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Arm as a Viable Architecture for HPC and AI

EPCC Workshop on
Efficient Computing for High Energy Physics

Dr. Nathan John Sircombe
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18th February 2020
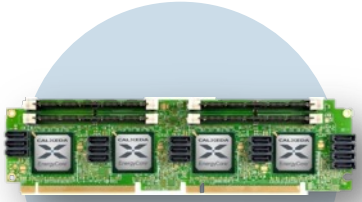
70%

of the world's population
uses Arm technology

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Not just mobile phones!

History of Arm in HPC

A Busy Decade

2011 Calxada
- 32-bit ARrmv7-A – Cortex A9

2011-2015 Mont-Blanc 1
- 32-bit Armv7-A
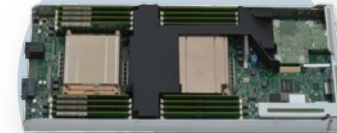- Cortex A15
- First Arm HPC system

2014 AMD Opteron A1100
- 64-bit Armv8-A
- Cortex A57
- 4-8 Cores

2015 Cavium ThunderX
- 64-bit Armv8-A
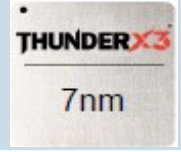- 48 Cores

2017 (Cavium) Marvell ThunderX 2
- 64-bit Armv8-A
- 32 Cores

2019 Fujitsu A64FX
- First Arm chip with SVE vectorisation
- 48 Cores

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Variation in the Processor Market

Marvell (Cavium)		CAVIUM THUNDERX		CAVIUM THUNDERX2	THUNDERX3 7nm
Ampere (X-Gene)	applied micro X-Gene	applied micro X-Gene 2		AMPERE eMag	AMPERE Quicksilver
Fujitsu				FUJITSU A64FX	
Huawei (HiSilicon)		Hi1612	1616	Kunpeng 920	Hi1630
Amazon (Annapurna)				aws Graviton	aws Graviton2
EPI / SiPearl					SIPEARL
Other			PHYTIUM	Qualcomm Centriq Processor	

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Marvell ThunderX2 CN99XX

- Marvell's next generation 64-bit Arm processor
  - Taken from Broadcom Vulcan

- 32 cores @ 2.2 GHz (other SKUs available)
  - 4 Way SMT (up to 256 threads / node)
  - Fully out of order execution
  - **8 DDR4 Memory channels (~250 GB/s Dual socket)**
    - Vs 6 on Skylake

- Available in dual SoC configurations
  - CCPI2 interconnect
  - **180-200w / socket**

- Vector unit: **128-bit** NEON

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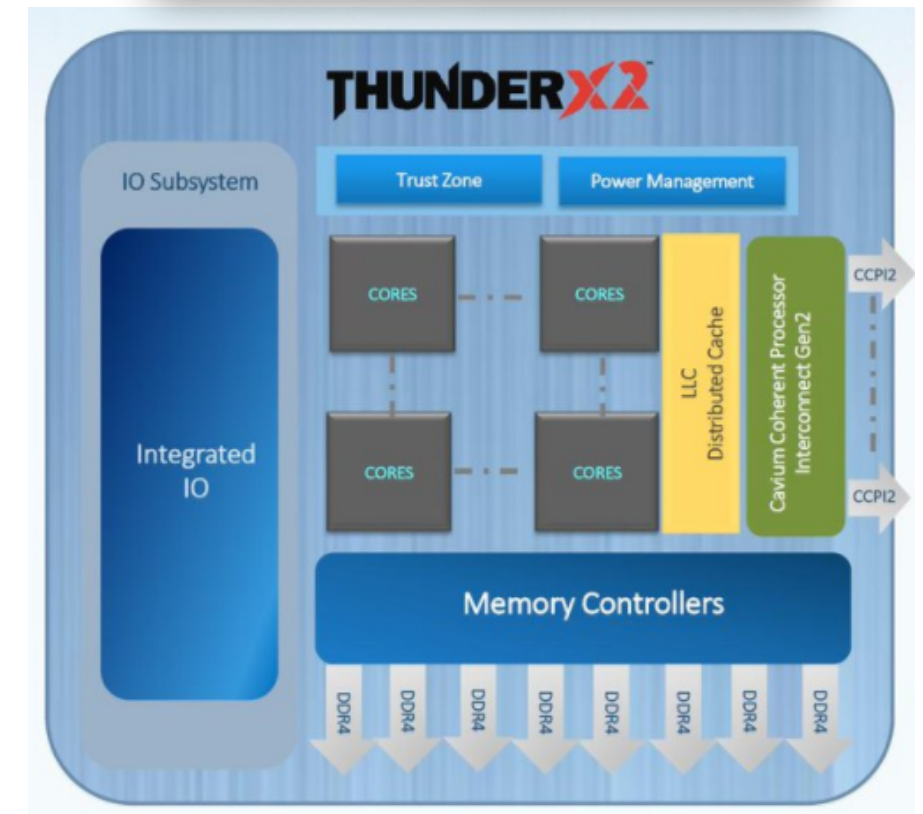
Fujitsu A64FX

