



東京大学情報基盤センター  
INFORMATION TECHNOLOGY CENTER, THE UNIVERSITY OF TOKYO



**Wisteria**  
**BDEC-01**

# **Overview of h3-Open-BDEC: Innovative Software Infrastructure for Scientific Computing in the Exascale Era by Integrations of (Simulation + Data + Learning)**

<https://h3-open-bdec.cc.u-tokyo.ac.jp/>

**Kengo Nakajima**  
Information Technology Center  
The University of Tokyo



**International Workshop on the Integration of (Simulation + Data + Learning) :  
Towards Society h3-Open-BDEC, November 30 & December 3, 2021 (Online)**

# International Workshop on the Integration of (Simulation + Data + Learning): Towards Society 5.0 by h3-Open-BDEC (1/2)

- ✓ Towards the end of Moore's law, we need to develop new algorithms and applications.
- ✓ We are developing h3-Open-BDEC, which is innovative software for sustainable promotion of scientific discovery by supercomputers in the Exascale Era by combining (Simulation + Data + Learning (S+D+L)), where ideas of data science and machine learning are introduced to computational science.
- ✓ Integration of (S+D+L) is also important for realization of Society 5.0, which is a “Super Smart and Human-centered Society” by digital innovation, such as IoT, Big Data, AI etc., and by integration of cyber-space (digital/virtual space) and physical-space (real space).

# International Workshop on the Integration of (Simulation + Data + Learning): Towards Society 5.0 by h3-Open-BDEC (2/2)

- ✓ The h3-Open-BDEC project is funded by Japanese Government via JSPS Grant-in-Aid for Scientific Research (S) (Leading PI: Kengo Nakajima, the University of Tokyo, 19H05662) since 2019.
- ✓ In this workshop, we would like to report our progress of research and development in recent 2.5 years.
- ✓ While there are talks by Co-PI's and members of the project, we have 6 excellent invited talks from Japan, Taiwan, USA and Germany.

# Invited Speakers

**Thank you very much for your excellent contributions !!**

- ✓ Gerhard Wellein (FAU Erlangen-Nuremberg, Germany)
- ✓ Kento Sato (RIKEN Center for Computational Science, Japan)
- ✓ Osni Marques (Lawrence Berkley National Laboratory, USA)
- ✓ Rich Vuduc (Georgia Institute of Technology, USA)
- ✓ Takeshi Fukaya (Hokkaido University/JST PRESTO, Japan)
- ✓ Weichung Wang (National Taiwan University, Taiwan)

# International Workshop on the Integration of (Simulation + Data + Learning): Towards Society 5.0 by h3-Open-BDEC (2/2)

- ✓ The h3-Open-BDEC project is funded by Japanese Government via JSPS Grant-in-Aid for Scientific Research (S) (Leading PI: Kengo Nakajima, the University of Tokyo, 19H05662) since 2019.
- ✓ In this workshop, we would like to report our progress of research and development in recent 2.5 years.
- ✓ While there are talks by Co-PI's and members of the project, we have 6 excellent invited talks from Japan, Taiwan, USA and Germany.
- ✓ All members of the project are happy to welcome all participants, and would like to discuss on various aspects of integration of (S+D+L). Please enjoy this two-day online event.



東京大学情報基盤センター  
INFORMATION TECHNOLOGY CENTER, THE UNIVERSITY OF TOKYO



**Wisteria**  
**BDEC-01**

# Overview of h3-Open-BDEC: Innovative Software Infrastructure for Scientific Computing in the Exascale Era by Integrations of (Simulation + Data + Learning)

<https://h3-open-bdec.cc.u-tokyo.ac.jp/>

**Kengo Nakajima**  
Information Technology Center  
The University of Tokyo



International Workshop on the Integration of (Simulation + Data + Learning) :  
Towards Society h3-Open-BDEC, November 30 & December 3, 2021 (Online)

# 3 Systems in April 2021 (ITC/U.Tokyo)

2,600+ users (55+% from outside of U.Tokyo)

- Reedbush (HPE, Intel BDW + NVIDIA P100 (Pascal))
  - Integrated Supercomputer Sys. for Data Analyses & Scientific Simulations
    - Jul.2016-Nov.2021 (Plan)
  - Our first GPU System, DDN IME (Burst Buffer)
  - Reedbush-U: CPU only, 420 nodes, 508 TF (Jul.2016~, retired June 2020)
  - Reedbush-H: 120 nodes, 2 GPUs/node: 1.42 PF (Mar.2017~Nov.2021)
  - Reedbush-L: 64 nodes, 4 GPUs/node: 1.43 PF (Oct.2017~Nov.2021)
- Oakforest-PACS (OFP) (Fujitsu, Intel Xeon Phi (KNL))
  - JCAHPC (U.Tsukuba & U.Tokyo)
  - 25 PF, #22 in 56<sup>th</sup> TOP 500 (November 2020) (#4 in Japan), Omni-Path Architecture, DDN IME (Burst Buffer), Sept.2016~Mar.2022
- Oakbridge-CX (OBCX) (Fujitsu, Intel Xeon Platinum 8280, CLX)
  - Massively Parallel Supercomputer System
  - 6.61 PF, #69 in 56<sup>th</sup> TOP 500, July 2019-June 2023
  - SSD's are installed to 128 nodes (out of 1,368)



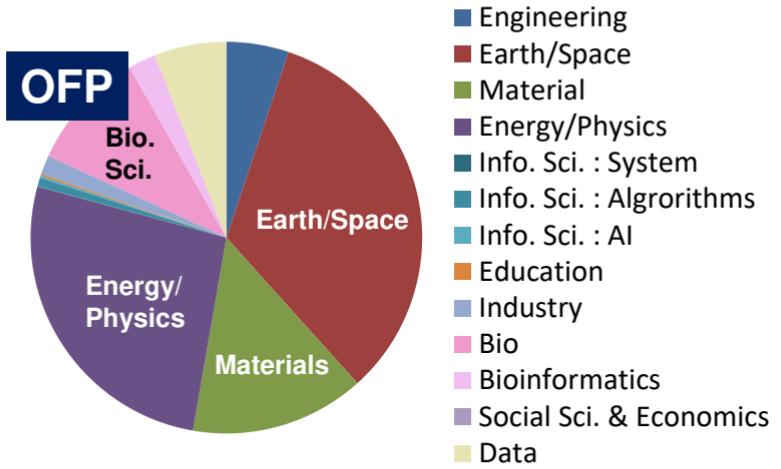
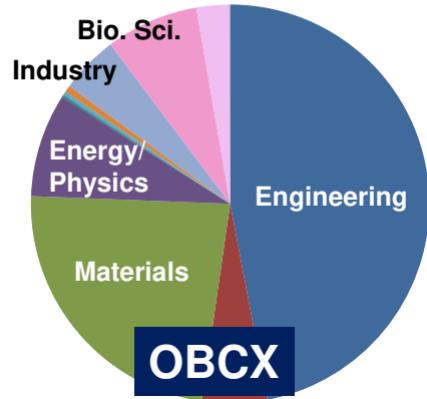
# 3 Systems at the end of March 2021

2,600+ users (55+% from outside of U.Tokyo)

- Reedbush (HPE, Intel BDW + NVIDIA P100 (Pascal))
  - Integrated Supercomputer Sys. for Data Analyses & Scientific Simulations
    - Jul.2016-Nov.2021 (Plan)
  - Our first GPU System, DDN IME (Burst Buffer)
  - Reedbush-U: CPU only, 420 nodes, 508 TF (Jul.2016~, retired June 2020)
  - Reedbush-H: 120 nodes, 2 GPUs/node: 1.42 PF (Mar.2017~Nov.2021)
  - Reedbush-L: 64 nodes, 4 GPUs/node: 1.43 PF (Oct.2017~Nov.2021)
- **Oakforest-PACS (OFP) (Fujitsu, Intel Xeon Phi (KNL))**
  - JCAHPC (U.Tsukuba & U.Tokyo)
  - 25 PF, #22 in 56<sup>th</sup> TOP 500 (November 2020) (#4 in Japan), Omni-Path Architecture, DDN IME (Burst Buffer), Sept.2016~Mar.2022
- Oakbridge-CX (OBCX) (Fujitsu, Intel Xeon Platinum 8280, CLX)
  - Massively Parallel Supercomputer System
  - 6.61 PF, #69 in 56<sup>th</sup> TOP 500, July 2019-June 2023
  - SSD's are installed to 128 nodes (out of 1,368)



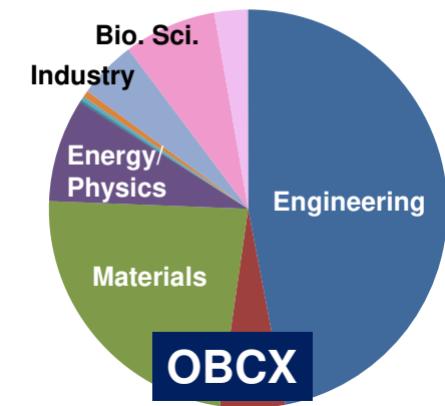
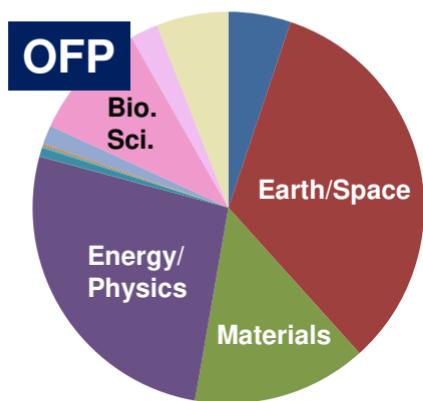
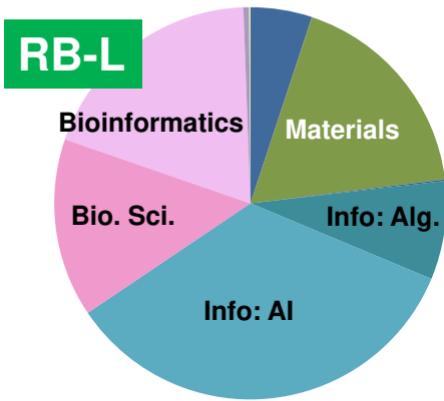
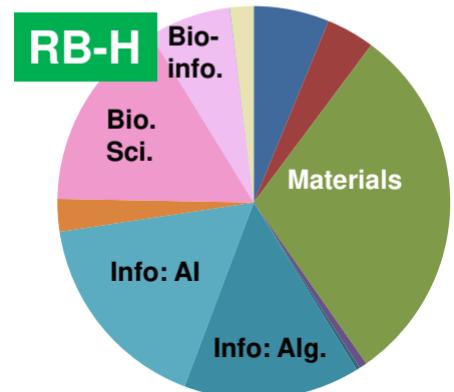
# Research Area based on CPU Hours (FY.2020)



CPU  
GPU

- Engineering
- Earth/Space
- Material
- Energy/Physics
- Info. Sci. : System
- Info. Sci. : Algorithms
- Info. Sci. : AI
- Education
- Industry
- Bio
- Bioinformatics
- Social Sci. & Economics
- Data

# Research Area based on CPU Hours (FY.2020)

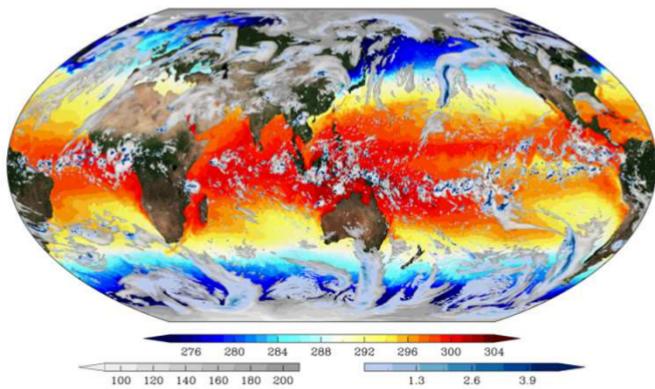


- Engineering
- Earth/Space
- Material
- Energy/Physics
- Info. Sci. : System
- Info. Sci. : Algorithms
- Info. Sci. : AI
- Education
- Industry
- Bio
- Bioinformatics
- Social Sci. & Economics
- Data

■ CPU  
■ GPU

11

# Global Atmosphere-Ocean Coupled Simulations

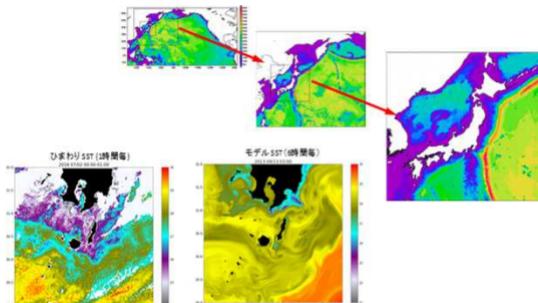
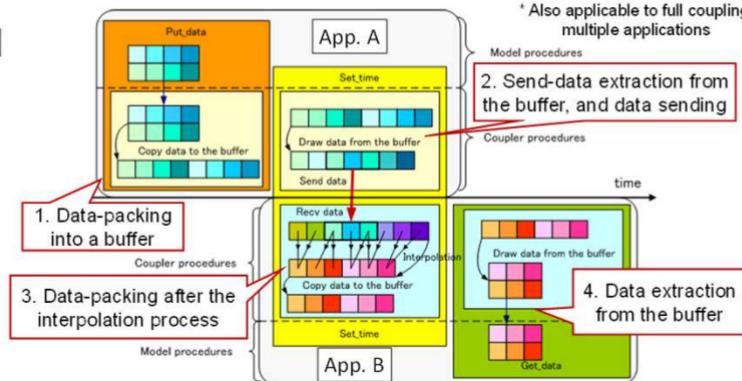
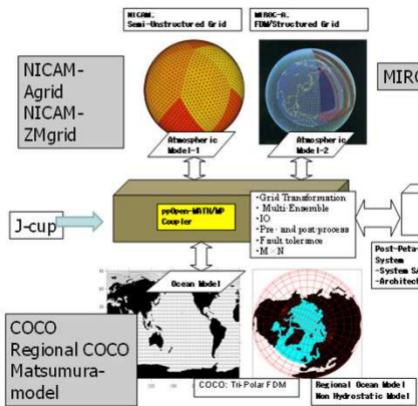
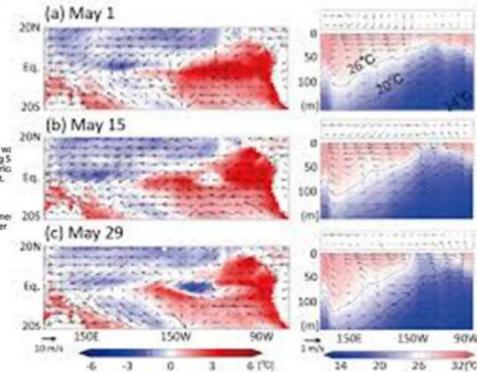


## THE EL NIÑO PHENOMENON

## NORMAL YEAR

EL NIÑO  
YEAR

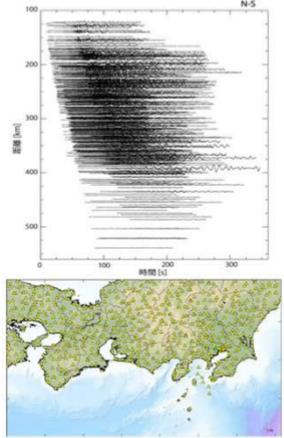
The diagram shows the Southern Ocean's circulation. Wind arrows from the west blow over the surface waters, causing them to move eastward. This surface current then sinks at the southern end of the continent, creating a westward-moving deep current. The labels include the Pacific Ocean, South America, Australia, and the Southern Ocean.



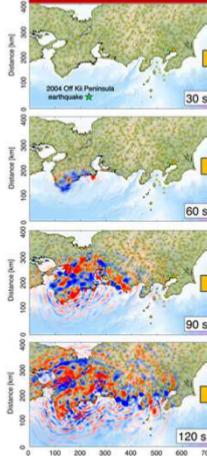
[c/o Prof. M. Sato, Prof. H. Hasumi  
(AORI/U.Tokyo)]

# Solid Earth & Earthquake Simulations

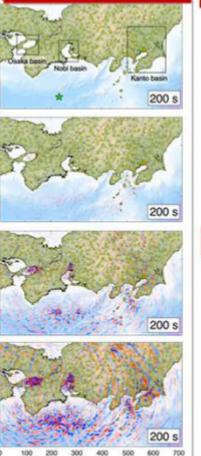
○ Observation (K-NET, KiK-net 446 pts)



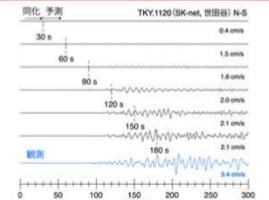
(a) Assimilated



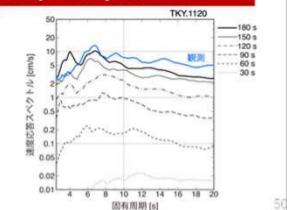
(b) Pure Simulation



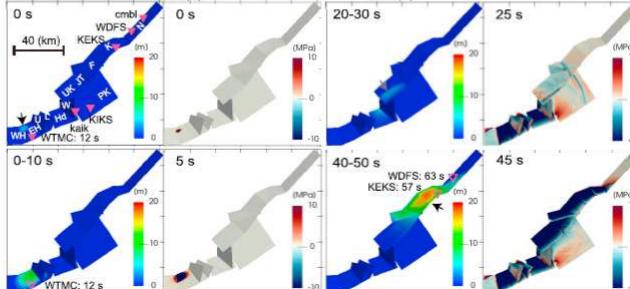
## Long Wave Propagation in Tokyo



## Response Spectrum

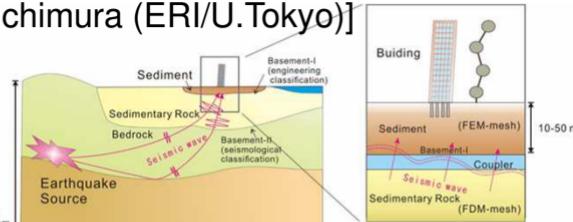


Assimilation at 90 sec. → Pure Simulation

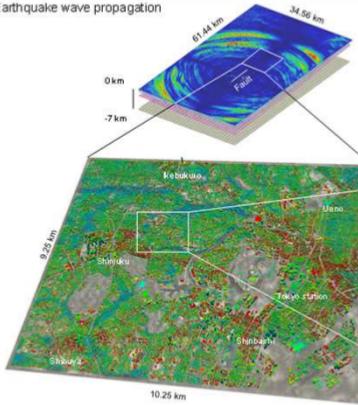


[c/o Prof. R. Ando (U.Tokyo)]

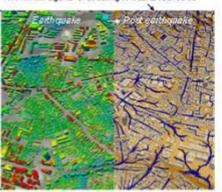
[c/o Prof. T. Furumura,  
Prof. T. Ichimura (ERI/U.Tokyo)]



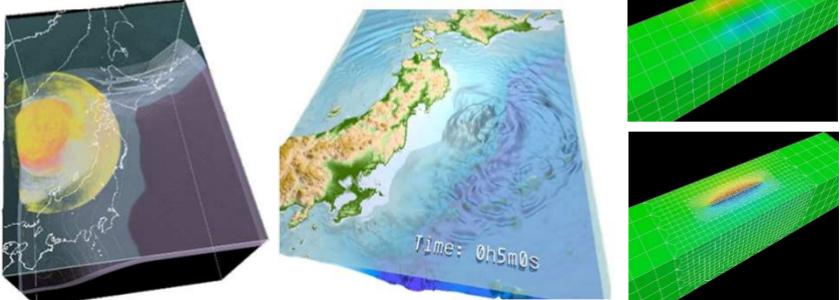
a) Earthquake wave propagation



c) Resident evacuation



b) City response simulation



# Simulation of Geologic CO<sub>2</sub> Storage

[c/o Dr. Hajime Yamamoto  
(Taisei Corporation)]

