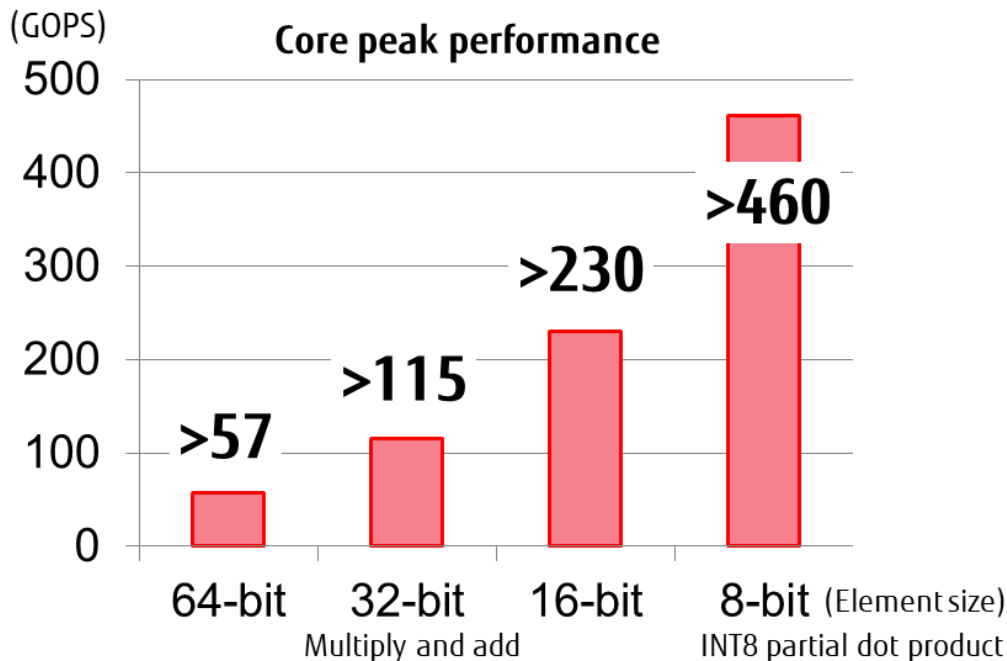
*TOFU Network w/high injection BW for fast reduction*

Unprecedented Scalability of Data/

# A64FX technologies: Core performance

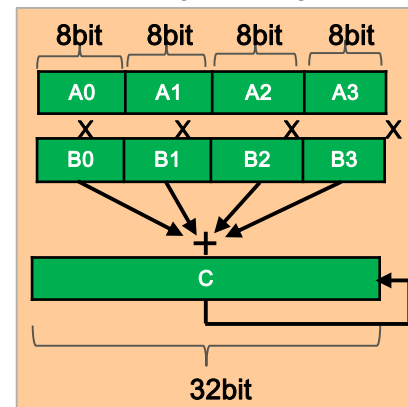
- High calc. throughput of Fujitsu's original CPU core w/ SVE

- 512-bit wide SIMD x 2 pipelines and new integer functions
- 8 bit inference => training possible?