- Chip designed for RIKEN Fugaku (POST-K)
  - Based on Arm ISA technology
- 48 core 64-bit Armv8 processor
  - **+ 4 dedicated OS cores**
- **With SVE vectorisation**
  - **512 bit** vector length
- High performance
  - >2.7 TFLOPs
  - Low power : 15GF/W (dgemm)
- 32 GB HBM2
  - No DDR
  - **1 TB/s bandwidth**
- TOFU 3 interconnect
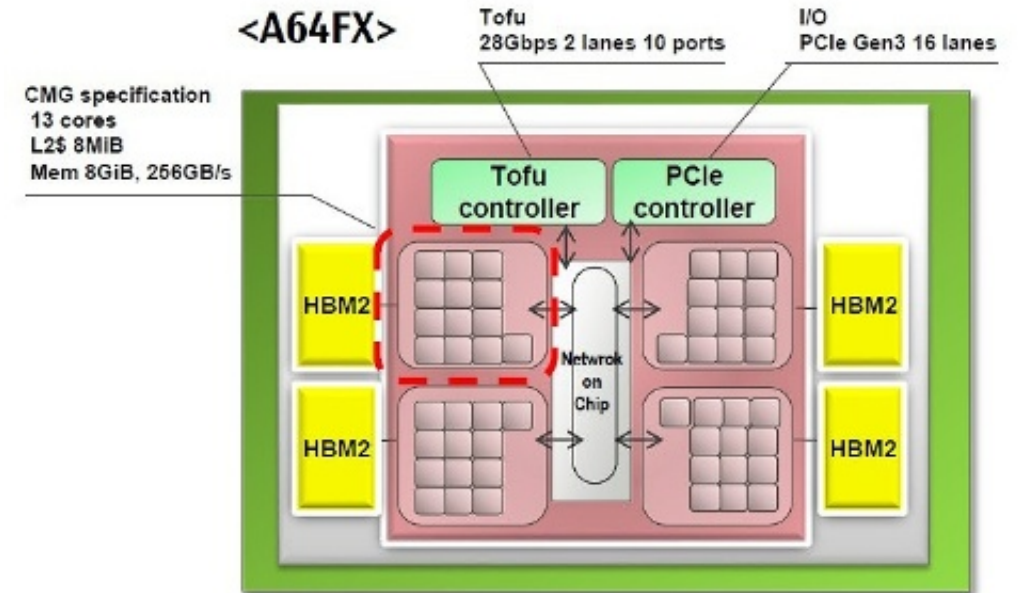
	A64FX (Post-K)	SPARC64 XIfx (PRIMEHPC FX100)
ISA (Base)	Armv8.2-A	SPARC-V9
ISA (Extension)	SVE	HPC-ACE2
Process Node	7nm	20nm
Peak Performance	>2.7TFLOPS	1.1TFLOPS
SIMD	512-bit	256-bit
# of Cores	48+4	32+2
Memory	HBM2	HMC
Memory Peak B/W	1024GB/s	240GB/s x2 (in/out)

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Deployments

- ## More Arm based CPUs are being adopted
  - Lots of large-scale deployments

- ## Different OEMs
  - Cray, HPE, Atos-Bull, Fujitsu, Huawei, E4

- ## EU Deployments
  - Isambard: Cray 10k TX2 cores
  - Catalyst 3 systems: HPE 4k TX2 core
  - **Future** Isambard 2: Cray A64FX
  - **Future** Deucalion: Cray A64FX

>5k ThunderX2 CPUs

2k Kunpeng 920 CPUs + 8k AI accelerators

150k+ Fujitsu A64FX CPUs

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Deployments
Catalyst

Fulhame Catalyst system at EPCC

- Deployments to accelerate the growth of the Arm **HPC** ecosystem
- Each machine has:
  - 64 HPE Apollo 70 nodes
  - Dual 32-core Marvell ThunderX2 nodes
  - 4096 cores per system
  - 256GB of memory / node
  - Mellanox InfiniBand interconnects

- OS: SUSE Linux Enterprise Server for HPC
- Signup for access:
  - https://safe.epcc.ed.ac.uk/safadmin/
  - Email olly.perks@arm.com for more information

Bristol: VASP, CASTEP, Gromacs, CP2K, Unified Model, NAMD, Oasis, NEMO, OpenIFS, CASINO, LAMMPS

EPCC: WRF, OpenFOAM, Two PhD candidates

Leicester: Data-intensive apps, genomics, MOAB Torque, DiRAC collaboration

A64FX Now in Top500 - #159

System	Year	Vendor	Cores	Rmax (GFlop/s)	Rpeak (GFlop/s)
A64FX prototype - Fujitsu A64FX, Fujitsu A64FX 48C 2GHz, Tofu interconnect D	2019		36,864	1,999,500	2,359,296