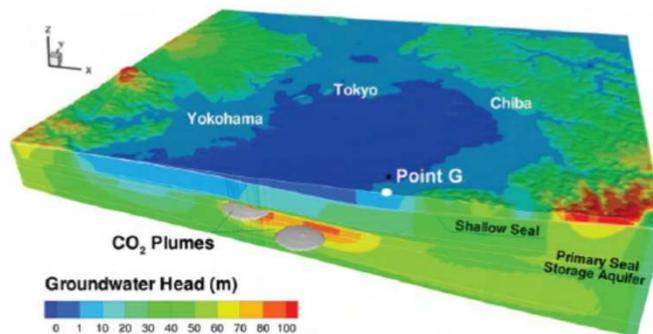
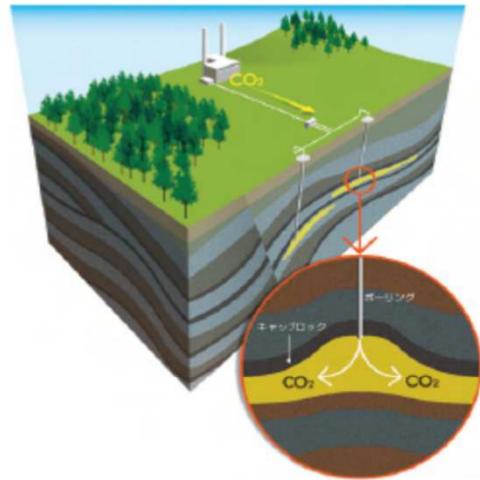


図-4 CO<sub>2</sub>圧入後の地下水圧（全水頭換算）の分布（100 年後）

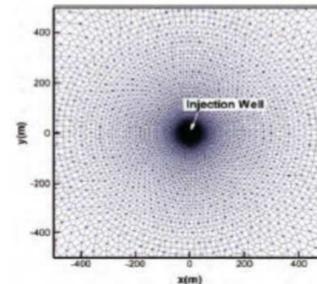
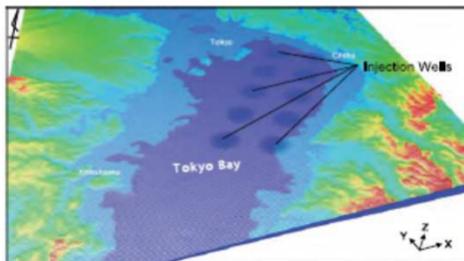
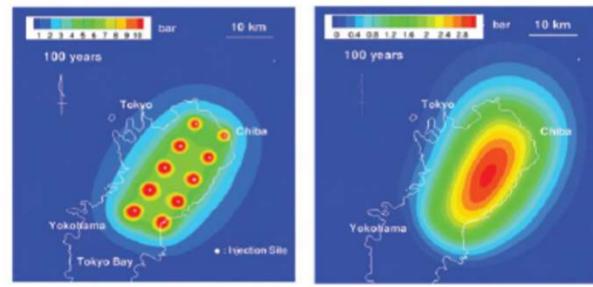
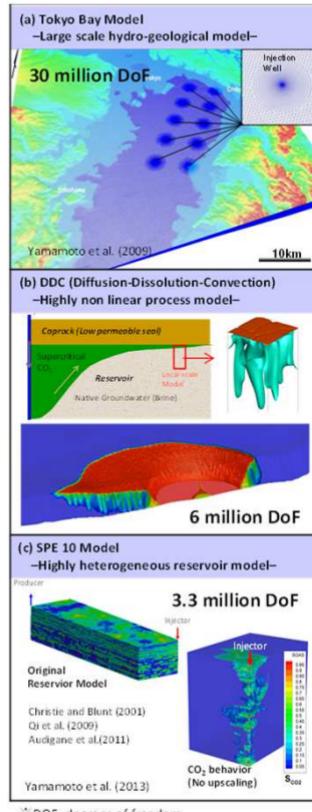


図-5 圧力上昇量の平面分布（初期状態からの増分、圧入開始から 100 年後）



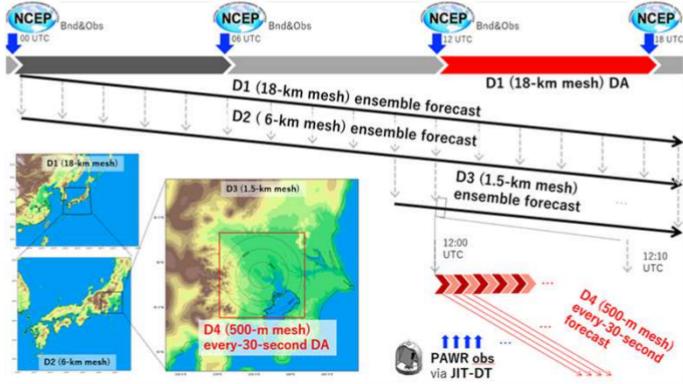
(a) 深部遮蔽層下面

(b) 浅部遮蔽層下面



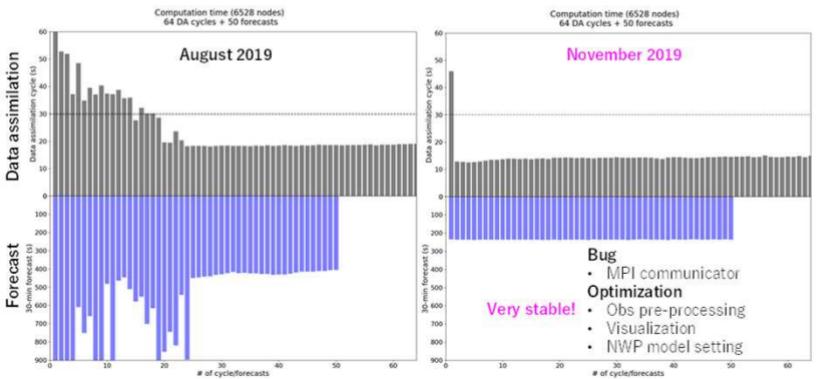
※DOF: degrees of freedom

# Real-Time Prediction of Severe Rainstorm by OFP



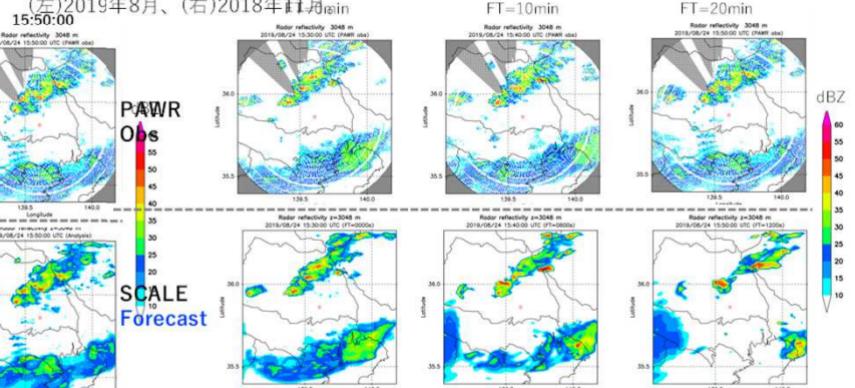
全体のワークフロー

15:30:00      15:40:00



計算性能の向上。上段はデータ同化、下段は30分予報にかかった時間(秒)。

(左)2019年8月、(右)2018年11月



PAWR  
Obs

SCALE-  
LETKF  
Analysis

[c/o Dr. Takemasa Miyoshi  
(RIKEN R-CCS)]

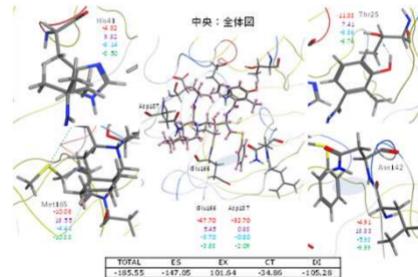
2019年8月24日の事例についてのテスト結果。(上)レーダー観測と(下)SCALE-LETKFによる解析で得られたレーダー反射強度(dBZ)を示す。

# HPCI Urgent Call for Fighting against COVID-19 in Japan (FY.2020)

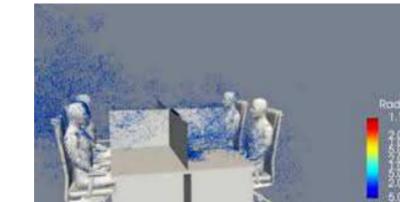
by 8 SC Centers of Natl. Univ., AIST etc.

6 of 14 accepted projects use U.Tokyo's Systems

Project Name	PI	System
Fragment molecular orbital calculations on the main protease of COVID-19	Yuji Mochizuki (Rikkyo U.)	OPP
Study on the evaluation of arrhythmogenic risk of COVID-19 candidate drugs	Toshiaki Hisada (UT Heart)	
Prediction of dynamical structure of Spike protein of SARS-COVID19	Yuji Sugita (RIKEN)	OBCX
Computer-assisted search for inhibitory agents for SARS-CoV-2	Tyuji Hoshino (Chiba U.)	
Prediction and Countermeasure for virus droplet Infection under Indoor Environment: Case studies for massively-parallel simulation on Fugaku	Makoto Tsubokura (Kobe U.)	OBCX
Spreading of polydisperse droplets in a turbulent puff of saturated exhaled air	Marco Edoardo Rosti (OIST)	



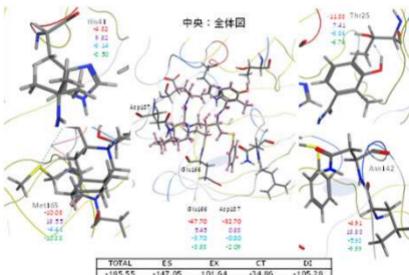
[c/o Prof. Y. Mochizuki (Rikko U.)]



[c/o Prof. M.Tsubokura (Kobe U.)]

# HPCI Urgent Call for Fighting against COVID-19 in Japan (FY.2020)

by 8 SC Centers of Natl. Univ., AIST etc.



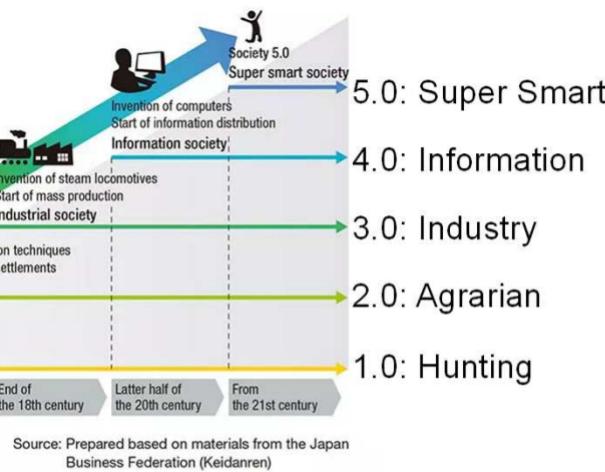
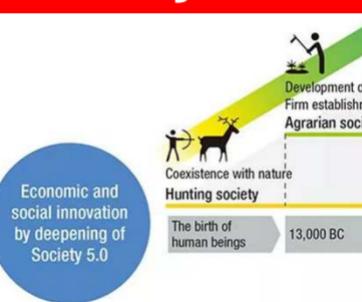
# Society 5.0 & BDEC System

- We are developing an innovative method of computational science towards the Exascale Era/Society 5.0 by integration of (Simulation + Data + Learning (S+D+L)), where ideas of data science and machine learning are introduced to computational science

# Society 5.0: the Cabinet Office of Japan

- Super Smart & Human-centered Society by Digital Innovation (IoT, Big Data, AI etc.) and by Integration of Cyber Space & Physical Space

**HPC is very important for Society 5.0**



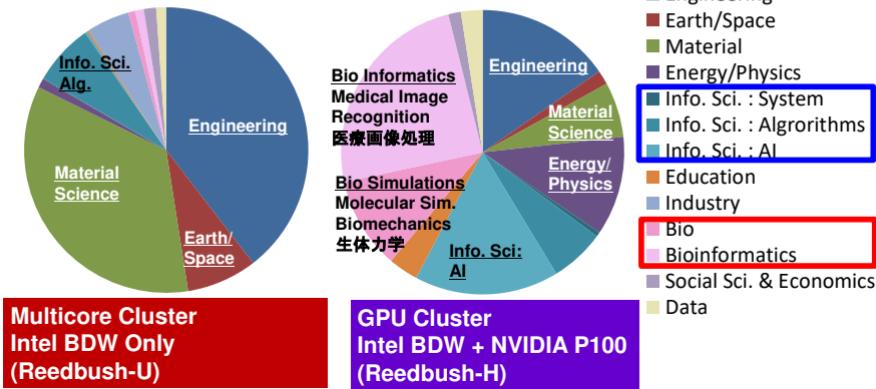
## Society 5.0 for SDGs

Society 5.0 offers a new growth model with a view of “solving social issues” as well as “creating a better future”, which **contributes to the achievement of SDGs**



# Future of Supercomputing

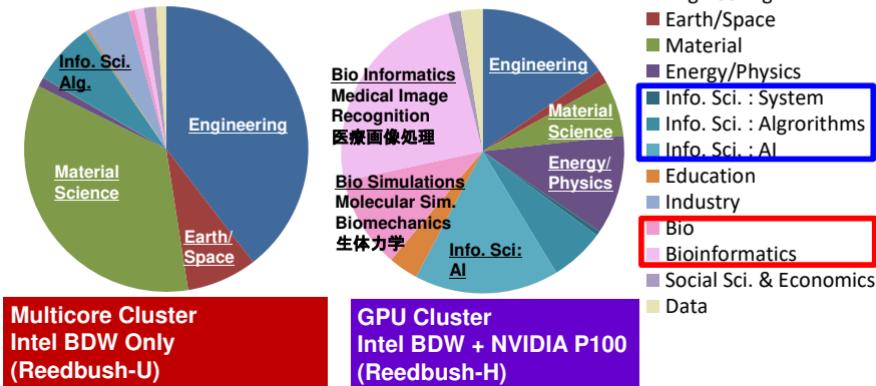
- Various Types of Workloads
  - Computational Science & Engineering: Simulations
  - Big Data Analytics
  - AI, Machine Learning ...



# Future of Supercomputing

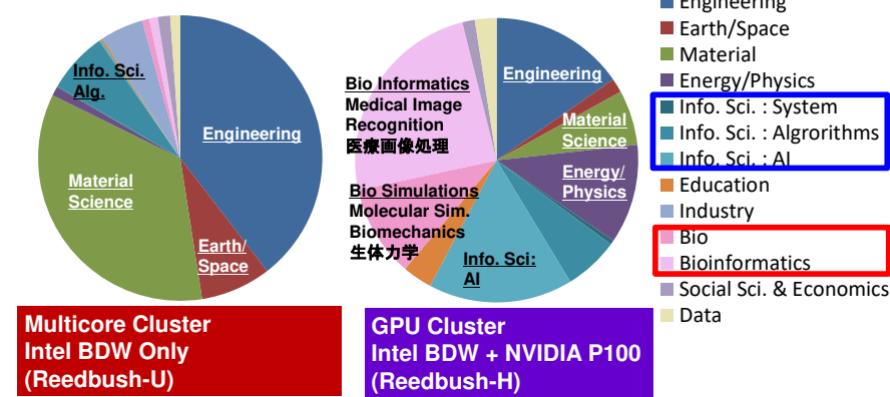
- Various Types of Workloads
  - Computational Science & Engineering: Simulations
  - Big Data Analytics
  - AI, Machine Learning ...

**Integration/Convergence of  
(Simulation + Data + Learning)  
(S+D+L) is important towards  
Society 5.0**



# Future of Supercomputing

- Various Types of Workloads
  - Computational Science & Engineering: Simulations
  - Big Data Analytics
  - AI, Machine Learning ...



- **Integration/Convergence of (Simulation + Data + Learning) (S+D+L) is important towards Society 5.0**

- **BDEC (Big Data & Extreme Computing)**
  - Platform for Integration of (S+D+L)
  - Focusing on S (Simulation)
    - AI for HPC, Sophisticated Simulation
  - Planning started in 2015

**BDEC (Big Data & Extreme Computing)**

**S + D + L**

# Society 5.0 & BDEC System

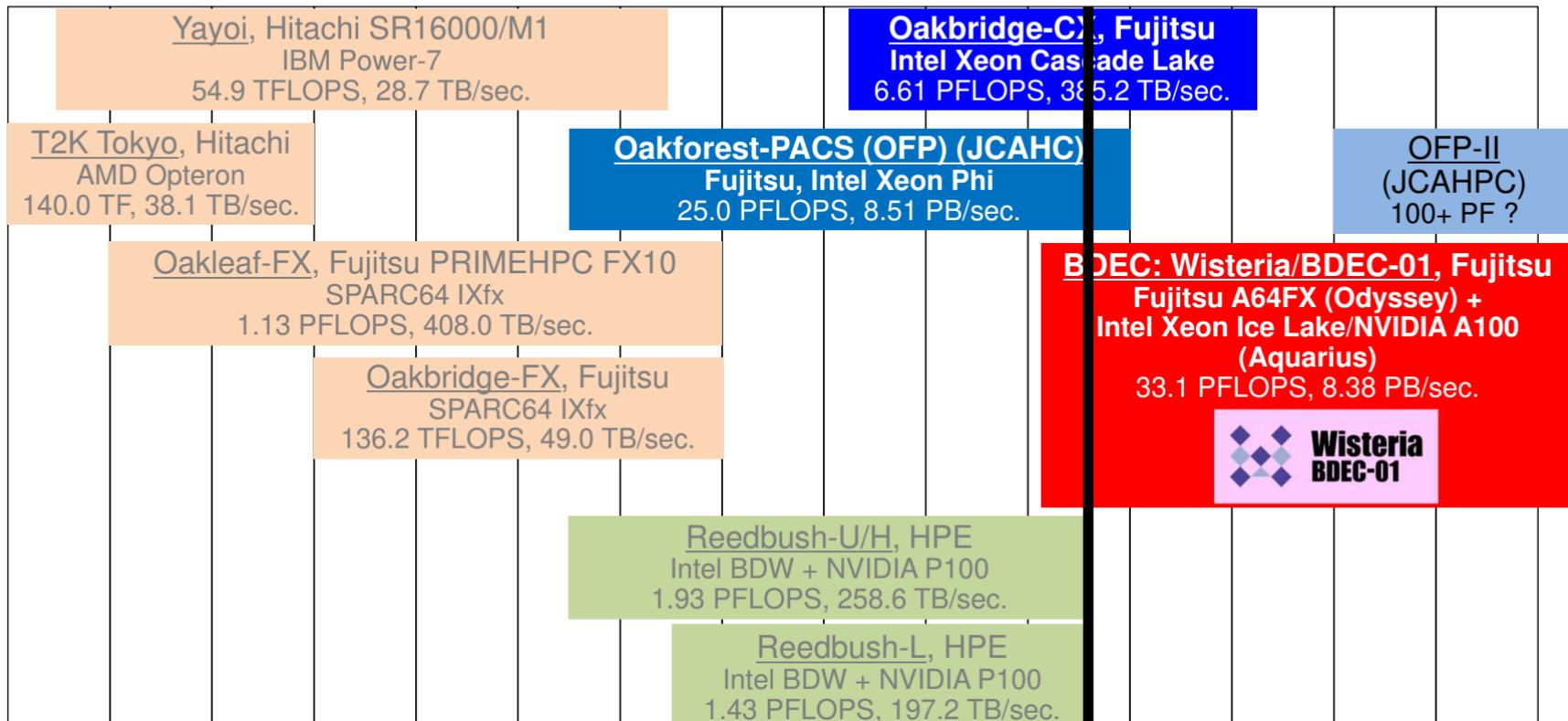
- We are developing an innovative method of computational science towards the Exascale Era/Society 5.0 by integration of (Simulation + Data + Learning (S+D+L)), where ideas of data science and machine learning are introduced to computational science
- **We have been operating 3 systems, and are now introducing the BDEC (Big Data & Extreme Computing) System as the Platform for Integration of (S+D+L)**
  - Wisteria/BDEC-01 with 33.1 PF