INT8 partial dot product

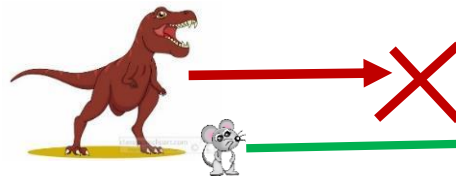
$$C = \sum (A_i \times B_i) + C$$



# Large Scale Public AI Infrastructures in Japan

|                         | Deployed              | Purpose            | AI Processor                 | Inference<br>Peak Perf. | Training<br>Peak Perf.           | Top500<br>Perf/Rank   | Green500<br>Perf/Rank |
|-------------------------|-----------------------|--------------------|------------------------------|-------------------------|----------------------------------|-----------------------|-----------------------|
| Tokyo Tech.<br>TSUBAME3 | July 2017             | HPC + AI<br>Public | NVIDIA P100<br>x 2160        | 45.8 PF<br>(FP16)       | 22.9 PF / 45.8PF<br>(FP32/FP16)  | 8.125 PF<br>#22       | 13.704 GF/W<br>#5     |
| U-Tokyo<br>Reedbush-H/L | Apr. 2018<br>(update) | HPC + AI<br>Public | NVIDIA P100<br>x 496         | 10.71 PF<br>(FP16)      | 5.36 PF / 10.71PF<br>(FP32/FP16) | (Unranked<br>)        | (Unranked)            |
| U-Kyushu<br>ITO-B       | Oct. 2017             | HPC + AI<br>Public | NVIDIA P100<br>x 512         | 11.1 PF<br>(FP16)       | 5.53 PF/11.1 PF<br>(FP32/FP16)   | (Unranked<br>)        | (Unranked)            |
| AIST-AIRC<br>AICC       | Oct. 2017             | AI<br>Lab Only     | NVIDIA P100<br>x 400         | 8.64 PF<br>(FP16)       | 4.32 PF / 8.64PF<br>(FP32/FP16)  | 0.961 PF<br>#446      | 12.681 GF/W<br>#7     |
| Riken-AIP<br>Raiden     | Apr. 2018<br>(update) | AI<br>Lab Only     | NVIDIA V100<br>x 432         | 54.0 PF<br>(FP16)       | 6.40 PF/54.0 PF<br>(FP32/FP16)   | 1.213 PF<br>#280      | 11.363 GF/W<br>#10    |
| AIST-AIRC<br>ABCI       | Aug.<br>2018          | AI<br>Public       | NVIDIA V100<br>x 4352        | 544.0 PF<br>(FP16)      | 65.3 PF/544.0 PF<br>(FP32/FP16)  | 19.88 PF<br>#7        | 14.423 GF/W<br>#4     |
| NICT<br>(unnamed)       | Summer<br>2019        | AI<br>Lab Only     | NVIDIA V100<br>x 1700程度      | ~210 PF<br>(FP16)       | ~26 PF/~210 PF<br>(FP32/FP16)    | ????                  | ????                  |
| C.f. US ORNL<br>Summit  | Summer<br>2018        | HPC + AI<br>Public | NVIDIA V100<br>x 27,000      | 3,375 PF<br>(FP16)      | 405 PF/3,375 PF<br>(FP32/FP16)   | 143.5 PF<br>#1        | 14.668 GF/W<br>#3     |
| Riken R-CCS<br>Fugaku   | 2020<br>~2021         | HPC + AI<br>Public | Fujitsu A64fx<br>> x 150,000 | > 4000 PO<br>(Int8)     | >1000PF/>2000PF<br>(FP32/FP16)   | > 400PF<br>#1 (2020?) | > 15 GF/W<br>???      |
| ABCI 2<br>(speculative) | 2022<br>~2023         | AI<br>Public       | Future GPU<br>~ 5000         | Similar                 | similar                          | ~100PF                | 25~30GF/W<br>???      |

## Many Core Era



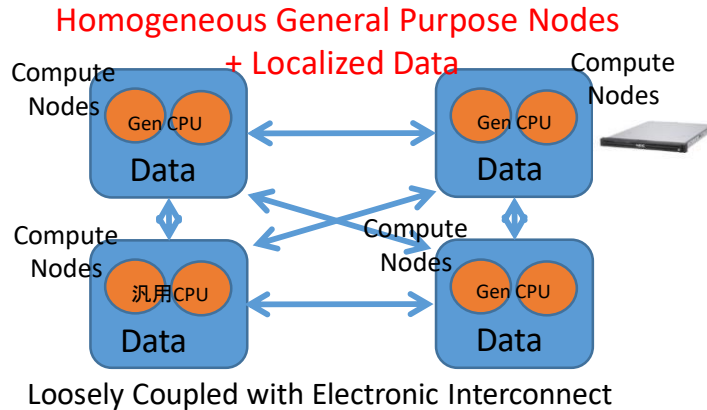
## Post Moore Cambrian Era



Flops-Centric Monolithic Algorithms and Apps

Flops-Centric Monolithic System Software

Hardware/Software System APIs  
Flops-Centric Massively Parallel Architecture



Transistor Lithography Scaling  
(CMOS Logic Circuits, DRAM/SRAM)