Green500 - #1

Rank	TOP500 Rank	System	Cores	Rmax (TFlop/s)	Power (kW)	Power Efficiency (GFlops/watts)
1	159	**A64FX prototype** - Fujitsu A64FX, Fujitsu A64FX 48C 2GHz, Tofu interconnect D , Fujitsu Fujitsu Numazu Plant Japan	36,864	1,999.5	118	16.876

153W/node

- Prototype of Fugaku system
  - Fraction of the size of the final deployment
- Using Fujitsu software stack
  - Compiler and MPI

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The Cloud

Open access to server class Arm

The Cloud

Open access to server class Arm

Spot Instances	Defined Duration for Linux	Defined Duration fo

Region: US East (Ohio) ⇕

	Linux/UNIX Usage
General Purpose - Current Generation	
a1.medium	$0.0049 per Hour
a1.large	$0.0098 per Hour
a1.xlarge	$0.0197 per Hour
a1.2xlarge	$0.0394 per Hour
a1.4xlarge	$0.0788 per Hour

HPCI wire

AWS Graviton Processor

...nes First Arm Cloud Instances
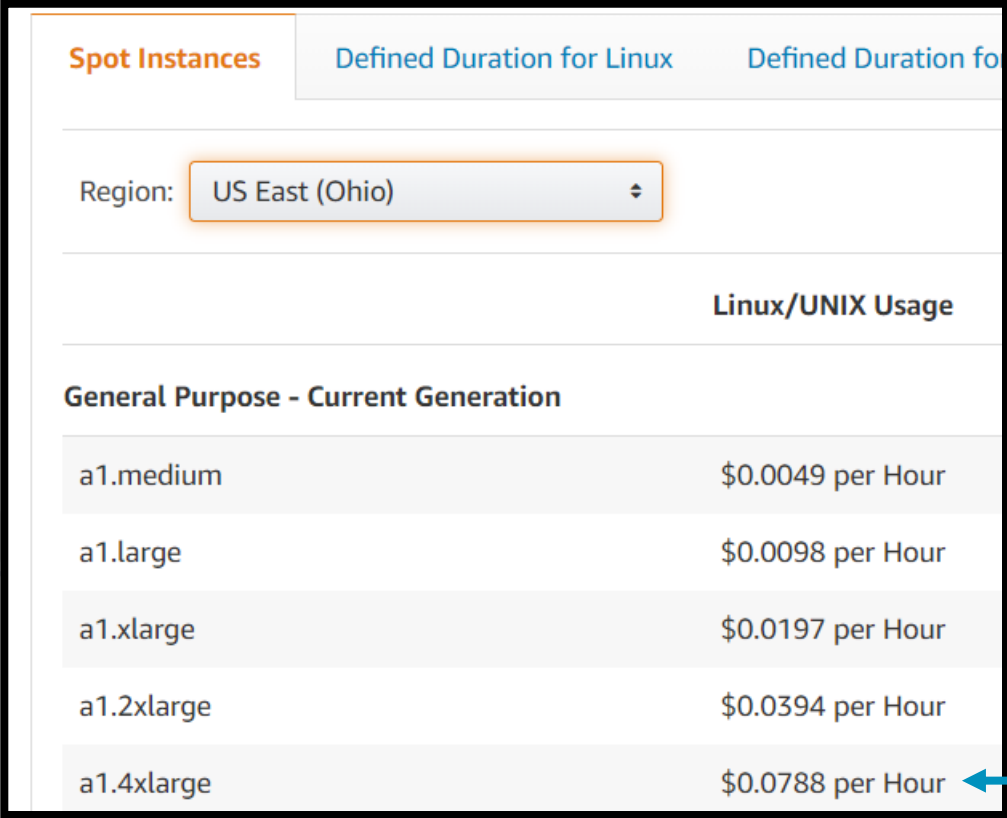
VERNE GLOBAL

in part...

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packet

16 Cores A72 @ 2.3 GHz

With 96 physical Arm cores, this server is anything but a lightweight - and it comes with 128 GB of RAM for just $0.50/hr. Nice!

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Software Ecosystem

Not Just Hardware

- **Comprehensive software ecosystem**
  - From Operating systems to Applications
  - Schedulers to file systems

- **Everything you need to run an HPC service**

- **Vendor and OSS solutions**

openHPC

Functional Areas	Components include
Base OS	Centos, RHEL, Ubuntu, SUSE, SLES
Administrative Tools	Conman, Ganglia, Lmod, LosF, Nagios, pdsh, pdsh-mod-slurm, prun, EasyBuild, ClusterShell, mrsh, Genders, Shine, test-suite
Provisioning	Warewulf
Resource Mgmt.	SLURM, PBS Pro, Munge
I/O Services	Lustre client + server, NFS
Numerical/Scientific Libraries	Boost, GSL, FFTW, Metis, PETSc, Trilinos, Hypre, SuperLU, SuperLU_Dist,Mumps, OpenBLAS, Scalapack, SLEPc, PLASMA, ptScotch
I/O Libraries	HDF5 (pHDF5), NetCDF (including C++ and Fortran interfaces), Adios
Compiler Families	GNU (gcc, g++, gfortran), LLVM, Cray, Fujitsu, Arm
MPI Families	OpenMPI, MPICH, MVAPICH2, Cray, HPE
Development Tools	Autotools (autoconf, automake, libtool), Cmake, Valgrind,R, SciPy/NumPy, hwloc
Performance Tools	PAPI, IMB, pdtoolkit, TAU, Scalasca, Score-P, SIONLib