# Supercomputers in ITC/U.Tokyo

Information Technology Center, The University of Tokyo

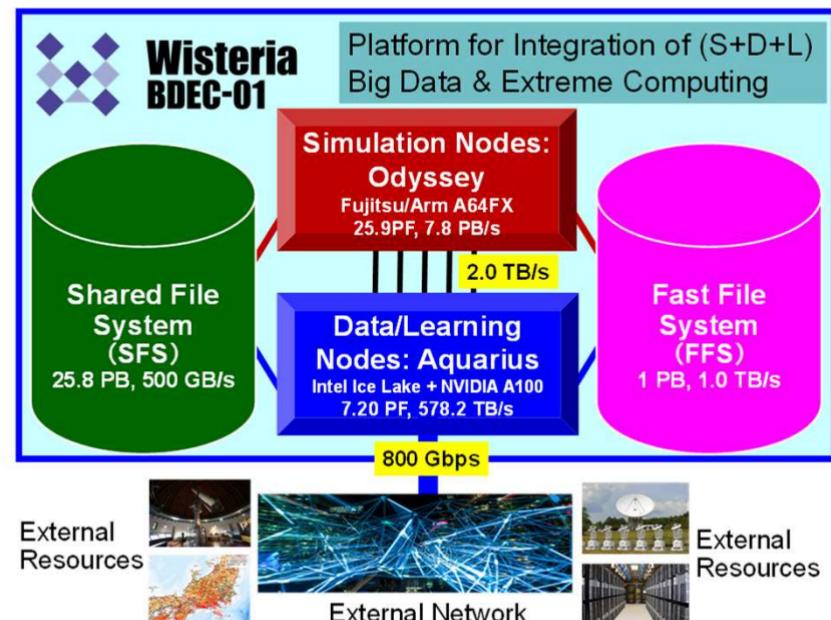
FY11 12 13 14 15 16 17 18 19 20 21 22 23 24 25



# Wisteria/BDEC-01

- Operation starts on May 14, 2021
- 33.1 PF, 8.38 PB/sec by Fujitsu
  - ~4.5 MVA with Cooling, ~360m<sup>2</sup>
- 2 Types of Node Groups
  - Hierarchical, Hybrid, Heterogeneous (h3)
  - Simulation Nodes: Odyssey
    - Fujitsu PRIMEHPC FX1000 (A64FX), 25.9 PF
      - 7,680 nodes (368,640 cores), Tofu-D
      - General Purpose CPU + HBM
      - Commercial Version of “Fugaku”
  - Data/Learning Nodes: Aquarius
    - Data Analytics & AI/Machine Learning
    - Intel Xeon Ice Lake + NVIDIA A100, 7.2PF
      - 45 nodes (90x Ice Lake, 360x A100), IB-HDR
    - Some of the DL nodes are connected to external resources directly
- File Systems: SFS (Shared/Large) + FFS (Fast/Small)

## The 1<sup>st</sup> BDEC System (Big Data & Extreme Computing) Platform for Integration of (S+D+L)



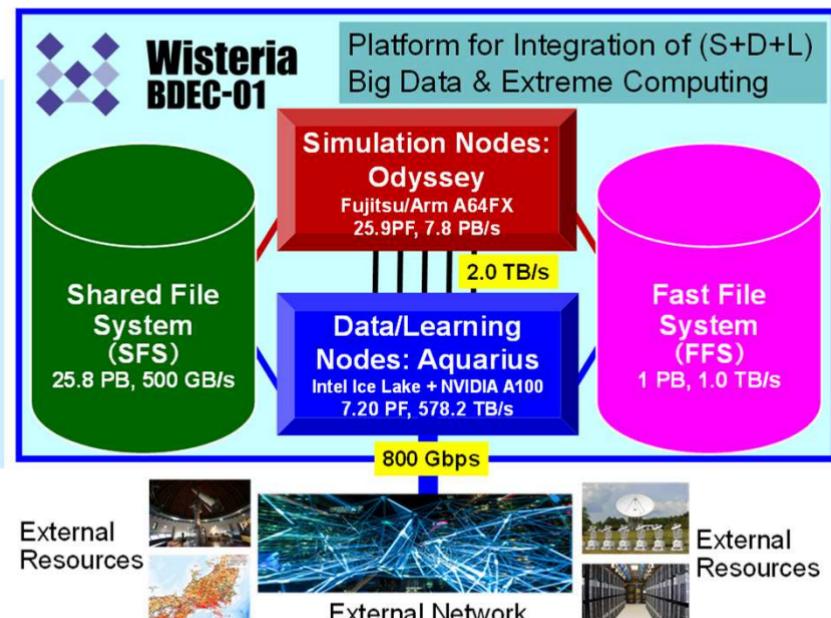
External  
Resources

External  
Resources

# Wisteria/BDEC-01

- Operation starts on May 14, 2021
- 33.1 PF, 8.38 PB/sec by Fujitsu
  - ~4.5 MVA with Cooling, ~360m<sup>2</sup>
- **2 Types of Node Groups**
  - Hierarchical, Hybrid, Heterogeneous (h3)
  - Simulation Nodes: Odyssey
    - Fujitsu PRIMEHPC FX1000 (A64FX), 25.9 PF
      - 7,680 nodes (368,640 cores), Tofu-D
      - General Purpose CPU + HBM
      - Commercial Version of “Fugaku”
  - Data/Learning Nodes: Aquarius
    - Data Analytics & AI/Machine Learning
    - Intel Xeon Ice Lake + NVIDIA A100, 7.2PF
      - 45 nodes (90x Ice Lake, 360x A100), IB-HDR
    - Some of the DL nodes are connected to external resources directly
- File Systems: SFS (Shared/Large) + FFS (Fast/Small)

## The 1<sup>st</sup> BDEC System (Big Data & Extreme Computing) Platform for Integration of (S+D+L)



External  
Resources

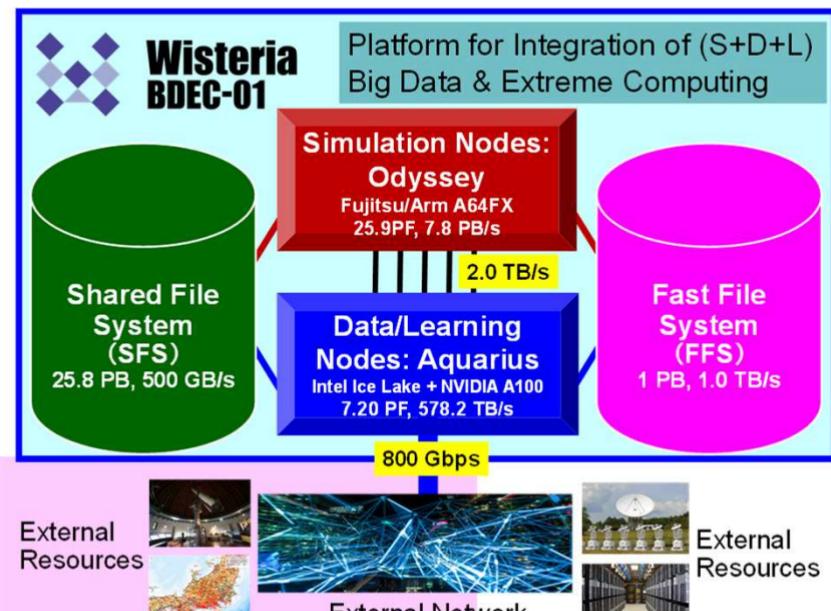


External Network

# Wisteria/BDEC-01

- Operation starts on May 14, 2021
- 33.1 PF, 8.38 PB/sec by Fujitsu
  - ~4.5 MVA with Cooling, ~360m<sup>2</sup>
- **2 Types of Node Groups**
  - Hierarchical, Hybrid, Heterogeneous (h3)
  - Simulation Nodes: Odyssey
    - Fujitsu PRIMEHPC FX1000 (A64FX), 25.9 PF
      - 7,680 nodes (368,640 cores), Tofu-D
      - General Purpose CPU + HBM
      - Commercial Version of “Fugaku”
  - Data/Learning Nodes: Aquarius
    - Data Analytics & AI/Machine Learning
    - Intel Xeon Ice Lake + NVIDIA A100, 7.2PF
      - 45 nodes (90x Ice Lake, 360x A100), IB-HDR
    - Some of the DL nodes are connected to external resources directly
- File Systems: SFS (Shared/Large) + FFS (Fast/Small)

## The 1<sup>st</sup> BDEC System (Big Data & Extreme Computing) Platform for Integration of (S+D+L)



Some of the DL nodes are connected to external resources directly





**Wisteria  
BDEC-01**

Platform for Integration of (S+D+L)  
Big Data & Extreme Computing



**Simulation Nodes: Odyssey**  
Fujitsu/Arm A64FX  
25.9PF, 7.8 PB/s

2.0 TB/s

**Data/Learning Nodes: Aquarius**  
Intel Ice Lake + NVIDIA A100  
7.20 PF, 578.2 TB/s

800 Gbps



External Resources



External Resources

External Network



Simulation Nodes  
(Odyssey)



Data/Learning Nodes  
(Aquarius)



**東京大学**  
THE UNIVERSITY OF TOKYO



**東京大学情報基盤センター**  
INFORMATION TECHNOLOGY CENTER, THE UNIVERSITY OF TOKYO

## Reedbush (HPE, Intel BDW + NVIDIA P100 (Pascal))

- Prototype of “Wisteria/BDEC-01” for Integration of (S+D+L)
- July 2016 – November 2021 (Retired)
- Our First GPU Cluster, 3.36 PF

## Oakforest-PACS (OFP) (Fujitsu, Intel Xeon Phi (KNL))

- JCAHPC (U.Tsukuba, U.Tokyo), October 2016 – March 2022
- 25 PF, #39 in 58<sup>th</sup> TOP 500 (November 2021)

## Oakbridge-CX (OBCX) (Fujitsu, Intel Xeon CLX)

- July 2019 – June 2023
- 6.61 PF, #110 in 58<sup>th</sup> TOP500



## Wisteria/BDEC-01 (Fujitsu)

- Simulation Nodes (Oddysey): A64FX (#17)
- Data/Learning Nodes (Aquarius) (#106)
- 33.1 PF, Operation started on May 14, 2021
- Platform for Integration of “Simulation+Data+Learning (S+D+L)”
- Innovative Software Platform “h3-Open-BDEC” supported by Japanese Government (JSPS Grant-in-Aid for Scientific Res. (S) FY.2019-2023)



Reedbush



Oakforest-PACS



Oakbridge-CX

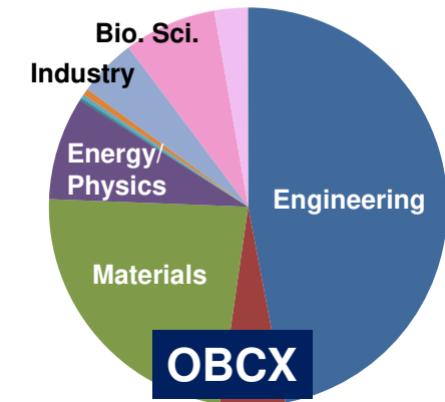
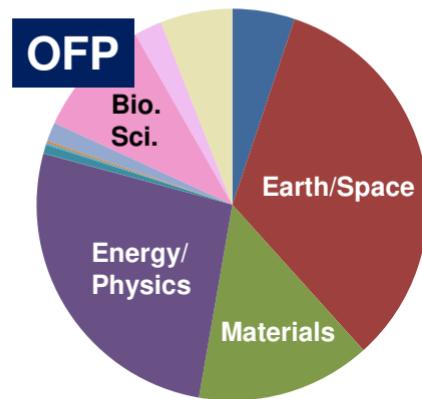
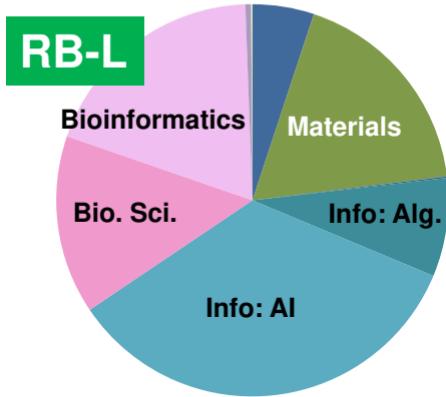
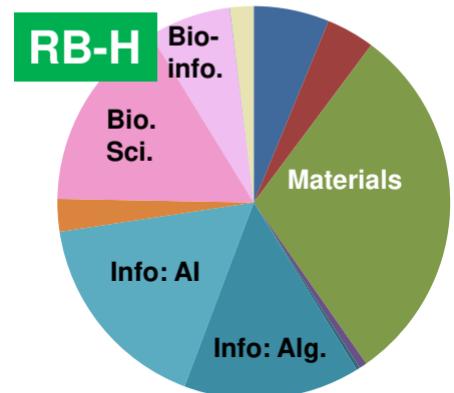
# Rankings@SC21

## November 2021



System	TOP500	Green500	HPCG	Graph500	HPL-AI
Oakforest-PACS	39	65	23	-	-
Oakbridge-CX	110	62	71	-	-
<b>Wisteria/BDEC-01 (Odyssey)</b>	<b>17</b>	<b>27</b>	<b>9</b>	<b>3</b>	<b>9</b>
<b>Wisteria/BDEC-01 (Aquarius)</b>	<b>106</b>	<b>15</b>	<b>58</b>	-	-

# Research Area based on CPU Hours (FY.2020)

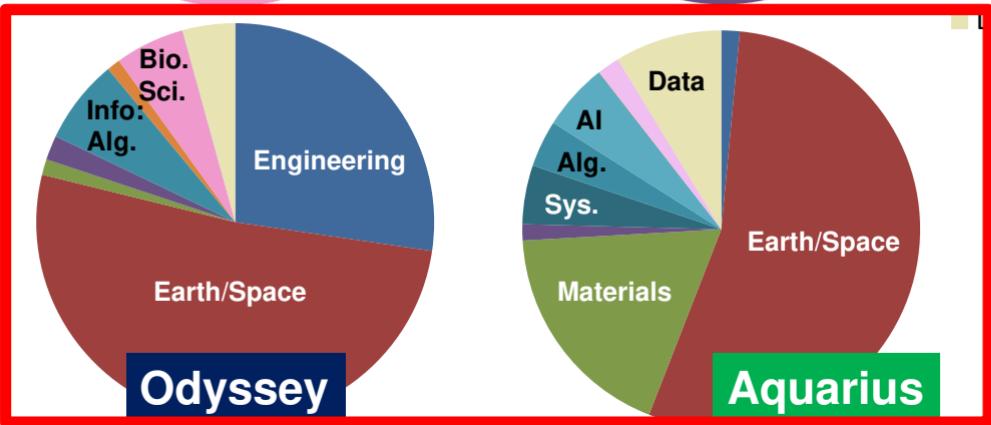
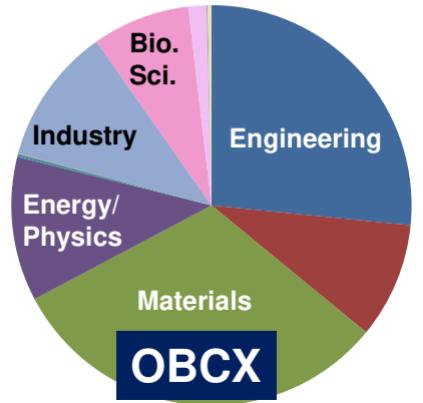
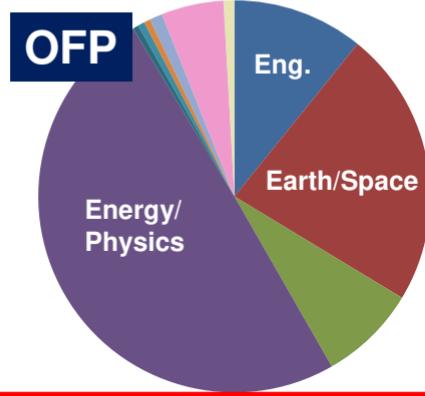
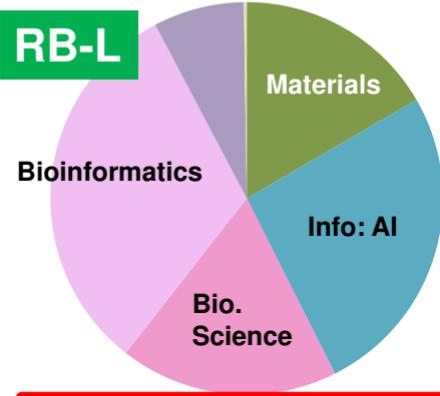
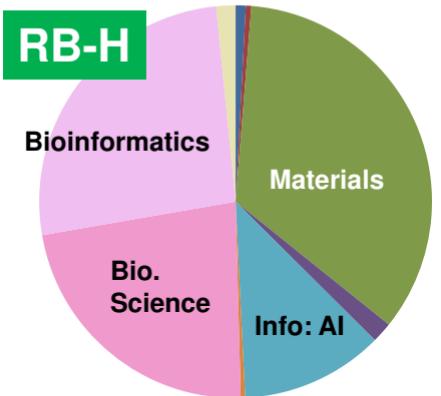


- Engineering
- Earth/Space
- Material
- Energy/Physics
- Info. Sci. : System
- Info. Sci. : Algrorithms
- Info. Sci. : AI
- Education
- Industry
- Bio
- Bioinformatics
- Social Sci. & Economics
- Data

■ CPU  
■ GPU

# Research Area based on CPU Hours (FY.2021)

Apr.2021-Sep.2021, Only Aug./Sep. for Odyssey & Aquarius

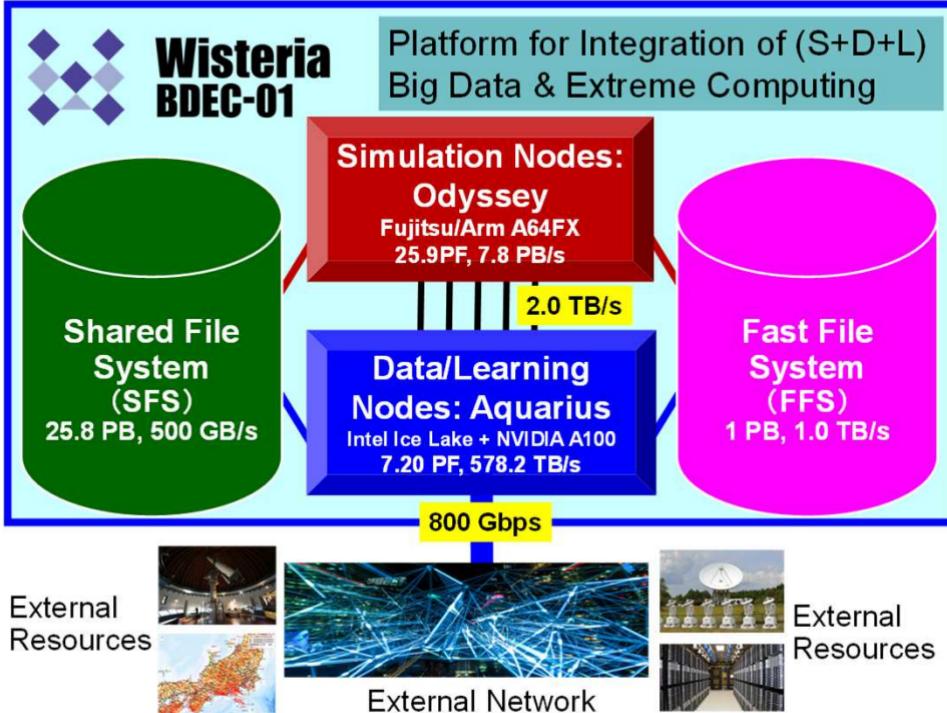


- Engineering
- Earth/Space
- Material
- Energy/Physics
- Info. Sci. : System
- Info. Sci. : Algorithms
- Info. Sci. : AI
- Education
- Industry
- Bio
- Bioinformatics
- Social Sci. & Economics
- Data

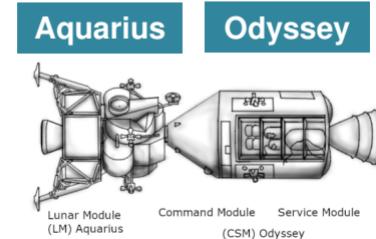
CPU  
GPU

# Wisteria/BDEC-01

## Platform for Integration of (S+D+L)



- Wisteria (紫藤)
  - “Legend of Princess Wisteria” at Lake Teganuma in Kashiwa
- Odyssey
  - Callsign of Apollo 13’s Command Module (CM)
- Aquarius
  - Callsign of Apollo 13’s Luna Module (LM)



**Simulation Nodes**  
**Odyssey**  
25.9 PF, 7.8 PB/s

**Fast File System (FFS)**  
1.0 PB,  
1.0 TB/s

**Shared File System (SFS)**  
25.8 PB,  
0.50 TB/s

**Data/Learning Nodes**  
**Aquarius**  
7.20 PF, 578.2 TB/s

Server,  
Storage,  
DB,  
Sensors,  
etc.