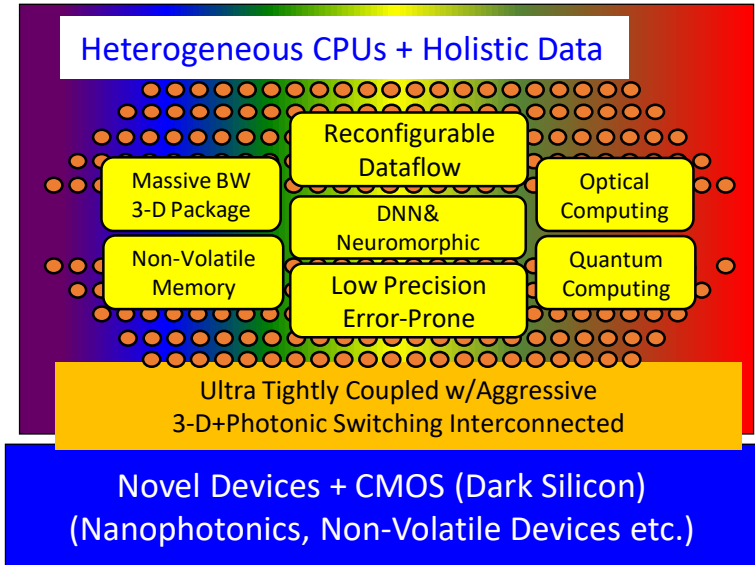


~2025  
M-P Extinction  
Event

Cambrian Heterogeneous Algorithms and Apps

Cambrian Heterogeneous System Software

Hardware/Software System APIs  
“Cambrian” Heterogeneous Architecture



Novel Devices + CMOS (Dark Silicon)  
(Nanophotonics, Non-Volatile Devices etc.)

# Our Strategies Towards Post-Moore Era

- **Basic Research on Post-Moore**
  - Funded 2017: DEEP-AI CREST (Matsuoka)
  - Funded 2018: NEDO 100x 2028 Processor Architecture (Matsuoka, Sano, Kondo, SatoK)
  - Funded 2019: Kiban-S Post-Moore Algorithms (NakajimaK etc.)
  - Submitted: Neuromorphic Architecture (Sano etc. w/Riken AIP, Riken CBS (Center for Brain Science))
  - In preparation: Cambrian Computing (w/HPCI Centers)
- **Author a Post-Moore Whitepaper towards Fugaku-next**
  - All-hands BoF last week at annual SWoPP workshop
  - Towards official “Feasibility Study” towards Fugaku-next
  - Similar efforts as K => Fugaku started in 2012

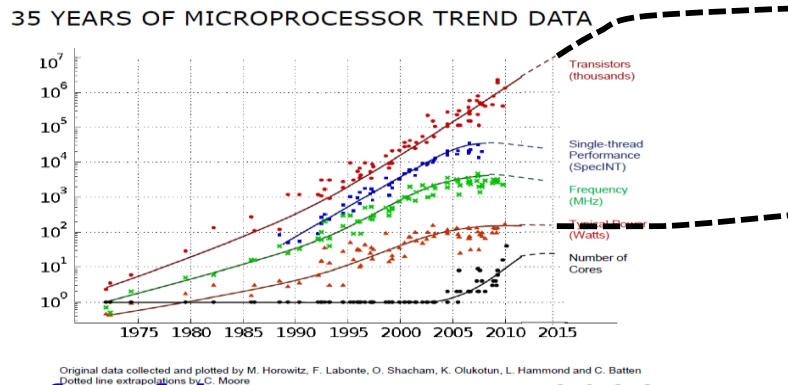
# Basic Research #1: NEDO 100x Processor