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Cross-platform
debug and profile tools

Arm-only
Compiler and Libraries

arm ALLINEA STUDIO

Forge (DDT and MAP)
and Performance Reports
with support for Arm

Arm Fortran, C & C++ Compilers,
interoperable with Forge
and Performance Reports
Arm Performance Libraries

arm ALLINEA STUDIO
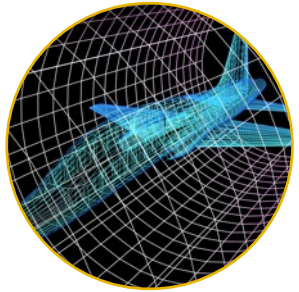
Fortran Compiler

- Fortran 2003 support
- Partial Fortran 2008 support
- OpenMP 3.1
- Directives to support explicit vectorization control
- SVE

C/C++ Compiler

- C++ 14 support
- OpenMP 4.5 without offloading
- SVE
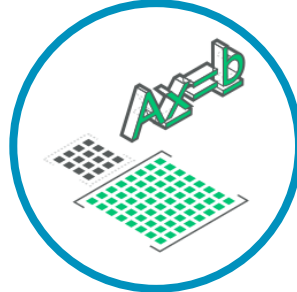
Performance Libraries

- Optimized math libraries
- BLAS, LAPACK and FFT
- Threaded parallelism with OpenMP
- Optimized maths intrinsics

Forge

- Profile, Tune and Debug
- Scalable debugging with DDT
- Parallel Profiling with MAP

Performance Reports

- Analyze your application
- Memory, MPI, Threads, I/O, CPU metrics

Tuned by Arm for server-class Arm-based platforms

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arm COMPILER

Commercial C/C++/Fortran compiler with best-in-class performance

Compilers tuned for Scientific Computing and HPC

Latest features and performance optimizations

Commercially supported by Arm

Tuned for Scientific Computing, HPC and Enterprise workloads

- Processor-specific optimizations for various server-class Arm-based platforms
- Optimal shared-memory parallelism using latest Arm-optimized OpenMP runtime

Linux user-space compiler with latest features

- C++ 14 and Fortran 2003 language support with OpenMP 4.5*
- Support for Armv8-A and SVE architecture extension
- Based on LLVM and Flang, leading open-source compiler projects

Commercially supported by Arm

- Available for a wide range of Arm-based platforms running leading Linux distributions – RedHat, SUSE and Ubuntu

* Without offloading

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arm PERFORMANCE LIBRARIES

Best-in-class performance

Commercially Supported by Arm

Validated with NAG test suite

- Commercial 64-bit ArmV8-A math Libraries
  - Commonly used low-level maths routines – BLAS, LAPACK and FFT
  - Optimised maths intrinsics
  - Validated with NAG's test suite, a de facto standard

- Best-in-class performance with commercial support
  - Tuned by Arm for specific cores - like TX2
  - Maintained and supported by Arm for wide range of Arm-based SoCs

- Silicon partners can provide tuned micro kernels for their SoCs
  - Partners can contribute directly through open source routes
  - Parallel tuning within our library increases overall application performance

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Applications

Applications & frameworks
abinit, psdns, arbor, qmcpack, castep, quantumespresso, flecsale, raja, gromacs, sparta, kokkos, specfem3d, tensorflow, geant4, lammps, sw4, pytorch, mxnet, nalu, milc, thornado, namd. vasp, nwchem, openfoam, wrf...

Benchmarks
amg, nsimd,carmpl, nsimd-sve, clom, npb, elefunt, polybench. epcc_c, stream, epcc_f, tsvc, umt, graph500, xsbench, hpcg, hpl hydrobench, ncar...

Mini apps
branson, pennant. cloverleaf, pf3dkernels, cloverleaf3d, quicksilver, e3smkernels, snap, kripke, snbone, lulesh.f tealeaf, miniamr, minife, minighost, nekbone. neutral...