External Network



External  
Resources

**Simulation Codes**

**Simulation Nodes**  
**Odyssey**

**Wisteria/BDEC-01**

**Data/Learning  
Nodes, Aquarius**

**Data Assimilation  
Data Analysis**

Optimized Models &  
Parameters

**Machine  
Learning, DDA**

Results

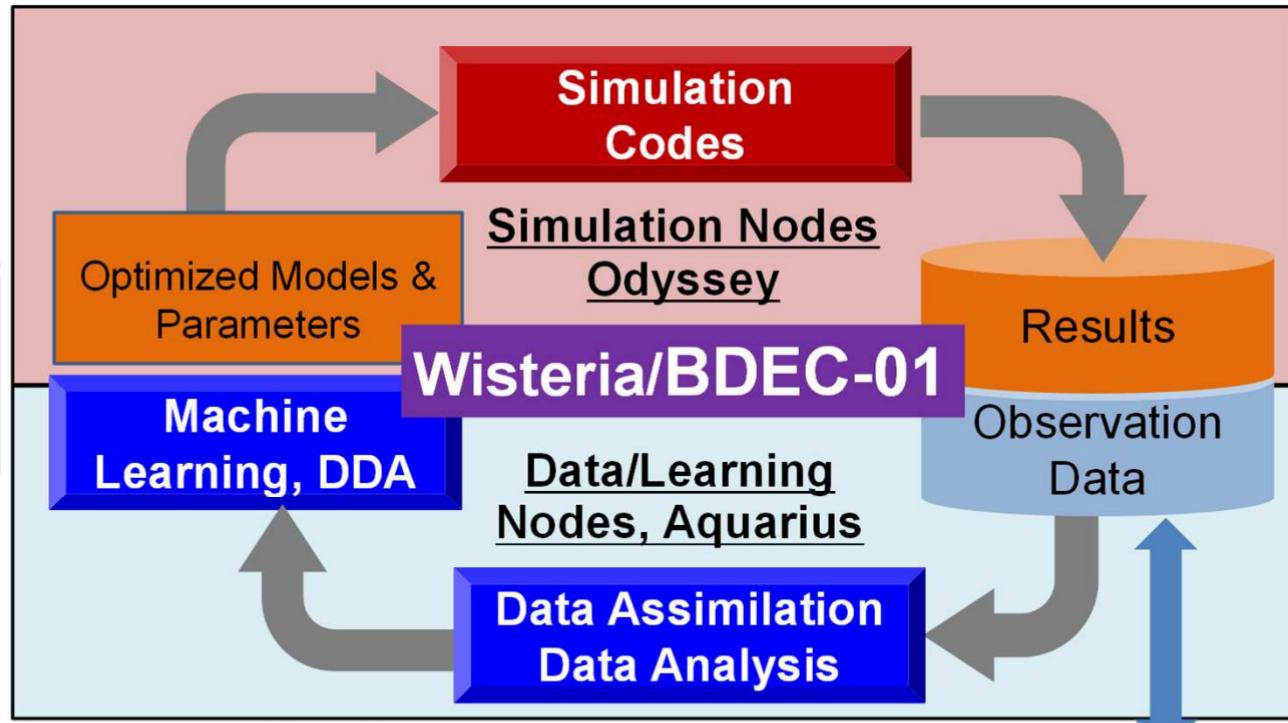
Observation  
Data

**Simulation Nodes**  
**Odyssey**  
25.9 PF, 7.8 PB/s

**Fast File System (FFS)**  
1.0 PB, 1.0 TB/s

**Shared File System (SFS)**  
25.8 PB, 0.50 TB/s

**Data/Learning Nodes**  
**Aquarius**  
7.20 PF, 578.2 TB/s



**Optimization of Models/Parameters for Simulations by Data Analytics & Machine Learning (S+D+L)**

# h3-Open-BDEC on BDEC System



- We are developing an innovative method of computational science towards the Exascale Era/Society 5.0 by integration of (Simulation + Data + Learning (S+D+L)), where ideas of data science and machine learning are introduced to computational science
- We have been operating 3 systems, and are now introducing the BDEC (Big Data & Extreme Computing) System, Wisteria/BDEC-01, with 33.1 PF as the Platform for Integration of (S+D+L)
- **h3-Open-BDEC: Innovative Software Platform for Integration of (S+D+L) on the BDEC System, such as Wisteria/BDEC-01**
  - 5-year project supported by Japanese Government through JSPS Grant-in-Aid for Scientific Research (S) since 2019
  - Leading-PI: Kengo Nakajima (The University of Tokyo)
  - Total Budget: 152.7M JPY= 1.41M USD



# Members (Co-PI's) of h3-Open-BDEC Project

## Computer Science, Computational Science, Numerical Algorithms, Data Science, Machine Learning

- Kengo Nakajima (ITC/U.Tokyo, RIKEN), Leading-PI
- Takeshi Iwashita (Hokkaido U), Co-PI, Algorithms
- Hisashi Yashiro (NIES), Co-PI, Coupling, Utility
- Hiromichi Nagao (ERI/U.Tokyo), Co-PI, Data Assimilati...
- Takashi Shimokawabe (ITC/U.Tokyo), Co-PI, ML/hDDA
- Takeshi Ogita (TWCU), Co-PI, Accuracy Verification
- Takahiro Katagiri (Nagoya U), Co-PI, Appropriate Computing
- Hiroya Matsuba (ITC/U.Tokyo), Co-PI, Container



# h3-Open-BDEC

## Innovative Software Platform for Integration of (S+D+L) on BDEC

### h3-Open-BDEC

New Principle for Computations  
Numerical Alg./Library

Simulation + Data + Learning  
App. Dev. Framework

Integration + Communications+ Utilities  
Control & Utility

**h3-Open-MATH**  
Algorithms with High-Performance, High Reliability & Mixed/Adaptive Precision

**h3-Open-APP:**  
Simulation Application Development

**h3-Open-SYS**  
Control & Integration

**h3-Open-VER**  
Verification of Accuracy

**h3-Open-DATA:** Data  
Data Science

**h3-Open-UTIL**  
Utilities for Large-Scale Computing

**h3-Open-AT**  
Automatic Tuning

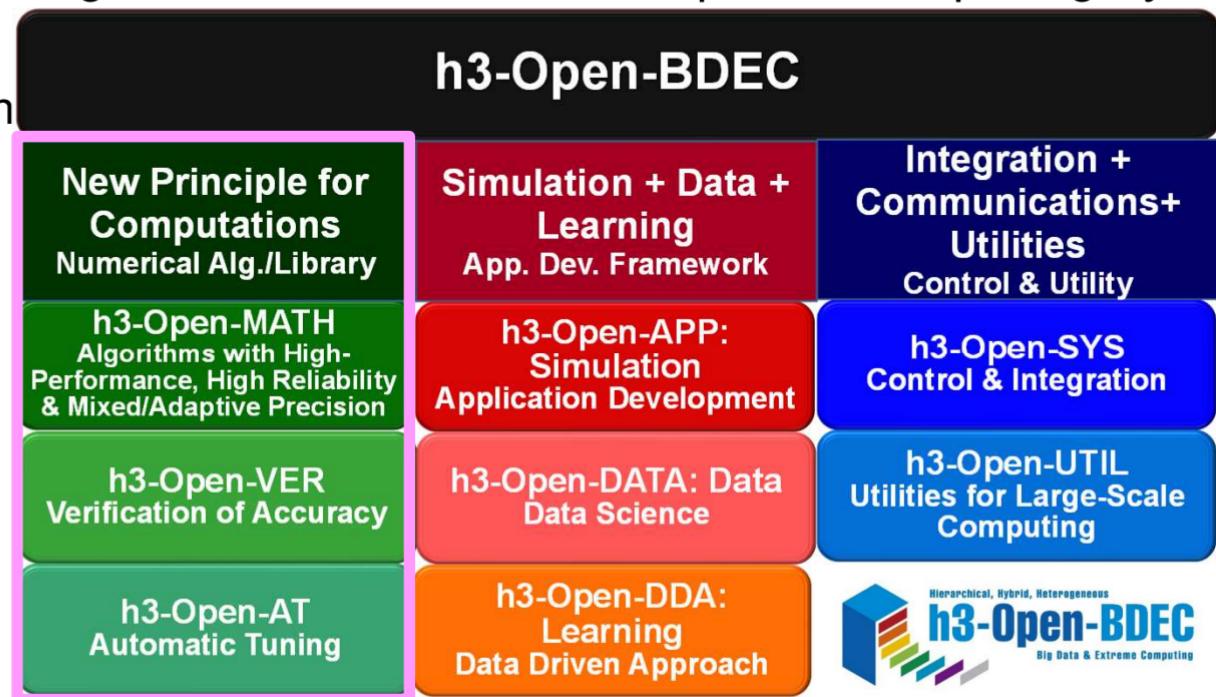
**h3-Open-DDA:**  
Learning  
Data Driven Approach



# h3-Open-BDEC: Two Significant Innovations

① Methods for Numerical Analysis with High-Performance/High-Reliability/Power-Saving based on the New Principle of Computing by

- ✓ Adaptive Precision
- ✓ Accuracy Verification
- ✓ Automatic Tuning



# Approximate Computing with Low/Adaptive/Trans Precision

- Mostly, scientific computing has been conducted using FP64 (double precision, DP)
  - Sometimes, problems can be solved by FP32 (single precision, SP) or lower precision
- **Lower precision may save time, energy and memory**

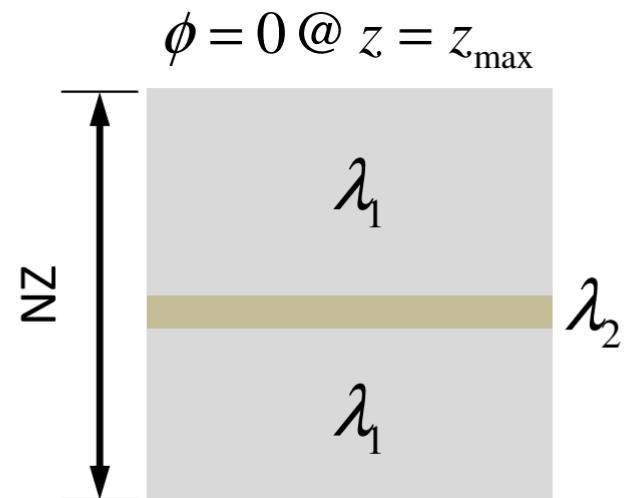
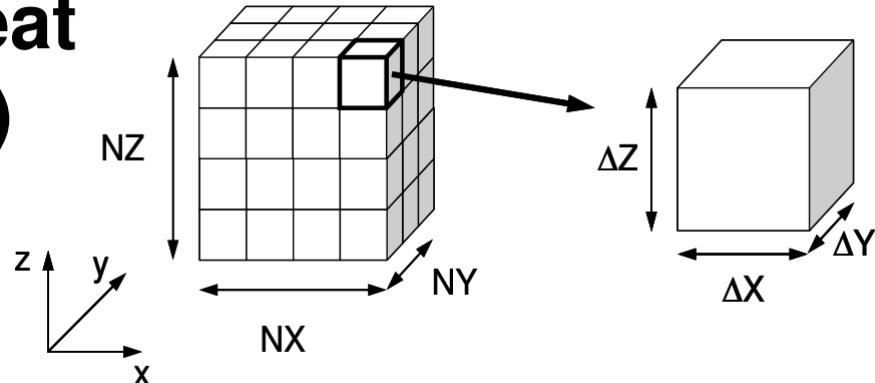
# Approximate Computing with Low/Adaptive/Trans Precision

- Mostly, scientific computing has been conducted using FP64 (double precision, DP)
  - Sometimes, problems can be solved by FP32 (single precision, SP) or lower precision
- **Lower precision may save time, energy and memory**
- **Approximate Computing**
  - Originally for image recognition etc. where accuracy is not necessarily required
  - Also applied to numerical computations
- **Computations by lower precision and by mixed precision may provide results with less accuracy**

# P3D: Steady State 3D Heat Conduction by FVM (1/2)

$$\nabla \cdot (\lambda \nabla \phi) + f = 0$$

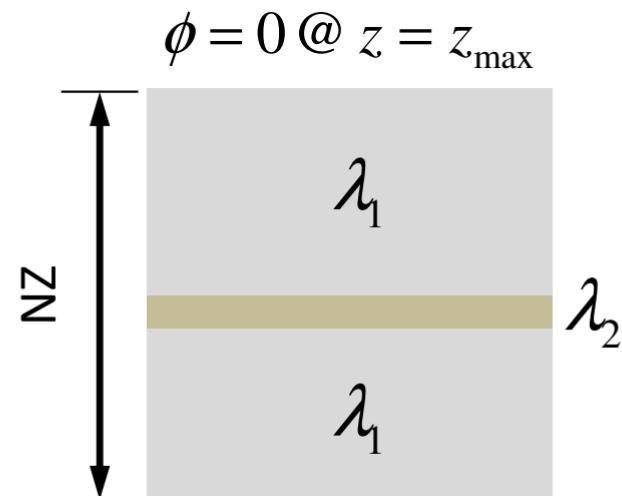
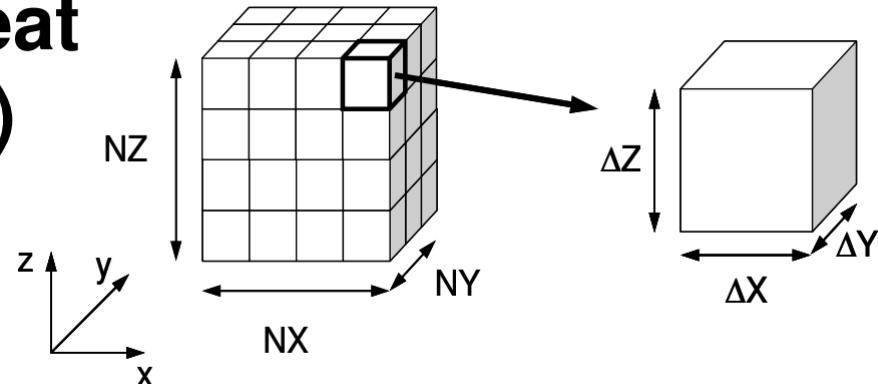
- 7-point Stencil
- Heterogenous Material Property



# P3D: Steady State 3D Heat Conduction by FVM (1/2)

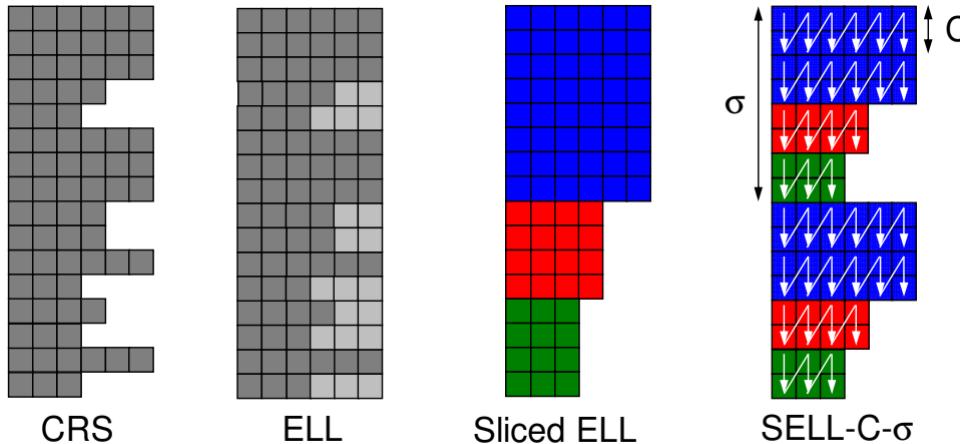
$$\nabla \cdot (\lambda \nabla \phi) + f = 0$$

- 7-point Stencil
- **Heterogenous Material Property**
  - $\lambda_1/\lambda_2$  is proportional to the condition number of coefficient matrices
- **Coefficient Matrix**
  - Sparse, SPD
- **ICCG Solver**
- **Fortran 90 + OpenMP**
- **CM-RCM Reordering**



# P3D: Steady State 3D Heat Conduction by FVM (2/2)

- Various Configurations
  - FP64 (Double), FP32 (Single), FP16 (Half) (just for preconditioning)
  - Matrix Storage Format (CRS, ELL, SELL-C- $\sigma$  etc.)