## 2028: Post-Moore Era

~2015 ~25 Years Post-Dennard,  
Many-core Scaling era

2016~Moore's Law Slowing Down

2025~Post-Moore Era, end of transistor  
lithography (FLOPS) improvement



## Research: Architectural investigation of perf. improvement ~2028

- 100x in 2028 c.f. mainstream high-end CPUs circa 2018 across applications

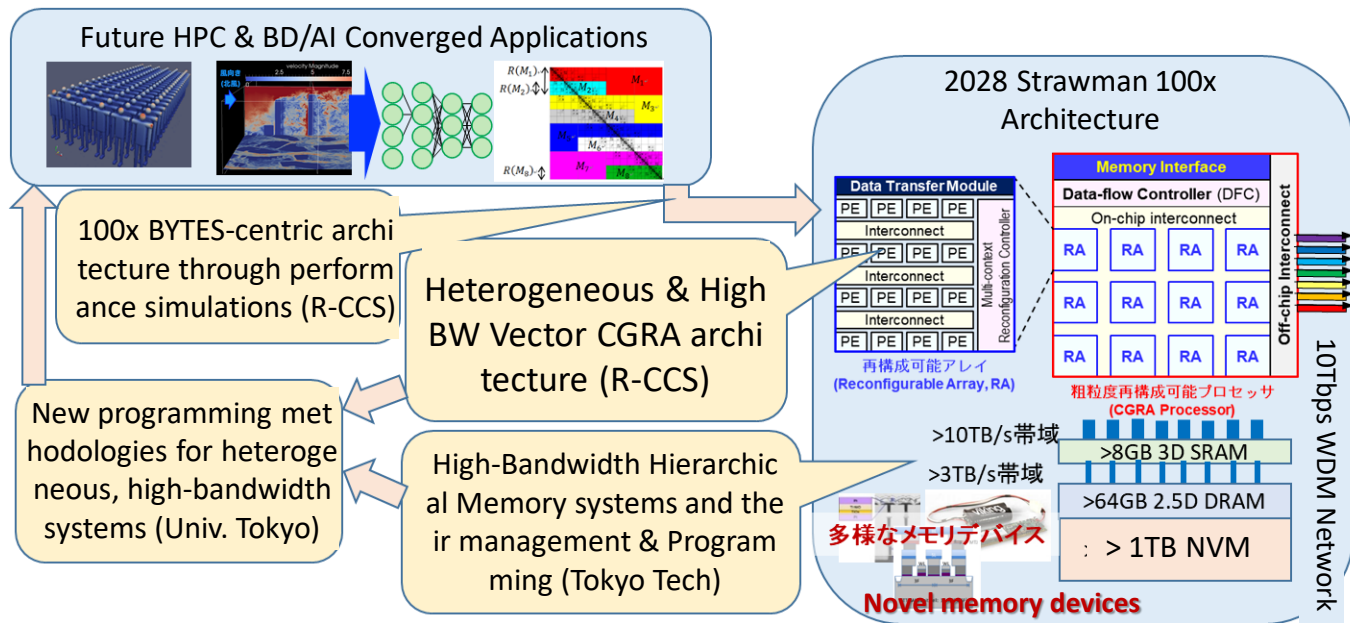
## Key to performance improvement: from FLOPS to Bytes – data movement architectural optimization

- CGRA – Coarse-Grained Reconfigurable Vector Dataflow
- Deep & Wide memory architecture w/advanced 3D packaging & novel memory devices
- All-Photonic DWM interconnect w/high BW, low energy injection
- Kernel-specific HW optimization w/low # of transistors & associated system software, programming, and algorithms

# NEDO 100x Processor

## Towards 100x processor in 2028

- Various combinations of CPU architectures, new memory devices and 3-D technologies
- Perf. measurement/characterization/models for high-BW intra-chip data movement
- Cost models and algorithms for horizontal & hierarchical data movement
- Programming models and heterogeneous resource management



# Collaborations w/External Partners

## New generation HPC&AI converged applications

**Survey and whitepaper of next-gen HPC & BD/AI covered applications**

**BDEC2** (Big Data and Extreme Computing)  
main contributor, second meeting  
Feb 2019 @ Riken-CCS (85 participants)

- The University of Tennessee
- Argonne National Laboratory
- Barcelona Supercomputing Center
- NCSA/University of Illinois
- Sandia National Laboratories
- Georgia Tech
- Shanghai Jiao Tong University
- Los Alamos National Laboratory
- JP HPCI Centers

## Survey of next-gen hardware technologies

Various deep conversations with vendors home & abroad

Various future technology outlook towards Post-Moore computing

- HPE
- Intel
- Fujitsu
- NVIDIA
- ARM
- Cavium

## Collaborations on basic post-moore research

### LBL Collaboration on post-moore machine architectures

Surveying and simulating future BYTES-oriented post-moore architectures

Topics

PARADISE (PostMoore system simulator)  
Hardware generators, Open Hardware  
Advanced materials and devices  
CRXO and EUREJKA  
Quantum computing

Main Collaborators

|                   |                  |
|-------------------|------------------|
| John Shalf        | David Donofrio   |
| Ramamorthy Ramesh | Patrick Naulleau |
| Dabn Armbrust     | Chia Chang       |
| Dilip Vasudevan   | Anastassia Butko |

Application Evaluation