Community resources
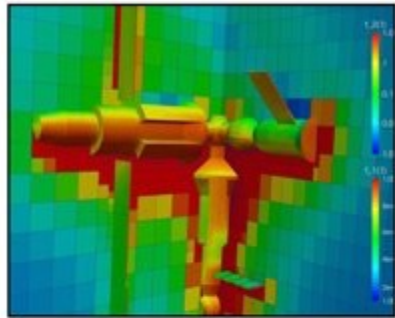https://gitlab.com/arm-hpc/packages/wiki/

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Application Performance
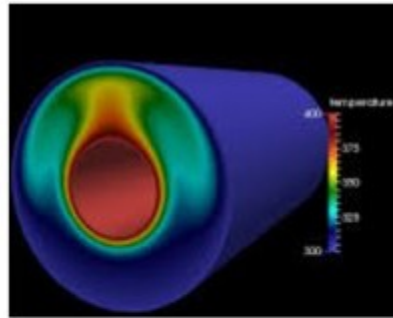
Early Results from Astra

System has been online for around two weeks , incredible team working round the clock, already running full application ports and many of our key frameworks

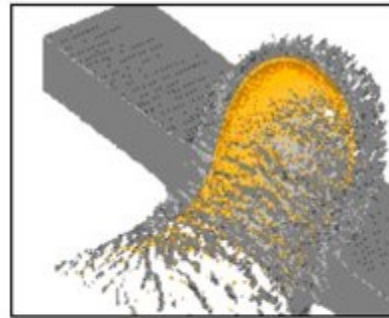Baseline: Trinity ASC Platform (Current Production (LANL/SNL)), dual-socket Haswell
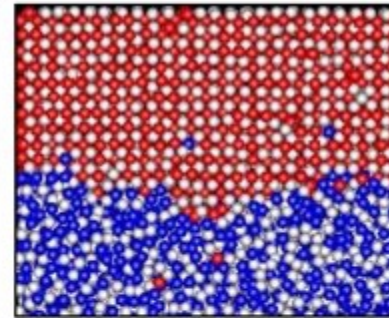
Monte Carlo	CFD Models	Hydrodynamics	Molecular Dynamics	Linear Solvers
1.60X	1.45X	1.30X	1.42X	1.87X

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EM (EMPIRE) Code on Astra

EMPIRE PIC blob HSW/TX2 8x more work per core

(Better)

Legend:
- Particle Update (blue)
- Push particles (gray)
- Move particles (yellow)
- Sort particles (light blue)
- Linear solve (orange)

Y-axis: (HSW time)/(TX2 time)