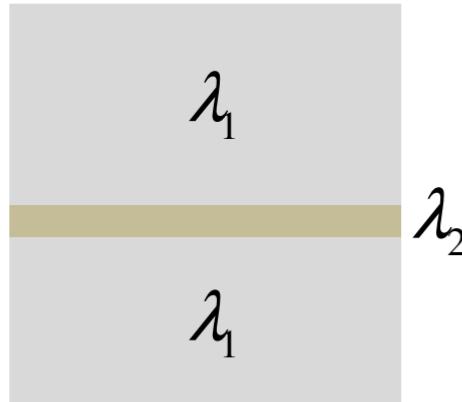


# Ratio of FP32(SP)/FP64(DP): CRS

Iterations ● & Time △ for ICCG

$\lambda_1/\lambda_2$ , 128<sup>3</sup> DOF, CRS

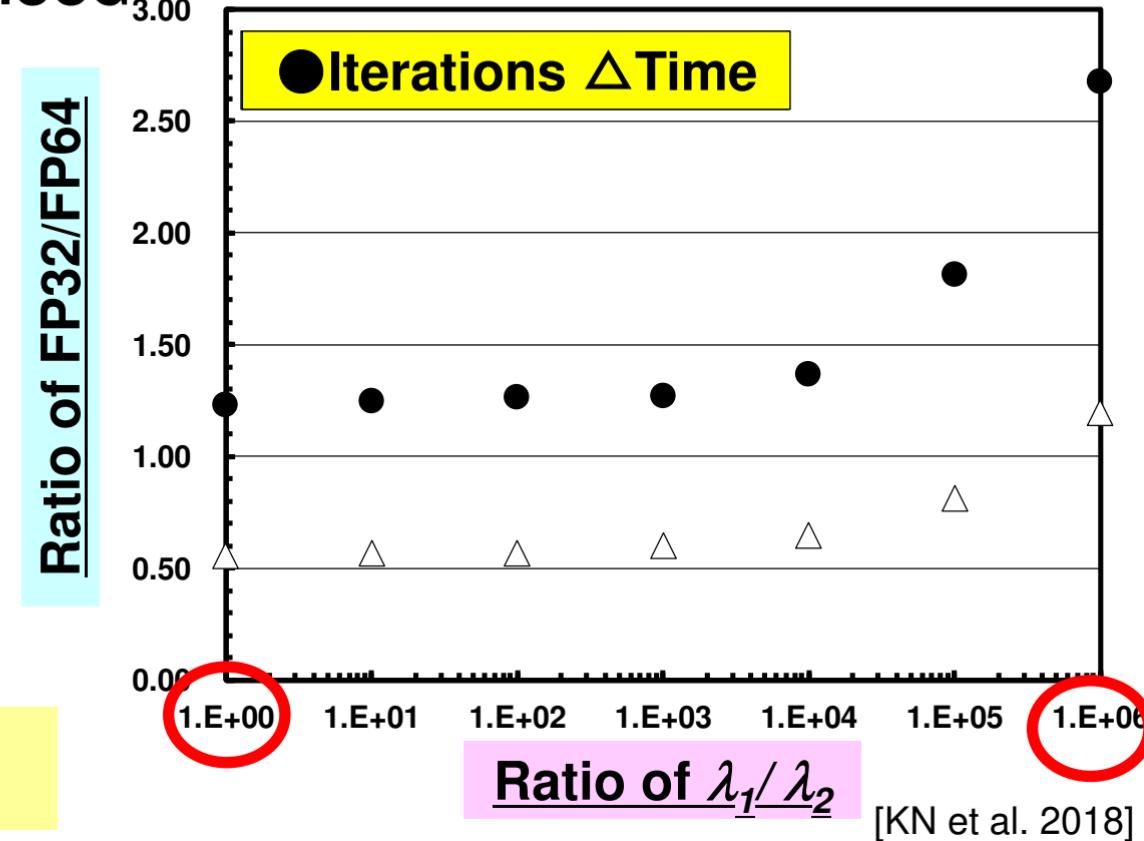
Ratio<1 ⇒ FP32 is faster



$$\nabla \cdot (\lambda \nabla \phi) + f = 0$$

Intel Xeon BDW

1 Node: 18 cores x 2 soc's

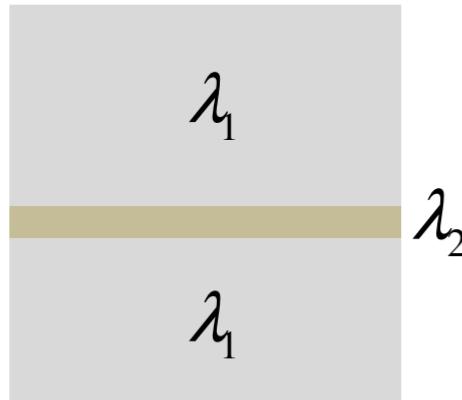


# Ratio of FP32(SP)/FP64(DP) : CRS

Iterations ● & Time △ for ICCG<sub>3.00</sub>

$\lambda_1/\lambda_2$ , 128<sup>3</sup> DOF, CRS

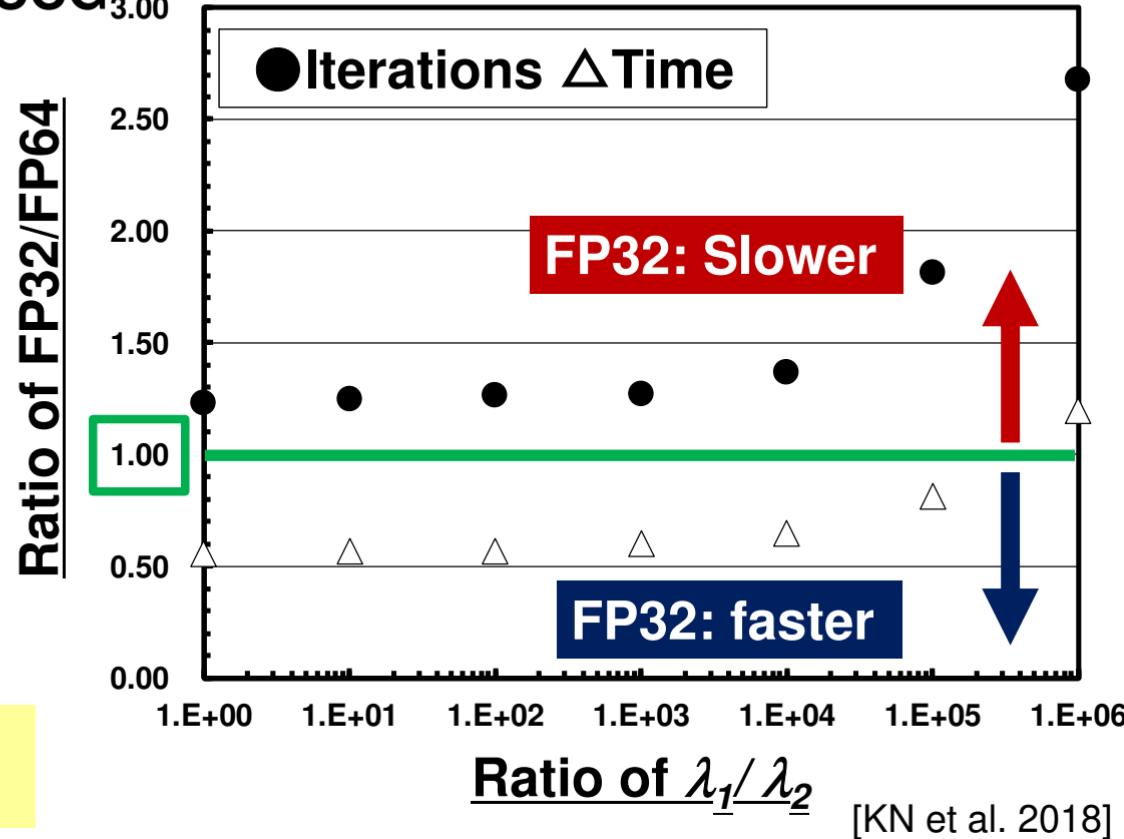
Ratio<1  $\Rightarrow$  FP32 is faster



$$\nabla \cdot (\lambda \nabla \phi) + f = 0$$

Intel Xeon BDW

1 Node: 18 cores x 2 soc's



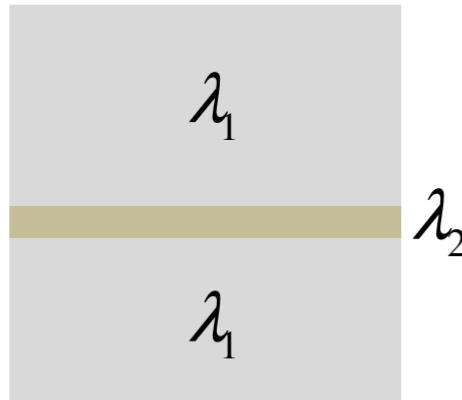
[KN et al. 2018]

# Ratio of FP32(SP)/FP64(DP) : CRS

Iterations ● & Time △ for ICCG<sub>3.00</sub>

$\lambda_1/\lambda_2$ , 128<sup>3</sup> DOF, CRS

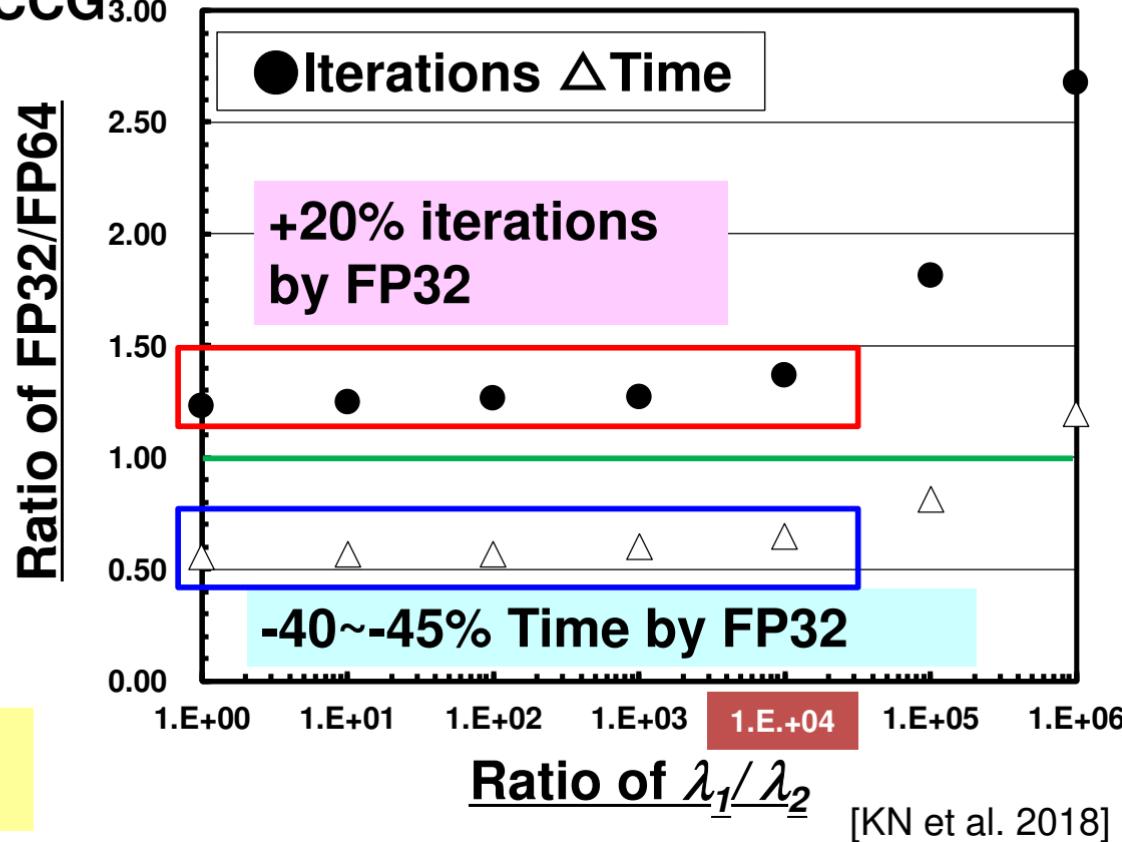
Ratio<1  $\Rightarrow$  FP32 is faster



$$\nabla \cdot (\lambda \nabla \phi) + f = 0$$

Intel Xeon BDW

1 Node: 18 cores x 2 soc's

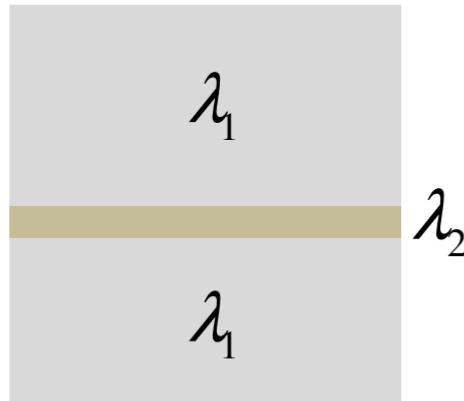


# Ratio of FP32(SP)/FP64(DP) : CRS

Iterations ● & Time △ for ICCG<sub>3.00</sub>

$\lambda_1/\lambda_2$ , 128<sup>3</sup> DOF, CRS

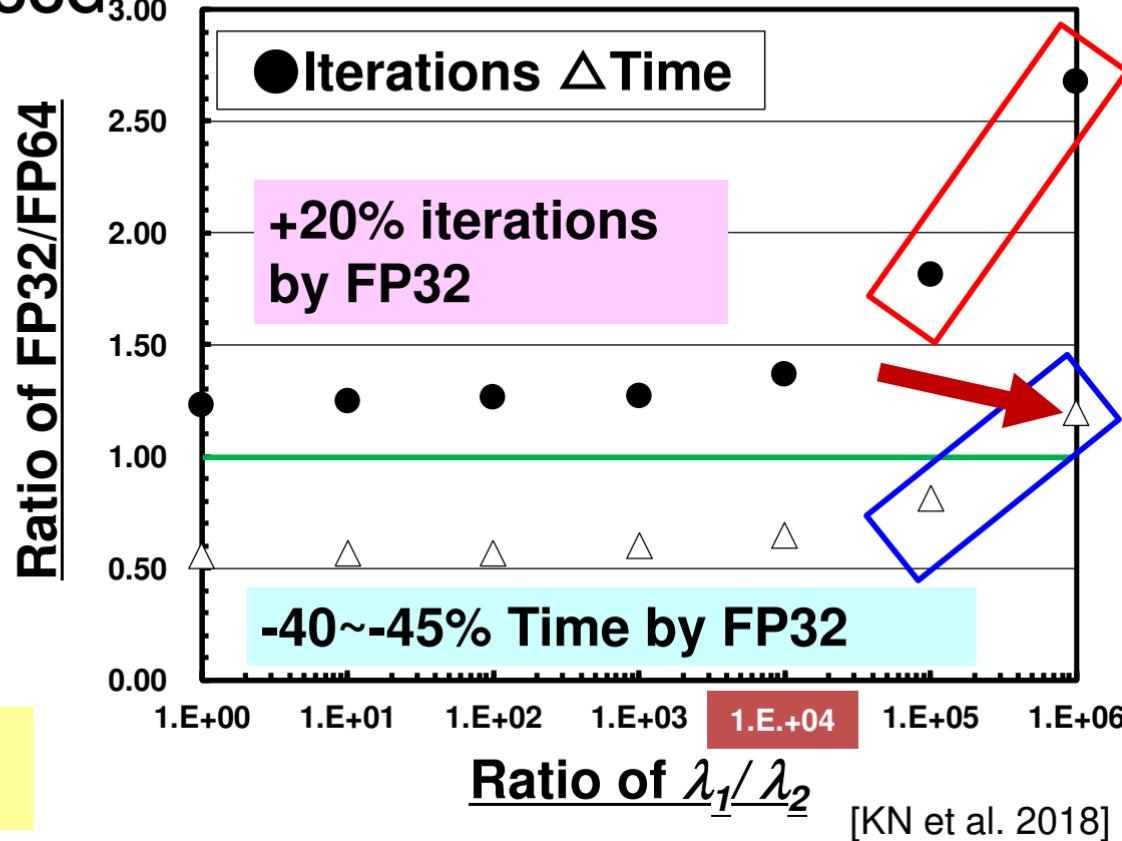
Ratio<1 ⇒ FP32 is faster



$$\nabla \cdot (\lambda \nabla \phi) + f = 0$$

Intel Xeon BDW

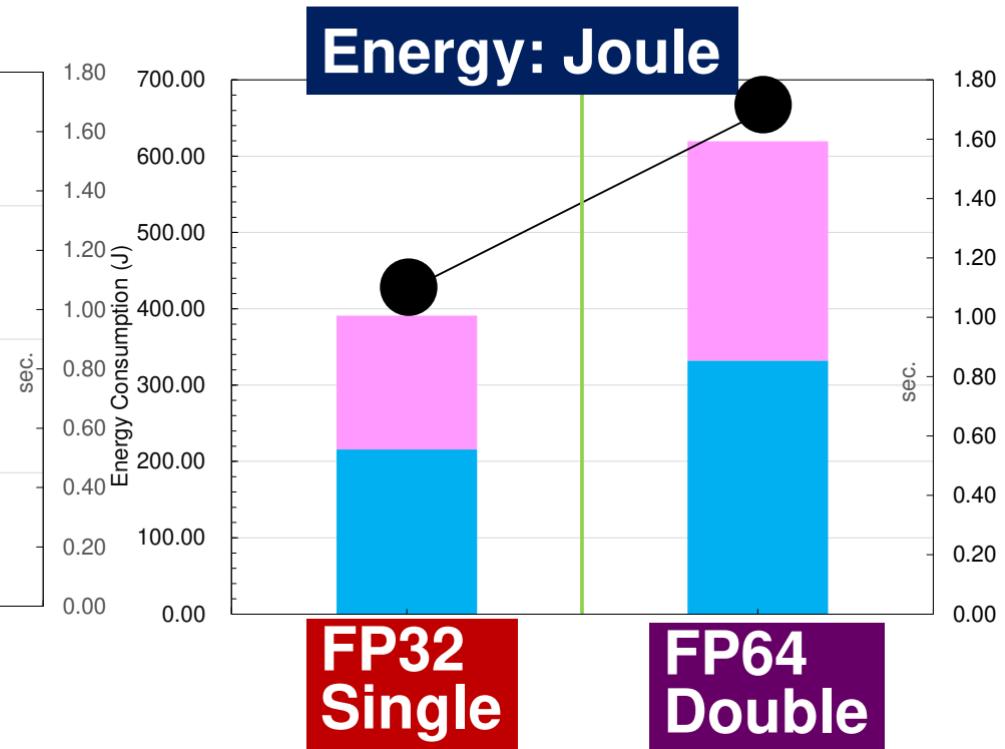
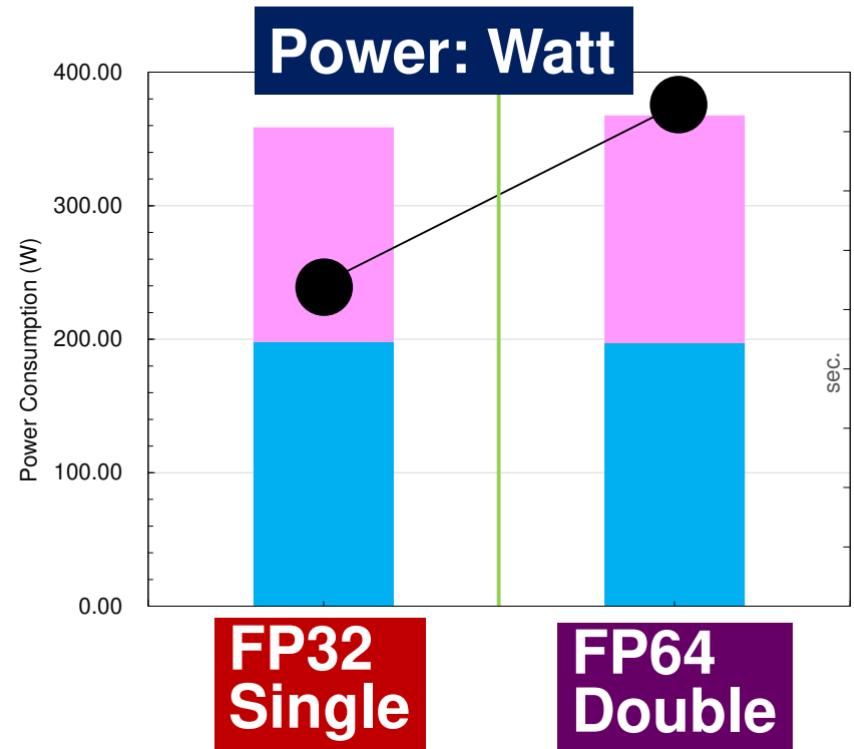
1 Node: 18 cores x 2 soc's



# Results on Intel Xeon BDW $\lambda_1 = \lambda_2$

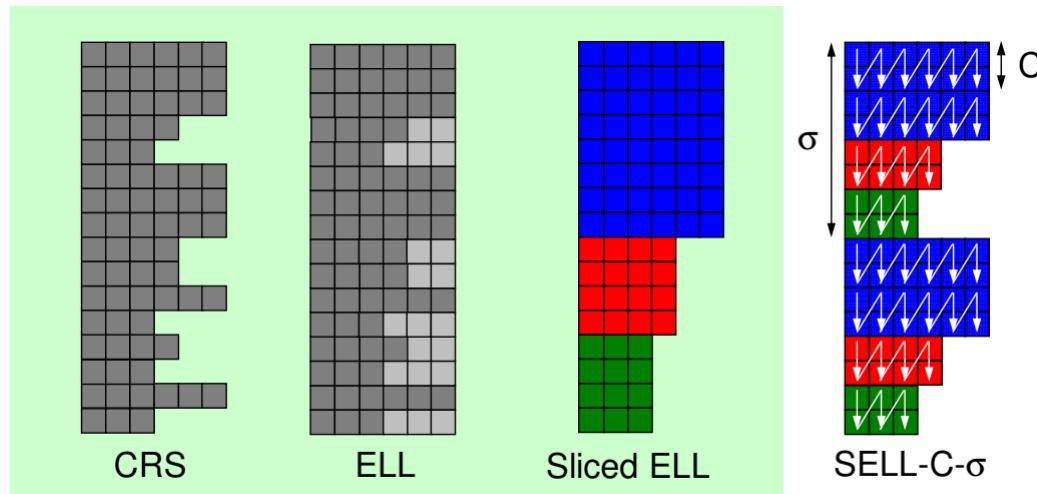
[Sakamoto et al. 2020]

$N=128^3$ , ■: CPU, ■: Memory, ●: Time



# P3D: Steady State 3D Heat Conduction by FVM (2/2)

- Various Configurations
  - FP64 (Double), FP32 (Single), FP16 (Half) (just for preconditioning)
  - Matrix Storage Format (CRS, ELL, SELL-C- $\sigma$  etc.)

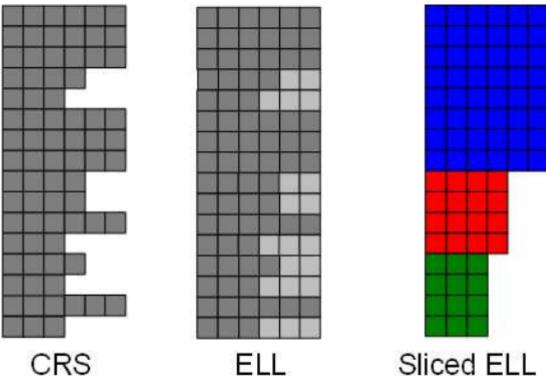


System	Oakforest-PACS	Oakbridge-CX	Oakleaf-7 (FX700)
Abbreviation	OFP	OBCX	OL7
Architecture of CPU	Intel Xeon Phi 7250 (Knights Landing, KNL)	Intel Xeon Platinum 8280 (Cascade Lake, CLX)	Fujitsu A64FX(1.8GHz)
Core#/Socket	68	28	48
Socket#/Node	1	2	1
Peak Performance (DP) (GFLOPS)/Node	3,046	4,838	2,765
Memory Capacity (GB)/Node	MCDRAM: 16 DDR4: 96	192	32
Memory Bandwidth (GB/sec), Stream Triad	MCDRAM: 490 DDR4: 84.5	202	809
Compiler	Intel Parallel Studio 2019		Fujitsu FCC 4.0.0

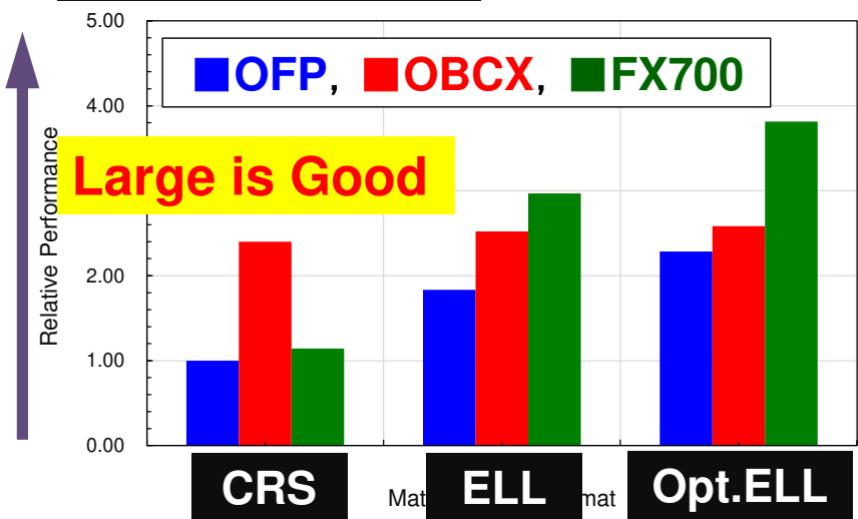
# Ratio of Performance

Elapsed Computation Time for ICCG (DP),  
Normalized by OFP with CRS,  $\lambda_1 / \lambda_2 = 1$

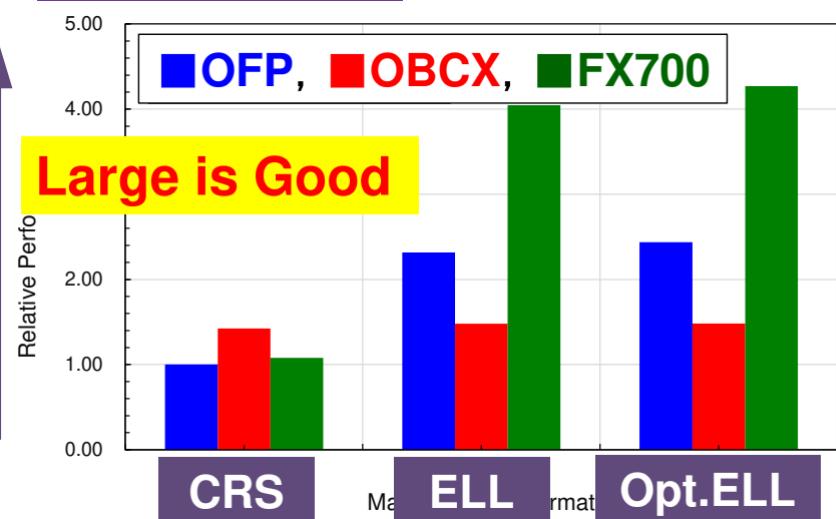
[KN et al. SWoPP 2020]



Medium :  $128^3$



Large :  $256^3$



# Mixed Precision Computing of ICCG Solver for P3D on FX700

	SpMV, DAXPY, Dot Products	Preconditioning	Vectors for Preconditioning
D-D	FP64	FP64	FP64
D-S	FP64	FP32	FP32
D-H	FP64	FP16	FP32
S-S	FP32	FP32	FP32
S-H	FP32	FP16	FP32

# Mixed Precision Computing for P3D on FX700

## Implementation of Forward Substitution (CRS) in ICCG

[KN et al. SWoPP 2020]

**FP64**  
**FP32**  
**FP16**

```

!$omp parallel do private(ip, i)
do ip= 1, PEsmptOT
do i= SMPindex((ip-1)*NCOLORtot)+1, SMPindex(ip*NCOLORtot)
    Ws(i, Z)= W(i, R)
endo
endo

!$omp parallel private(ic, ip, ip1, i, WVALs, k)
do ic= 1, NCOLORtot
!$omp do
    do ip= 1, PEsmptOT
        ip1= (ip-1)*NCOLORtot + ic
        do i= SMPindex(ip1-1)+1, SMPindex(ip1)
            WVALs= Ws(i, Z)
            do k= indexL(i-1)+1, indexL(i)
                WVALs= WVALs - ALs(k) * Ws(itemL(k), Z)
            enddo
            Ws(i, Z)= WVALs * Ws(i, DD)
        enddo
    enddo
!$omp end parallel

(Backward Substitution)

!$omp parallel do private(ip, i)
do ip= 1, PEsmptOT
do i= SMPindex((ip-1)*NCOLORtot)+1, SMPindex(ip*NCOLORtot)
    W(I, Z)= Ws(i, Z)
endo
endo

```

**D-S**

```

!$omp parallel do private(ip, i)
do ip= 1, PEsmptOT
do i= SMPindex((ip-1)*NCOLORtot)+1, SMPindex(ip*NCOLORtot)
    Ws(i, Z)= Ws(i, R)
endo
endo

!$omp parallel private(ic, ip, ip1, i, WVALs, k)
do ic= 1, NCOLORtot
!$omp do
    do ip= 1, PEsmptOT
        ip1= (ip-1)*NCOLORtot + ic
        do i= SMPindex(ip1-1)+1, SMPindex(ip1)
            WVALs= Ws(i, Z)
            do k= indexL(i-1)+1, indexL(i)
                WVALs= WVALs - ALh(k) * Ws(itemL(k), Z)
            enddo
            Ws(i, Z)= WVALs * Wh(i, DD)
        enddo
    enddo
!$omp end parallel

```

**S-H**

```

!$omp parallel do private(ip, i)
do ip= 1, PEsmptOT
do i= SMPindex((ip-1)*NCOLORtot)+1, SMPindex(ip*NCOLORtot)
    Ws(i, Z)= W(i, R)
endo
endo

!$omp parallel private(ic, ip, ip1, i, WVALs, k)
do ic= 1, NCOLORtot
!$omp do
    do ip= 1, PEsmptOT
        ip1= (ip-1)*NCOLORtot + ic
        do i= SMPindex(ip1-1)+1, SMPindex(ip1)
            WVALs= Ws(i, Z)
            do k= indexL(i-1)+1, indexL(i)
                WVALs= WVALs - ALh(k) * Ws(itemL(k), Z)
            enddo
            Ws(i, Z)= WVALs * Wh(i, DD)
        enddo
    enddo
!$omp end parallel

```

**D-H**

```

!$omp parallel do private(ip, i)
do ip= 1, PEsmptOT
do i= SMPindex((ip-1)*NCOLORtot)+1, SMPindex(ip*NCOLORtot)
    Ws(i, Z)= W(i, R)
endo
endo

!$omp parallel private(ic, ip, ip1, i, WVALs, k)
do ic= 1, NCOLORtot
!$omp do
    do ip= 1, PEsmptOT
        ip1= (ip-1)*NCOLORtot + ic
        do i= SMPindex(ip1-1)+1, SMPindex(ip1)
            WVALs= Ws(i, Z)
            do k= indexL(i-1)+1, indexL(i)
                WVALs= WVALs - ALh(k) * Ws(itemL(k), Z)
            enddo
            Ws(i, Z)= WVALs * Wh(i, DD)
        enddo
    enddo
!$omp end parallel

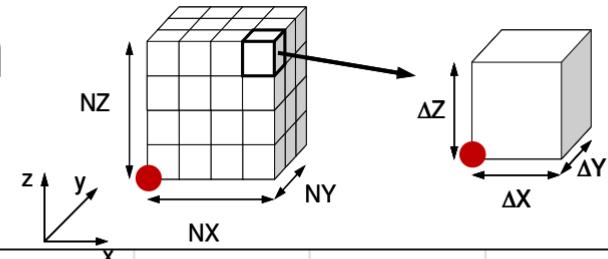
(Backward Substitution)

!$omp parallel do private(ip, i)
do ip= 1, PEsmptOT
do i= SMPindex((ip-1)*NCOLORtot)+1, SMPindex(ip*NCOLORtot)
    W(I, Z)= Ws(i, Z)
endo
endo

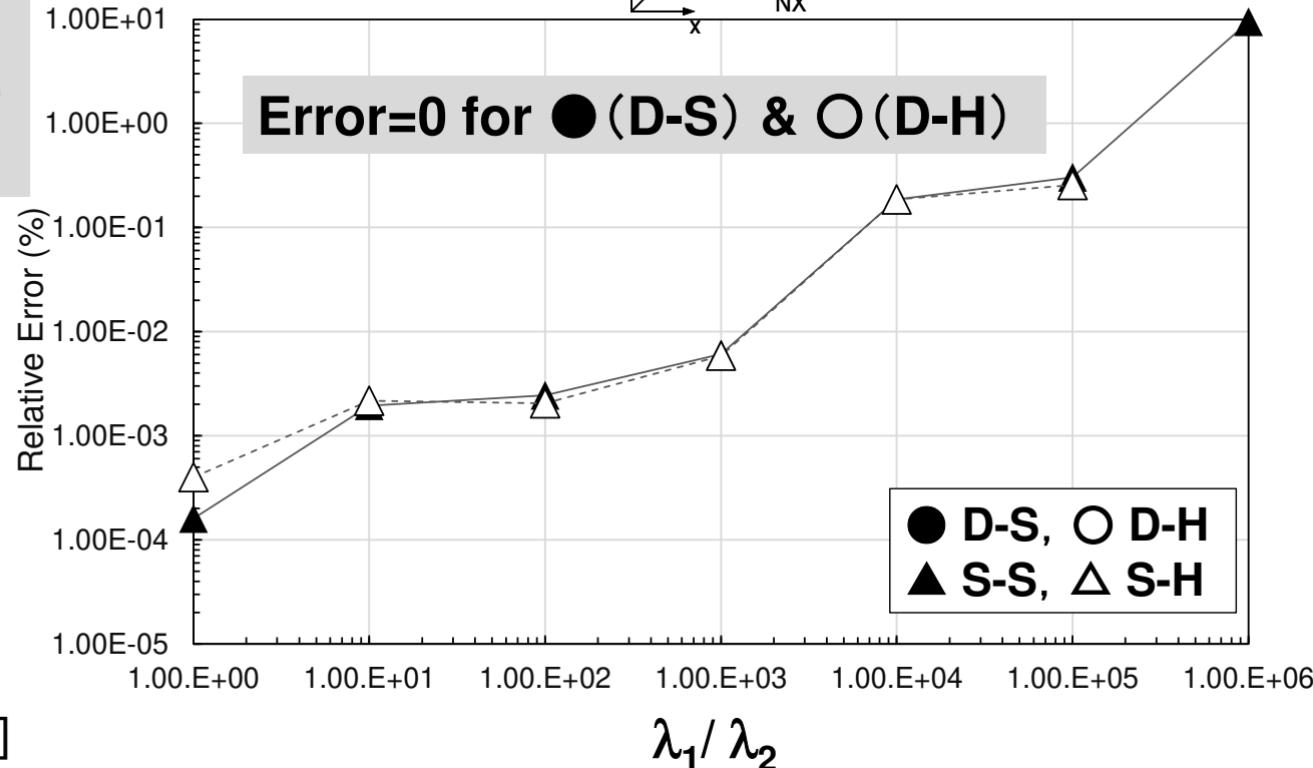
```

# Mixed Precision Computation

D-H/S-H do not converge at  $\lambda_1 / \lambda_2 = 10^6$



**Relative Error (%) compared to D-D @ ●**



# Mixed Precision Computation

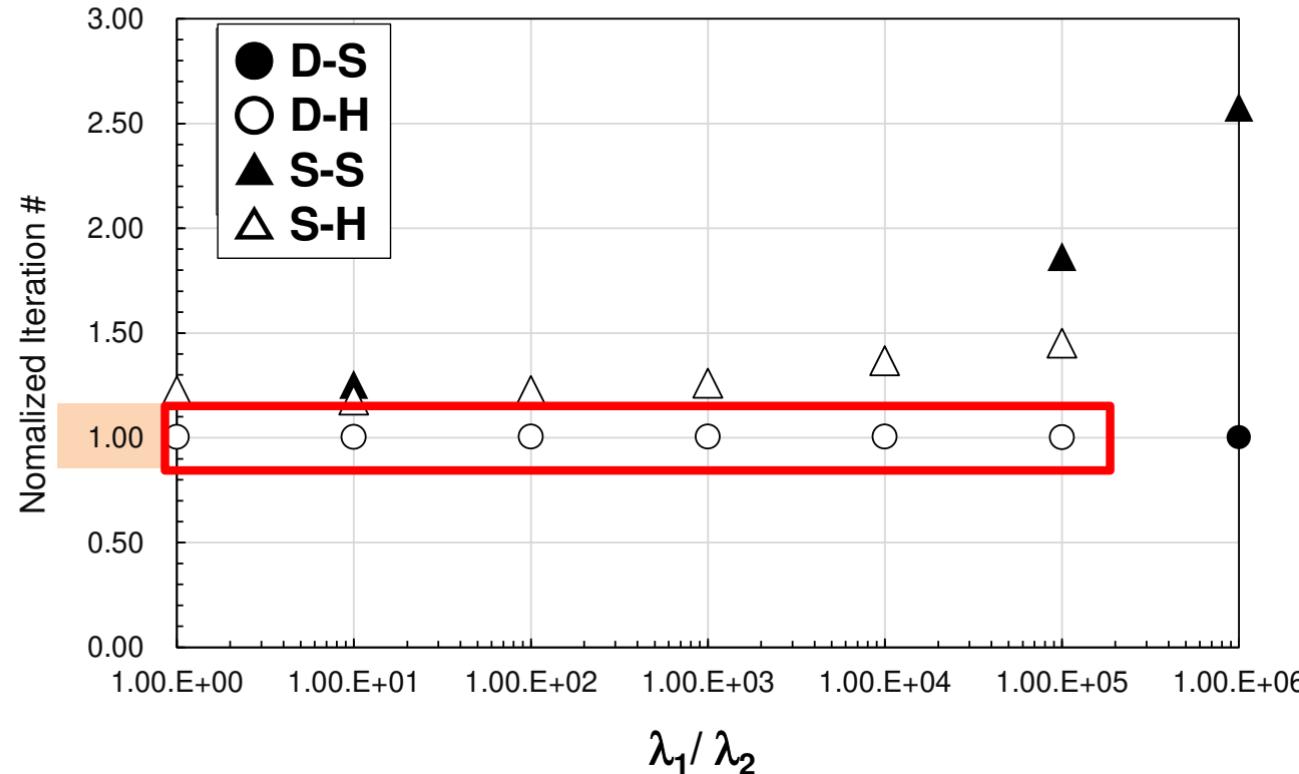
[KN et al. SWoPP 2020]

D-H/S-H do not converge at  $\lambda_1 / \lambda_2 = 10^6$

**Number of Iterations (Normalized by that of D-D)**

● ~ ○ ~ D-D, ▲ ~ △

**Results of (D-S, D-H) agree with those of D-D (if  $\lambda_1 / \lambda_2 \leq 10^5$ )**



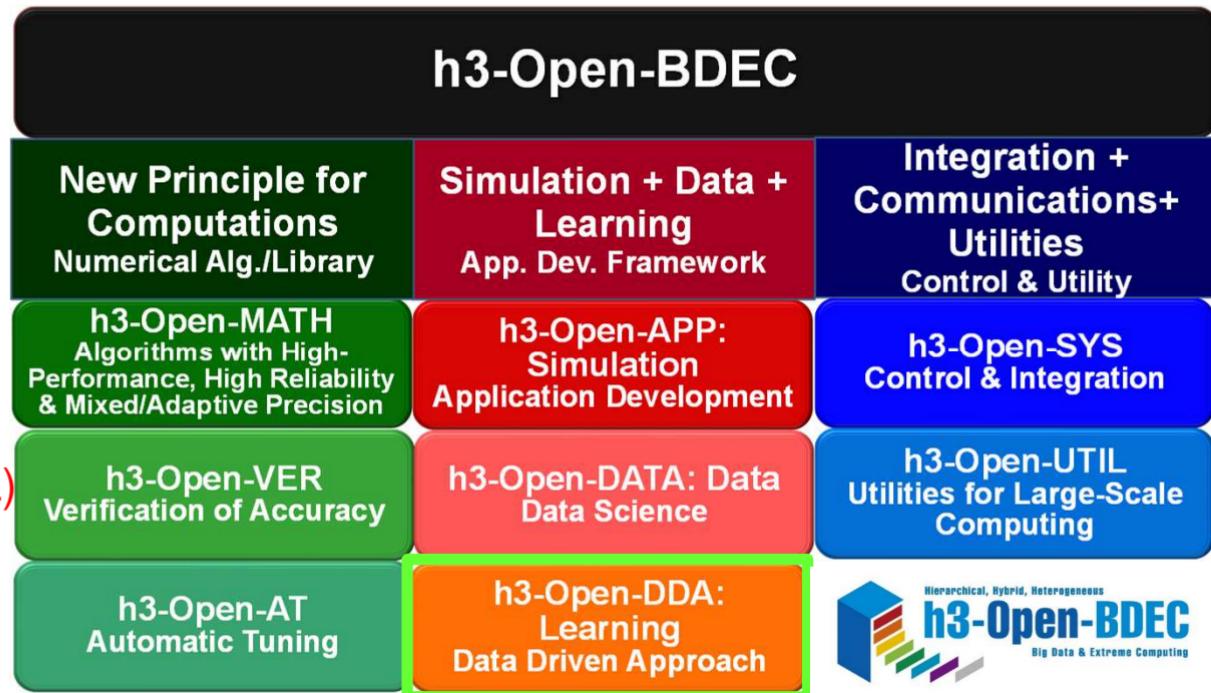
# h3-Open-BDEC: Two Significant Innovations

① Methods for Numerical Analysis with High-Performance/High-Reliability/Power-Saving based on the New Principle of Computing by

- ✓ Adaptive Precision
- ✓ Accuracy Verification
- ✓ Automatic Tuning

② Hierarchical Data Driven Approach (*hDDA*) based on machine learning

- ✓ Integration of (S+D+L)  
AI for HPC



# Real-World Scientific Simulations

- Non-Linear: Huge Number of Parameter Studies needed
  - ✓ Reduction of cases is very crucial