X-axis: <Mesh size>-N<number of compute nodes>

Categories: M-N1, M-N2, M-N4, M-N8, L-N8, L-N16, L-N32, L-N64, XL-N64

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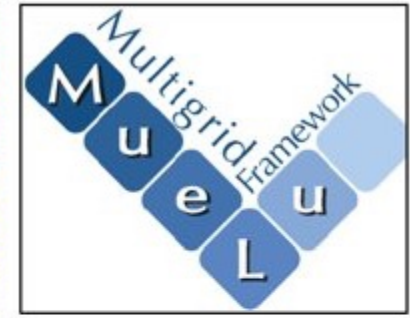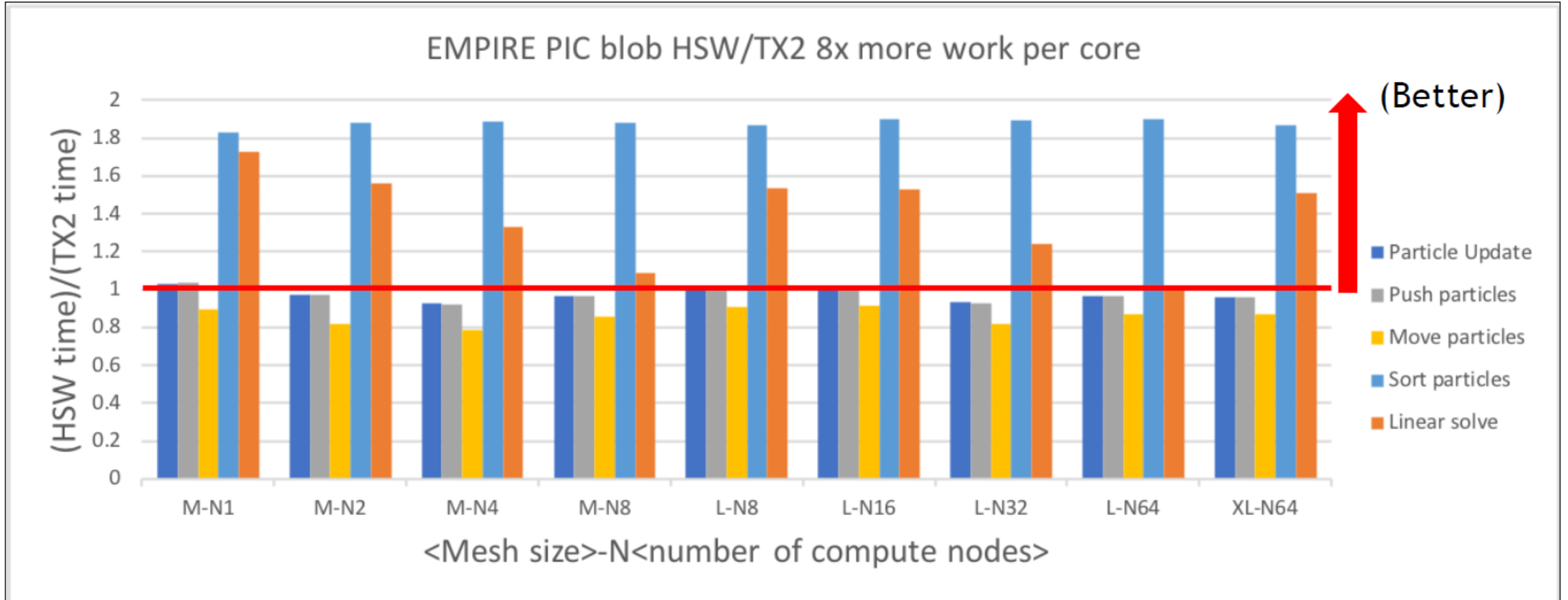
Single node performance results
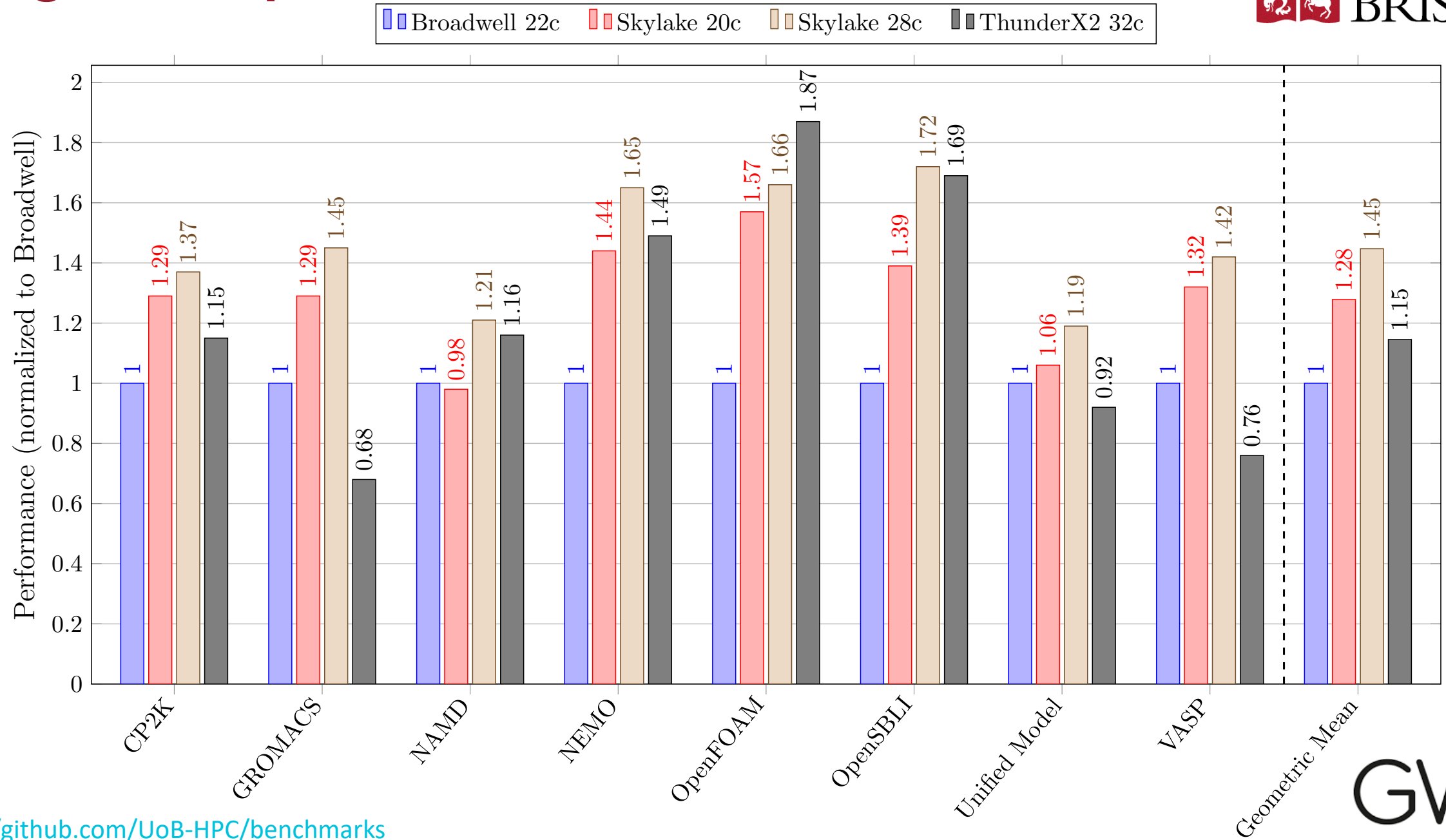
UM scalability, up to 10,240 cores