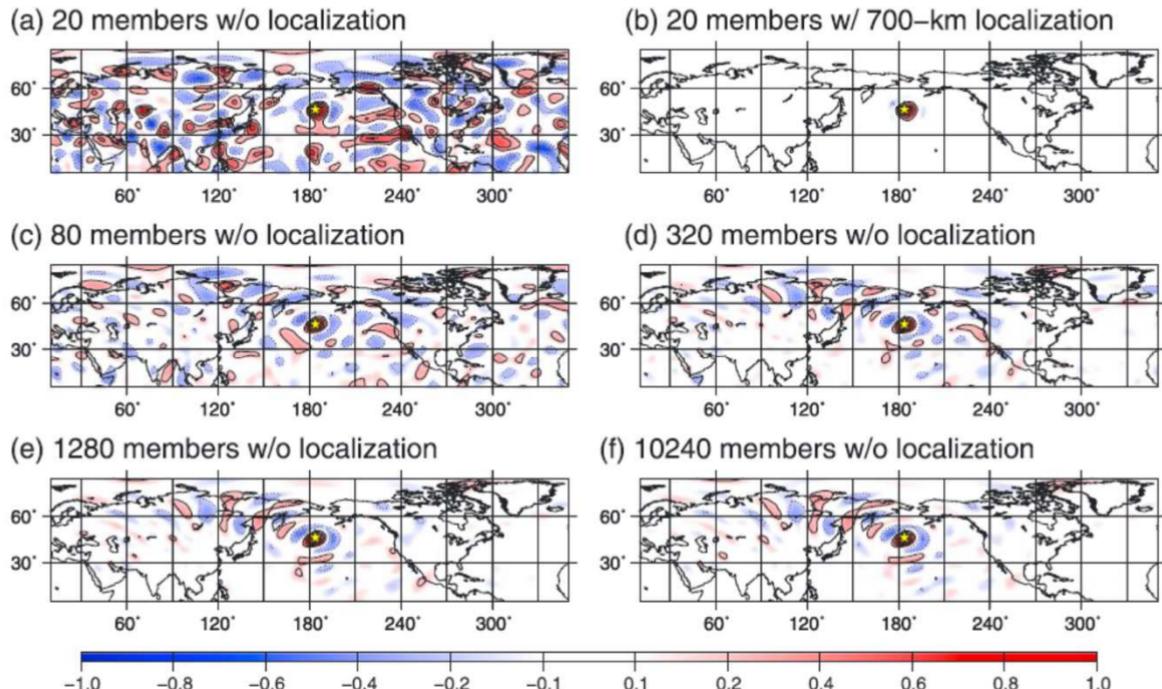
# Real-World Scientific Simulations

- Non-Linear: Huge Number of Parameter Studies needed
  - ✓ Reduction of cases is very crucial

## • Data Assimilation

- ✓ Mid-Range Weather Prediction: 50-100 Ensemble Cases, 1,000 needed for accurate solution.
- ✓ 50-100 (or fewer) may be enough for accurate solution, if opt. parameters are selected (e.g. by ML),

[Miyoshi et al. 2014]

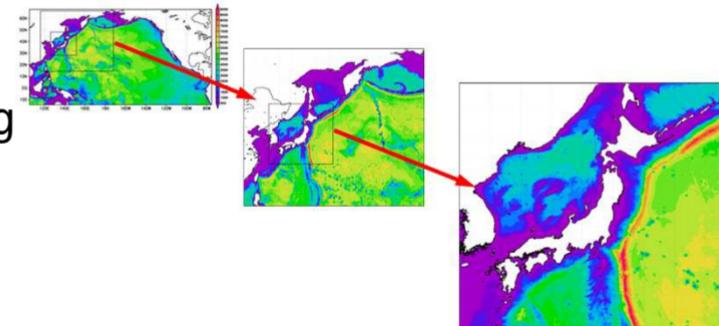


# Hierarchical Data Driven Approach: *hDDA*

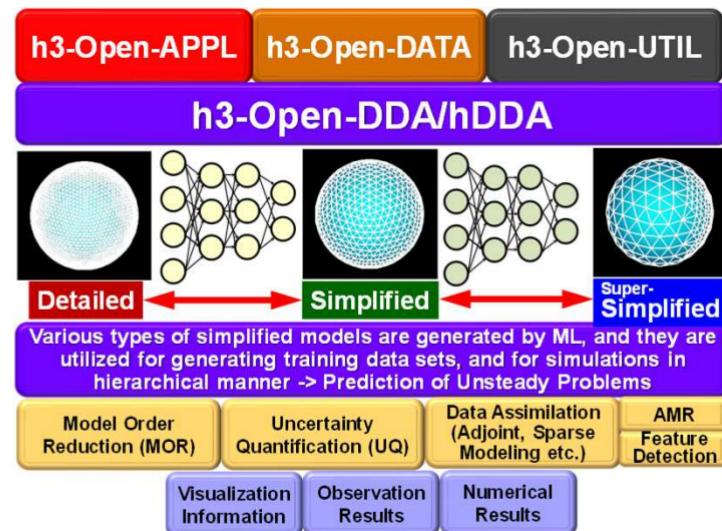
- Data Driven Approach (DDA)
  - Technique of AI/ML is introduced for predicting the results of simulations with different parameters.
  - DDA generally requires  $O(10^3\text{-}10^4)$  runs for generation of training data.

# Hierarchical Data Driven Approach: *hDDA*

- Data Driven Approach (DDA)
  - Technique of AI/ML is introduced for predicting the results of simulations with different parameters.
  - DDA generally requires  $O(10^3\text{-}10^4)$  runs for generation of training data.

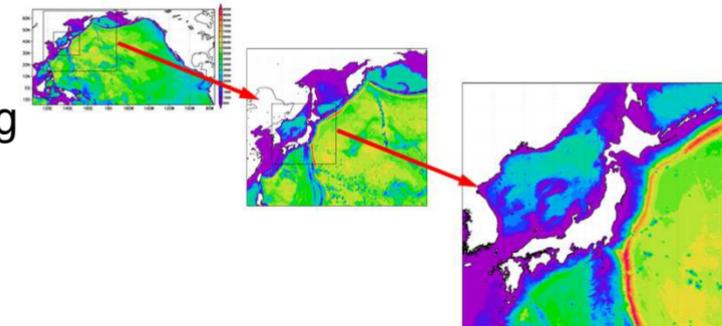


- ***hDDA (Hierarchical DDA)***
  - Simplified models with coarser meshes (but preserving original features of physics) for efficient training are constructed automatically by Machine Learning using:
    - Feature Detection, AMR
    - MOR (Model Order Reduction)
    - UQ (Uncertainty Quantification)
    - Sparse Modeling

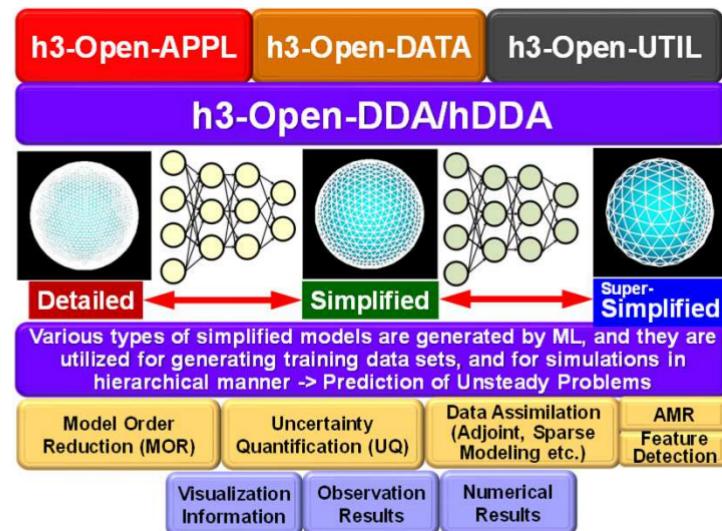


# Hierarchical Data Driven Approach: *hDDA*

- Data Driven Approach (DDA)
  - Technique of AI/ML is introduced for predicting the results of simulations with different parameters.
  - DDA generally requires  $O(10^3\text{-}10^4)$  runs for generation of training data.



- ***hDDA (Hierarchical DDA)***
  - Simplified models with coarser meshes (but preserving original features of physics) for efficient training are constructed automatically by Machine Learning using:
    - Feature Detection, AMR
    - MOR (Model Order Reduction)
    - UQ (Uncertainty Quantification)
    - Sparse Modeling



# Acceleration of Transient CFD Simulations using ML/CNN Integration of (S+D+L), AI for HPC

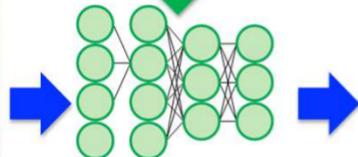
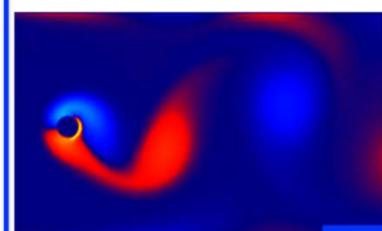


## Datasets

$$f_i(x + c_i \Delta t, t + \Delta t) = f_i(x, t) + \Omega_i(x, t)$$

$$\Omega_i(x, t) = -\frac{1}{\tau} (f_i(x, t) - f_i^{eq}(x, t))$$

## Training



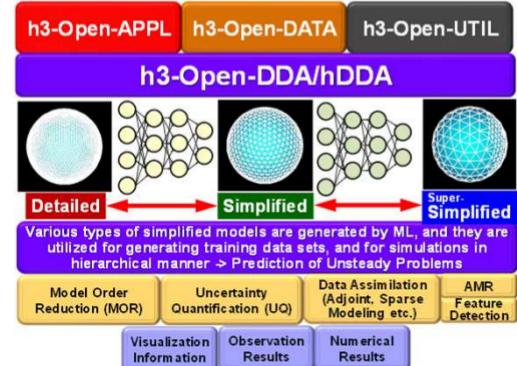
CNN to predict simulation results

## Prediction

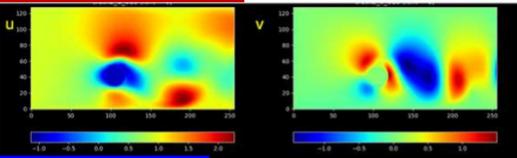
Prediction of the Results  
after 10+ Time Steps ...

Prediction of Time  
Evolution

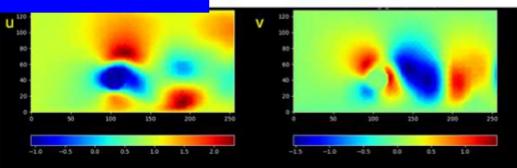
NN may become “faster simulator”



## Simulations: LBM



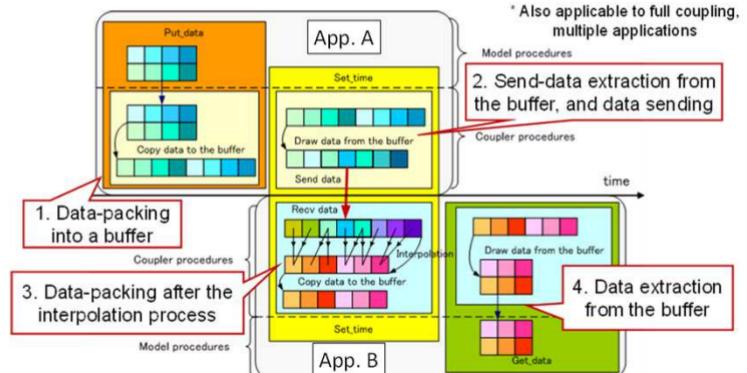
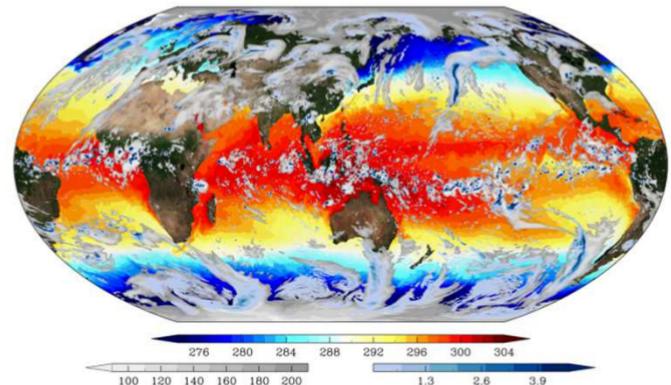
## CNN Predictions



# Possible Applications (S+D+L) on Wisteria/BDEC-01 with h3-Open-BDEC



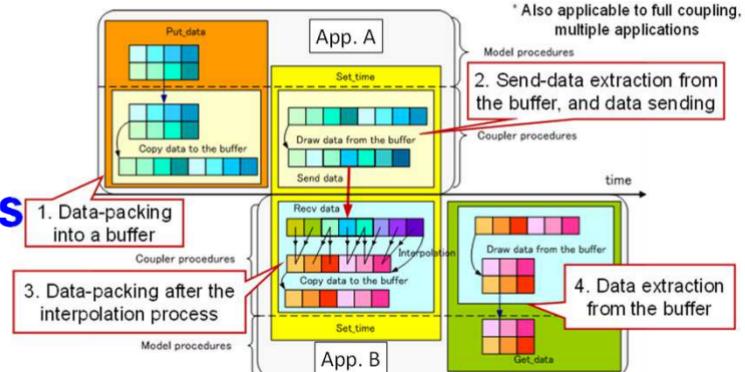
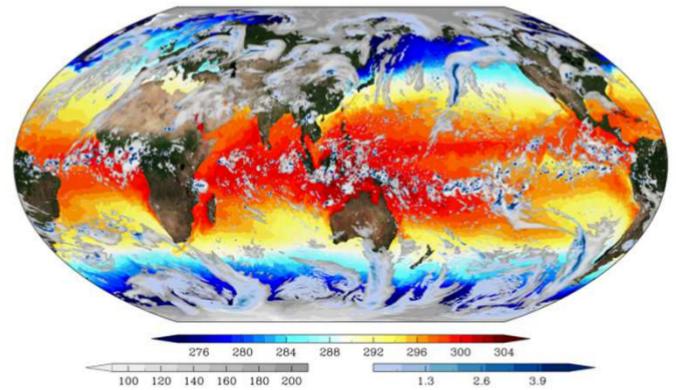
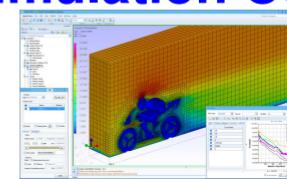
- Simulations with Data Assimilation
  - Very Typical Example of (S+D+L)
- Atmosphere-Ocean Coupling for Weather and Climate Simulations
  - AORI/U.Tokyo, RIKEN R-CCS, NIES

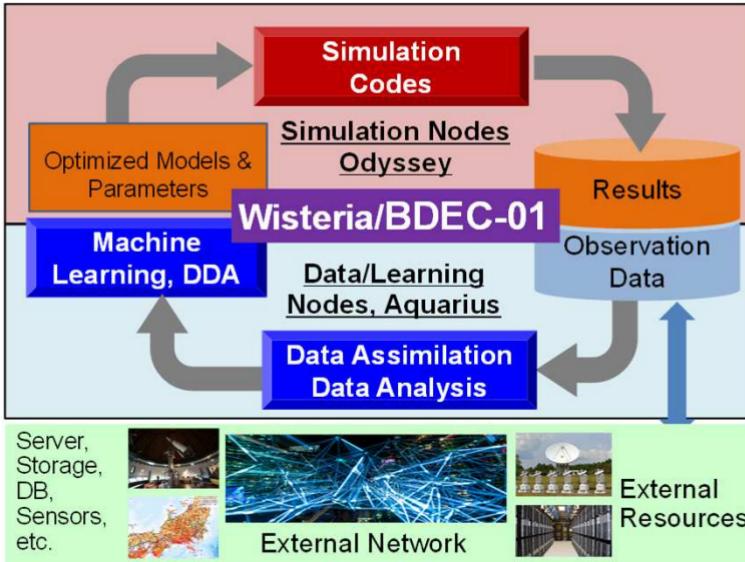


# Possible Applications (S+D+L) on Wisteria/BDEC-01 with h3-Open-BDEC



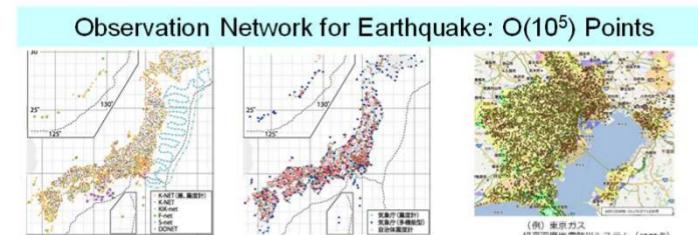
- Simulations with Data Assimilation
  - Very Typical Example of (S+D+L)
- Atmosphere-Ocean Coupling for Weather and Climate Simulations
  - AORI/U.Tokyo, RIKEN R-CCS, NIES
- **Earthquake Simulations with Real-Time Data Assimilation (My Talk on Friday)**
  - ERI/U. Tokyo
- **Real-Time Disaster Simulations**
  - Flood, Tsunami
- **(S+D+L) for Existing Simulation Codes (Open Source SW)**
  - OpenFOAM



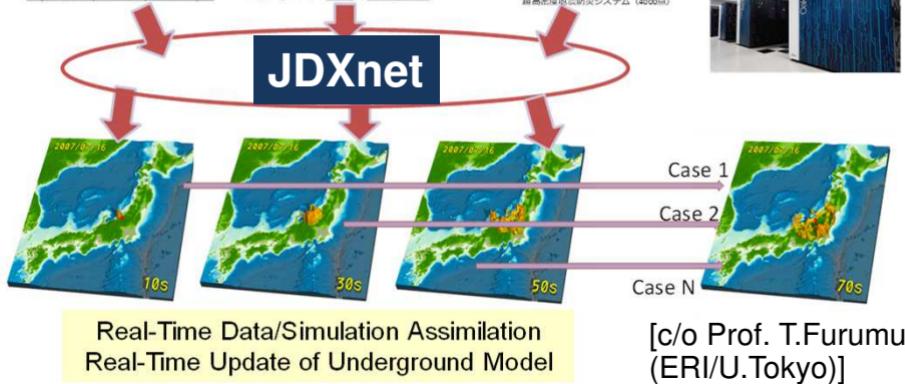


# 3D Earthquake Simulation with Real-Time Data Observation/Assimilation

## Simulation of Strong Motion (Wave Propagation) by 3D FDM



[c/o Furumura]



[c/o Prof. T.Furumura  
(ERI/U.Tokyo)]

# h3-Open-BDEC: Summary

<https://h3-open-bdec.cc.u-tokyo.ac.jp/>



- By Integration of (S+D+L) using **h3-Open-BDEC (Adaptive Precision + hDDA)**, total energy consumption (=total computation time) for simulations will be 10% of that by the conventional methods for simulations with parameter studies

# h3-Open-BDEC: Summary

<https://h3-open-bdec.cc.u-tokyo.ac.jp/>



- By Integration of (S+D+L) using h3-Open-BDEC (Adaptive Precision + hDDA), total energy consumption (=total computation time) for simulations will be 10% of that by the conventional methods for simulations with parameter studies
- **h3-Open-BDEC is the 1st innovative software platform for integration of (S+D+L) on Exascale systems, where computational scientists can achieve such integration without supports by experts in data analytics and AI/ML.**
- **Source codes and documents (in English) are open to public for various kinds of computational environments.**

# International Workshop on the Integration of (Simulation + Data + Learning): Towards Society 5.0 by h3-Open-BDEC

Towards the end of Moore's law, we need to develop new algorithms and applications. We are developing h3-Open-BDEC, which is innovative software for sustainable promotion of scientific discovery by supercomputers in the Exascale Era by combining (Simulation + Data + Learning (S+D+L)), where ideas of data science and machine learning are introduced to computational science. Integration of (S+D+L) is also important for realization of Society 5.0, which is a "Super Smart and Human-centered Society" by digital innovation, such as IoT, Big Data, AI etc., and by integration of cyber-space (digital/virtual space) and physical-space (real space). The h3-Open-BDEC project is funded by Japanese Government via JSPS Grant-in-Aid for Scientific Research (S) (Leading PI: Kengo Nakajima, the University of Tokyo, 19H05662) since 2019. In this workshop, we would like to report our progress of research and development in recent 2.5 years. While there are talks by Co-PI's and members of the project, we have 6 excellent invited talks from Japan, Taiwan, USA and Germany. All members of the project are happy to welcome all participants, and would like to discuss on various aspects of integration of (S+D+L). Please enjoy this two-day online event.

	JST: Japan	CTT: Taiwan	CET: Germany	EST: Atlanta	PST: Berkeley	Speaker
<b>Session-1</b>  <b>Adaptive Precision, AT &amp; Verification (I)</b>	0800-0830, Nov30	0700-0730, Nov30	0000-0030, Nov30	1800-1830, Nov29	1500-1530, Nov29	Kengo Nakajima (U.Tokyo): Overview
	0830-0850	0730-0750	0030-0050	1830-1850	1530-1550	Takeshi Iwashita (Hokkaido U.)
	0850-0910	0750-0810	0050-0110	1850-1910	1650-1710	Masatoshi Kawai (U.Tokyo)
	<b>0910-0950</b>	<b>0810-0850</b>	<b>0110-0150</b>	<b>1910-1950</b>	<b>1710-1750</b>	<b>Rich Vuduc (Georgia Tech)</b>
<b>Session-2</b>  <b>Integration of (S+D+L) (I)</b>	<b>1600-1640, Nov30</b>	<b>1500-1540, Nov30</b>	<b>0800-0840, Nov30</b>	<b>0200-0240, Nov30</b>	<b>2300-2340, Nov29</b>	<b>Kento Sato (RIKEN)</b>
	1640-1700	1540-1600	0840-0900	0240-0300	2340-2400	Takashi Shimokawabe (U.Tokyo)
	1700-1720	1600-1620	0900-0920	0300-0320	2400-2420	Hayato Shiba (U.Tokyo)
	<b>1720-1800</b>	<b>1620-1700</b>	<b>0920-1000</b>	<b>0320-0400</b>	<b>2420-2500</b>	<b>Weichung Wang (National Taiwan U)</b>
<b>Session-3</b>  <b>Adaptive Precision, AT &amp; Verification (II)</b>	JST: Japan	CTT: Taiwan	CET: Germany	EST: Atlanta	PST: Berkeley	Speaker
	<b>0800-0840, Dec03</b>	<b>0700-0740, Dec03</b>	<b>0000-0040, Dec03</b>	<b>1800-1840, Dec02</b>	<b>1500-1540, Dec02</b>	<b>Osni Marques (LBNL)</b>
	0840-0900	0740-0800	0040-0100	1840-1900	1540-1600	Takahiro Katagiri (Nagoya U.)
	0900-0920	0800-0820	0100-0120	1900-1920	1600-1620	Takeshi Ogita (TWCU)
	<b>0920-0940</b>	<b>0820-0840</b>	<b>0120-0140</b>	<b>1920-1940</b>	<b>1620-1640</b>	<b>Takeshi Fukaya (Hokkaido U.)</b>
	<b>0940-1020</b>	<b>0840-0920</b>	<b>0140-0220</b>	<b>1940-2020</b>	<b>1640-1720</b>	<b>Discussions on Computing by Low/Adaptive Precision</b>
<b>Session-4</b>  <b>Integration of (S+D+L) (II)</b>	<b>1600-1640, Dec03</b>	<b>1500-1540, Dec03</b>	<b>0800-0840, Dec03</b>	<b>0200-0240, Dec03</b>	<b>2300-0340, Dec02</b>	<b>Gerhard Wellein (FAU Erlangen)</b>
	1640-1700	1540-1600	0840-0900	0240-0300	2340-2400	Kengo Nakajima (U.Tokyo): Earthquake
	1700-1720	1600-1620	0900-0920	0300-0320	2400-2420	Hiromichi Nagao (U.Tokyo)
	1720-1740	1620-1640	0920-0940	0320-0340	2420-2440	Hisashi Yashiro (NIES, Japan)
	1740-1800	1640-1700	0940-1000	0340-0400	2440-2500	Hiroya Matsuba (U.Tokyo)
	1800-1810	1700-1710	1000-1010	0400-0410	2500-2510	Closing

	JST: Japan	CTT: Taiwan	CET: Germany	EST: Atlanta	PST: Berkeley	Speaker
<b>Session-1</b>  <b>Adaptive Precision, AT &amp; Verification (I)</b>	0800-0830, Nov30	0700-0730, Nov30	0000-0030, Nov30	1800-1830, Nov29	1500-1530, Nov29	Kengo Nakajima (U.Tokyo): Overview
	0830-0850	0730-0750	0030-0050	1830-1850	1530-1550	Takeshi Iwashita (Hokkaido U.)
	0850-0910	0750-0810	0050-0110	1850-1910	1650-1710	Masatoshi Kawai (U.Tokyo)
	0910-0950	0810-0850	0110-0150	1910-1950	1710-1750	Rich Vuduc (Georgia Tech)
<b>Session-2</b>  <b>Integration of (S+D+L) (I)</b>	1600-1640, Nov30	1500-1540, Nov30	0800-0840, Nov30	0200-0240, Nov30	2300-2340, Nov29	Kento Sato (RIKEN)
	1640-1700	1540-1600	0840-0900	0240-0300	2340-2400	Takashi Shimokawabe (U.Tokyo)
	1700-1720	1600-1620	0900-0920	0300-0320	2400-2420	Hayato Shiba (U.Tokyo)
	1720-1800	1620-1700	0920-1000	0320-0400	2420-2500	Weichung Wang (National Taiwan U)
<b>Session-3</b>  <b>Adaptive Precision, AT &amp; Verification (II)</b>	JST: Japan	CTT: Taiwan	CET: Germany	EST: Atlanta	PST: Berkeley	Speaker
	0800-0840, Dec03	0700-0800	0800-0900	0800-0900	0800-0900	Yannick Marques (LBNL)
	0840-0900	0740-0840	0840-0920	0840-0940	0840-0940	Naohiro Katagiri (Nagoya U.)
	0900-0920	0800-0900	0900-0920	0900-0940	0900-0940	Takeshi Ogita (TWCU)
	0920-0940	0840-0920	0920-0940	0920-0940	0920-0940	Takeshi Fukaya (Hokkaido U.)
<b>Session-4</b>  <b>Integration of (S+D+L) (II)</b>	0940-1020	0840-0940	0940-1020	0940-1020	0940-1020	Discussions on Computing by Low/Adaptive Decision
	1600-1640, Dec03	1500-1600	1600-1640	1600-1640	1600-1640	Gerhard Wellein (FAU Erlangen)
	1640-1700	1540-1600	1640-1700	1640-1700	1640-1700	Kengo Nakajima (U.Tokyo): Earthquake
	1700-1720	1600-1620	1700-1720	1700-1720	1700-1720	Tomichi Nagao (U.Tokyo)
	1720-1740	1620-1700	1720-1740	1720-1740	1720-1740	Sashi Yashiro (NIES, Japan)
	1740-1800	1640-1720	1740-1800	1740-1800	1740-1800	Yooya Matsuba (U.Tokyo)
	1800-1810	1700-1710	1800-1810	1800-1810	1800-1810	Closing

## h3-Open-BDEC

**New Principle for Computations  
Numerical Alg./Library**

**h3-Open-MATH**  
Algorithms with High-Performance, High Reliability & Mixed/Adaptive Precision

**h3-Open-VER**  
Verification of Accuracy

**h3-Open-AT**  
Automatic Tuning

**Simulation + Data + Learning**  
App. Dev. Framework

**h3-Open-APP:**  
Simulation Application Development

**h3-Open-DATA:**  
Data Data Science

**h3-Open-DDA:**  
Learning Data Driven Approach

**Integration + Communications+**  
Utilities Control & Utility

**h3-Open-SYS**  
Control & Integration

**h3-Open-UTIL**  
Utilities for Large-Scale Computing



	JST: Japan	CTT: Taiwan	CET: Germany	EST: Atlanta	PST: Berkeley	Speaker
<b>Session-1</b> <b>Adaptive Precision, AT &amp; Verification (I)</b>	0800-0830, Nov30	0700-0730, Nov30	0000-0030, Nov30	1800-1830, Nov29	1500-1530, Nov29	Kengo Nakajima (U.Tokyo): Overview
	0830-0850	0730-0750	0030-0050	1830-1850	1530-1550	Takeshi Iwashita (Hokkaido U.)
	0850-0910	0750-0810	0050-0110	1850-1910	1650-1710	Masatoshi Kawai (U.Tokyo)
	0910-0950	0810-0850	0110-0150	1910-1950	1710-1750	Rich Vuduc (Georgia Tech)
<b>Session-2</b> <b>Integration of (S+D+L) (I)</b>	1600-1640, Nov30	1500-1540, Nov30	0800-0840, Nov30	0200-0240, Nov30	2300-2340, Nov29	Kento Sato (RIKEN)
	1640-1700	1540-1600	0840-0900	0240-0300	2340-2400	Takashi Shimokawabe (U.Tokyo)
	1700-1720	1600-1620	0900-0920	0300-0320	2400-2420	Hayato Shiba (U.Tokyo)
	1720-1800	1620-1700	0920-1000	0320-0400	2420-2500	Weichung Wang (National Taiwan U)
<b>Session-3</b> <b>Adaptive Precision, AT &amp; Verification (II)</b>	JST: Japan	CTT: Taiwan	CET: Germany	EST: Atlanta	PST: Berkeley	Speaker
	0800-0840, Dec03	0700-0840	0800-0920	0200-0240	2300-2340	Yannick Marques (LBNL)
	0840-0900	0740-0840	0840-0940	0240-0300	2340-2400	Makahiro Katagiri (Nagoya U.)
	0900-0920	0800-0940	0900-0920	0300-0320	2400-2420	Takeshi Ogita (TWCU)
	0920-0940	0840-0940	0920-0940	0320-0400	2420-2500	Takeshi Fukaya (Hokkaido U.)
	0940-1020	0840-1020	0940-1020	0400-0410	2500-2510	Discussions on Computing by Low/Adaptive Decision
<b>Session-4</b> <b>Integration of (S+D+L) (II)</b>	1600-1640, Dec03	1500-1640	h3-Open-MATH Algorithms with High-Performance, High Reliability & Mixed/Adaptive Precision	Simulation + Data + Learning App. Dev. Framework	Integration + Communications+ Utilities Control & Utility	Ulrich Harder, Michael Wellein (FAU Erlangen)
	1640-1700	1540-1640	h3-Open-VER Verification of Accuracy	h3-Open-APP: Simulation Application Development	h3-Open-SYS Control & Integration	Yusuke Nakajima (U.Tokyo): Earthquake
	1700-1720	1600-1640	h3-Open-DATA: Data Data Science	h3-Open-UTIL Utilities for Large-Scale Computing	h3-Open-UTIL Utilities for Large-Scale Computing	Tomio Nagao (U.Tokyo)
	1720-1740	1620-1640	h3-Open-AT Automatic Tuning	h3-Open-DDA: Learning Data Driven Approach	h3-Open-BDEC Hierarchical, Hybrid, Heterogeneous Big Data & Extreme Computing	Satoshi Yashiro (NIES, Japan)
	1740-1800	1640-1740	h3-Open-AT Automatic Tuning	h3-Open-DDA: Learning Data Driven Approach	h3-Open-BDEC Hierarchical, Hybrid, Heterogeneous Big Data & Extreme Computing	Yohei Matsuba (U.Tokyo)
	1800-1810	1700-1710	1800-1810	0400-0410	2500-2510	Closing

## h3-Open-BDEC

New Principle for Computations  
Numerical Alg./Library

Simulation + Data + Learning  
App. Dev. Framework

Integration + Communications+ Utilities Control & Utility

h3-Open-MATH  
Algorithms with High-Performance, High Reliability & Mixed/Adaptive Precision

h3-Open-APP: Simulation Application Development

h3-Open-SYS  
Control & Integration

h3-Open-VER  
Verification of Accuracy

h3-Open-DATA: Data Data Science

h3-Open-UTIL  
Utilities for Large-Scale Computing

h3-Open-AT  
Automatic Tuning

h3-Open-DDA:  
Learning Data Driven Approach

h3-Open-BDEC  
Hierarchical, Hybrid, Heterogeneous Big Data & Extreme Computing

h3-Open-BDEC						
Session-1	JST: Japan					Speaker
Adaptive Precision, AT & Verification (I)	0800-0830, Nov30	New Principle for Computations Numerical Alg./Library	Simulation + Data + Learning App. Dev. Framework	Integration + Communications+ Utilities Control & Utility	Kengo Nakajima (U.Tokyo): Overview	
	0830-0850	h3-Open-MATH Algorithms with High-Performance, High Reliability & Mixed/Adaptive Precision	h3-Open-APP: Simulation Application Development	h3-Open-SYS Control & Integration	Takeshi Iwashita (Hokkaido U.)	
	0850-0910	h3-Open-VER Verification of Accuracy	h3-Open-DATA: Data Data Science	h3-Open-UTIL Utilities for Large-Scale Computing	Masatoshi Kawai (U.Tokyo)	
	0910-0950				Rich Vuduc (Georgia Tech)	
Session-2	1600-1640, Nov30				Kento Sato (RIKEN)	
	1640-1700				Takashi Shimokawabe (U.Tokyo)	
	1700-1720				Hayato Shiba (U.Tokyo)	
	1720-1800				Weichung Wang (National Taiwan U)	
Session-3	JST: Japan	h3-Open-AT Automatic Tuning			Speaker	
	0800-0840, Dec03	h3-Open-DDA: Learning Data Driven Approach			Osné Marques (LBNL)	
	0840-0900	0740-0800	0040-0100	1840-1900	1540-1600	Takahiro Katagiri (Nagoya U.)
	0900-0920	0800-0820	0100-0120	1900-1920	1600-1620	Takeshi Ogita (TWCU)
	0920-0940	0820-0840	0120-0140	1920-1940	1620-1640	Takeshi Fukaya (Hokkaido U.)
	0940-1020	0840-0920	0140-0220	1940-2020	1640-1720	Discussions on Computing by Low/Adaptive Precision
Session-4	1600-1640, Dec03	1500-1540, Dec03	0800-0840, Dec03	0200-0240, Dec03	2300-0340, Dec02	Gerhard Wellein (FAU Erlangen)
	1640-1700	1540-1600	0840-0900	0240-0300	2340-2400	Kengo Nakajima (U.Tokyo): Earthquake
	1700-1720	1600-1620	0900-0920	0300-0320	2400-2420	Hiromichi Nagao (U.Tokyo)
	1720-1740	1620-1640	0920-0940	0320-0340	2420-2440	Hisashi Yashiro (NIES, Japan)
	1740-1800	1640-1700	0940-1000	0340-0400	2440-2500	Hiroya Matsuba (U.Tokyo)
	1800-1810	1700-1710	1000-1010	0400-0410	2500-2510	Closing

	JST: Japan	CTT: Taiwan	CET: Germany	EST: Atlanta	PST: Berkeley	Speaker
Session-1  Adaptive Precision, AT & Verification (I)	0800-0830, Nov30	Kengo Nakajima (U.Tokyo): Overview				
	0830-0850	0830-0850	0830-0850	0830-0850	0830-0850	Takeshi Iwashita (Hokkaido U.)
	0850-0910	0850-0910	0850-0910	0850-0910	0850-0910	Masatoshi Kawai (U.Tokyo)
	0910-0950	0910-0950	0910-0950	0910-0950	0910-0950	Rich Vuduc (Georgia Tech)
Session-2  Integration of (S+D+L) (I)	1600-1640, Nov30	Kento Sato (RIKEN)				
	1640-1700	1640-1700	1640-1700	1640-1700	1640-1700	Takashi Shimokawabe (U.Tokyo)
	1700-1720	1700-1720	1700-1720	1700-1720	1700-1720	Hayato Shiba (U.Tokyo)
	1720-1800	1720-1800	1720-1800	1720-1800	1720-1800	Weichung Wang (National Taiwan U)
Session-3  Adaptive Precision, AT & Verification (II)	JST: Japan	CTT: Taiwan	CET: Germany	EST: Atlanta	PST: Berkeley	Speaker
	0800-0840, Dec03	Osni Marques (LBNL)				
	0840-0900	0840-0900	0840-0900	0840-0900	0840-0900	Takahiro Katagiri (Nagoya U.)
	0900-0920	0800-0820	0100-0120	1900-1920	1600-1620	Takeshi Ogita (TWCU)
	0920-0940	0820-0840	0120-0140	1920-1940	1620-1640	Takeshi Fukaya (Hokkaido U.)
	0940-1020	0840-0920	0140-0220	1940-2020	1640-1720	Discussions on Computing by Low/Adaptive Precision
Session-4  Integration of (S+D+L) (II)	1600-1640, Dec03	1500-1540, Dec03	0800-0840, Dec03	0200-0240, Dec03	2300-0340, Dec02	Gerhard Wellein (FAU Erlangen)
	1640-1700	1540-1600	0840-0900	0240-0300	2340-2400	Kengo Nakajima (U.Tokyo): Earthquake
	1700-1720	1600-1620	0900-0920	0300-0320	2400-2420	Hiromichi Nagao (U.Tokyo)
	1720-1740	1620-1640	0920-0940	0320-0340	2420-2440	Hisashi Yashiro (NIES, Japan)
	1740-1800	1640-1700	0940-1000	0340-0400	2440-2500	Hiroya Matsuba (U.Tokyo)
	1800-1810	1700-1710	1000-1010	0400-0410	2500-2510	Closing

## h3-Open-BDEC

New Principle for Computations  
Numerical Alg./Library

Simulation + Data + Learning  
App. Dev. Framework

Integration + Communications+ Utilities  
Control & Utility

h3-Open-MATH  
Algorithms with High-Performance, High Reliability & Mixed/Adaptive Precision

h3-Open-APP:  
Simulation Application Development

h3-Open-SYS  
Control & Integration

h3-Open-VER  
Verification of Accuracy

h3-Open-DATA:  
Data Data Science

h3-Open-UTIL  
Utilities for Large-Scale Computing



	JST: Japan	CTT: Taiwan	CET: Germany	EST: Atlanta	PST: Berkeley	Speaker
<b>Session-1</b>  <b>Adaptive Precision, AT &amp; Verification (I)</b>	0800-0830, Nov30	0700-0730, Nov30	0000-0030, Nov30	1800-1830, Nov29	1500-1530, Nov29	Kengo Nakajima (U.Tokyo): Overview
	0830-0850	0730-0750	0030-0050	1830-1850	1530-1550	Takeshi Iwashita (Hokkaido U.)
	0850-0910	0750-0810	0050-0110	1850-1910	1650-1710	Masatoshi Kawai (U.Tokyo)
	0910-0950	0810-0850	0110-0150	1910-1950	1710-1750	Rich Vuduc (Georgia Tech)
<b>Session-2</b>  <b>Integration of (S+D+L) (I)</b>	1600-1640, Nov30	1500-1540, Nov30	0800-0840, Nov30	0200-0240, Nov30	2300-2340, Nov29	Kento Sato (RIKEN)
	1640-1700	1540-1600	0840-0900	0240-0300	2340-2400	Takashi Shimokawabe (U.Tokyo)
	1700-1720	1600-1620	0900-0920	0300-0320	2400-2420	Hayato Shiba (U.Tokyo)
	1720-1800	1620-1700	0920-1000	0320-0400	2420-2500	Weichung Wang (National Taiwan U)
	JST: Japan	CTT: Taiwan	CET: Germany	EST: Atlanta	PST: Berkeley	Speaker
<b>Session-3</b>  <b>Adaptive Precision, AT &amp; Verification (II)</b>	0800-0840, Dec03	0700-0740, Dec03	0000-0040, Dec03	1800-1840, Dec02	1500-1540, Dec02	Osni Marques (LBNL)
	0840-0900	0740-0800	0040-0100	1840-1900	1540-1600	Takahiro Katagiri (Nagoya U.)
	0900-0920	0800-0820	0100-0120	1900-1920	1600-1620	Takeshi Ogita (TWCU)
	0920-0940	0820-0840	0120-0140	1920-1940	1620-1640	Takeshi Fukaya (Hokkaido U.)
	0940-1020	0840-0920	0140-0220	1940-2020	1640-1720	Discussions on Computing by Low/Adaptive Precision
<b>Session-4</b>  <b>Integration of (S+D+L) (II)</b>	1600-1640, Dec03	1500-1540, Dec03	0800-0840, Dec03	0200-0240, Dec03	2300-0340, Dec02	Gerhard Wellein (FAU Erlangen)
	1640-1700	1540-1600	0840-0900	0240-0300	2340-2400	Kengo Nakajima (U.Tokyo): Earthquake
	1700-1720	1600-1620	0900-0920	0300-0320	2400-2420	Hiromichi Nagao (U.Tokyo)
	1720-1740	1620-1640	0920-0940	0320-0340	2420-2440	Hisashi Yashiro (NIES, Japan)
	1740-1800	1640-1700	0940-1000	0340-0400	2440-2500	Hiroya Matsuba (U.Tokyo)
	1800-1810	1700-1710	1000-1010	0400-0410	2500-2510	Closing

# **International Workshop on the Integration of (Simulation + Data + Learning): Towards Society 5.0 by h3-Open-BDEC**

**All presentations will be recorded.  
Video's are available at:**

<https://h3-open-bdec.cc.u-tokyo.ac.jp/>