UM vn10.4 N768-noio
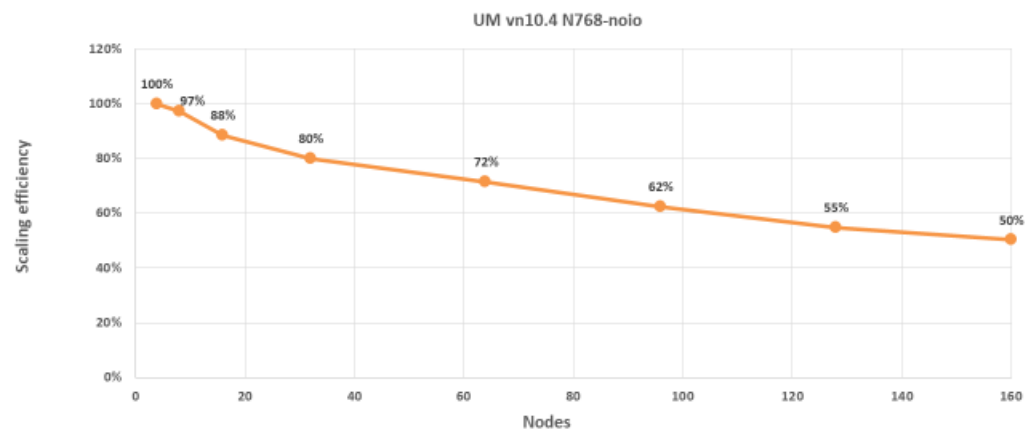
NEMO scalability, up to 8,192 cores

NEMO 1/12 deg GYRE_PISCES
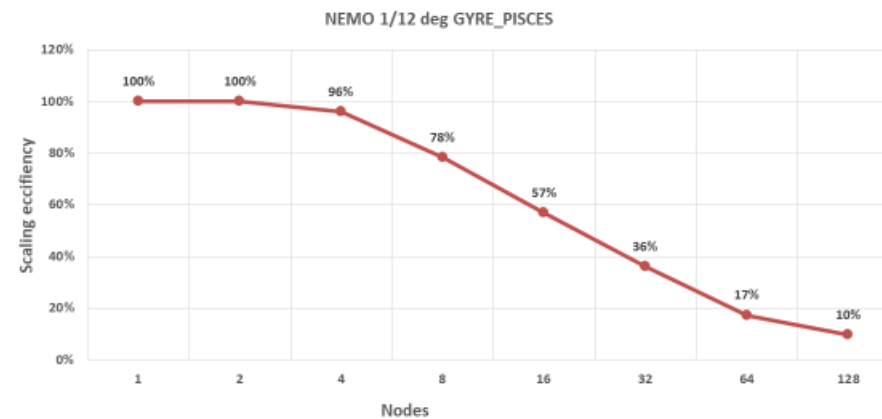
OpenSBLI scalability, up to 10,240 cores

OpenSBLI 1024^3
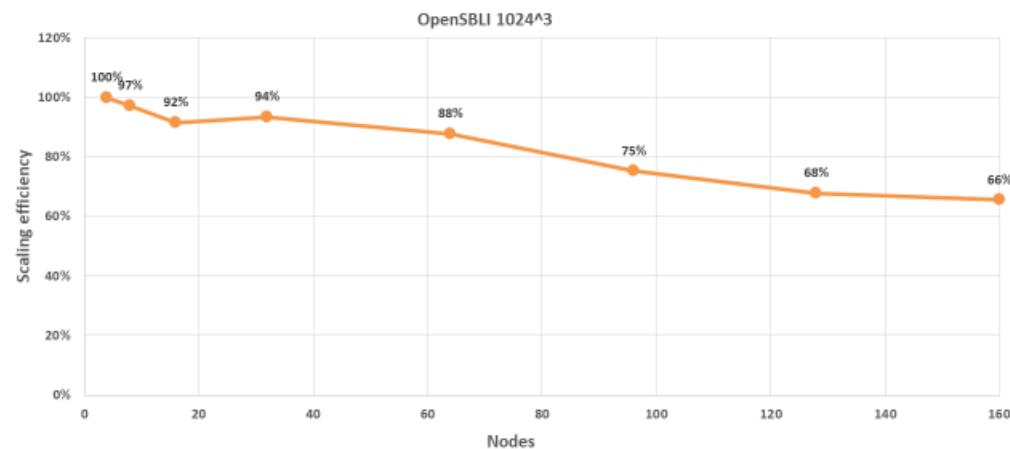
GROMACS scalability, up to 8,192 cores

GROMACS (42M atoms)
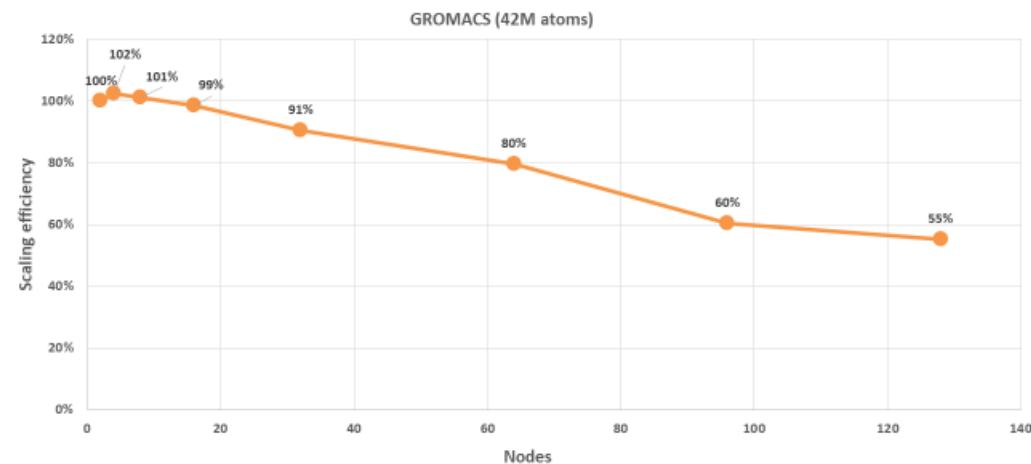
Arm Performance Libraries – Leading BLAS performance

Arm Compiler for Linux 20.0 vs latest OpenBLAS vs latest BLIS
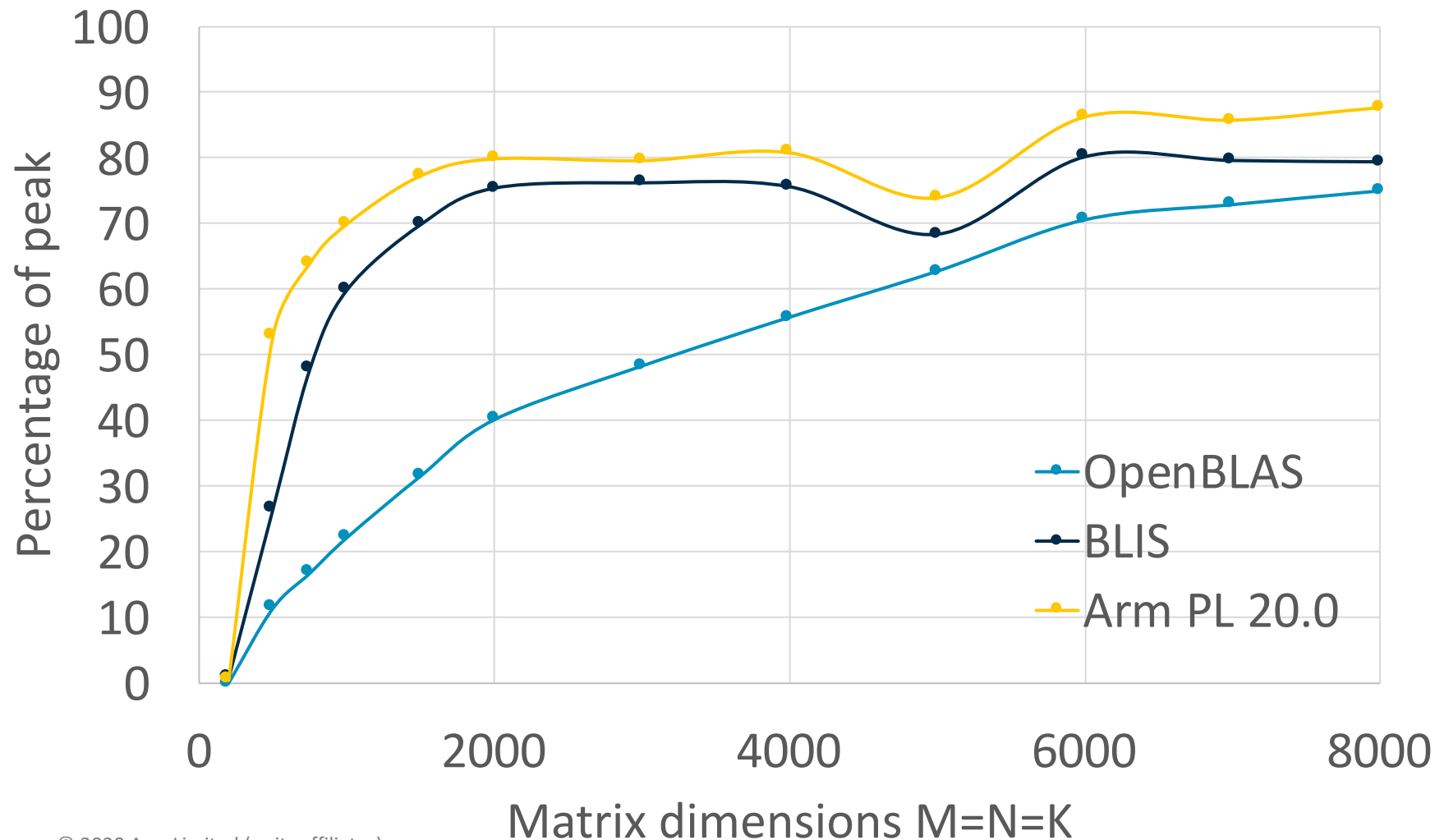
- High serial performance for BLAS level 3 routines, such as GEMMs also have class-leading parallel performance

- Shown is DGEMM on square matrices using 56 threads on a ThunderX2

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ArmPL 20.0 FFT vs FFTW 3.3.8

- 1-d
- complex-to-complex
- double precision
- ThunderX2

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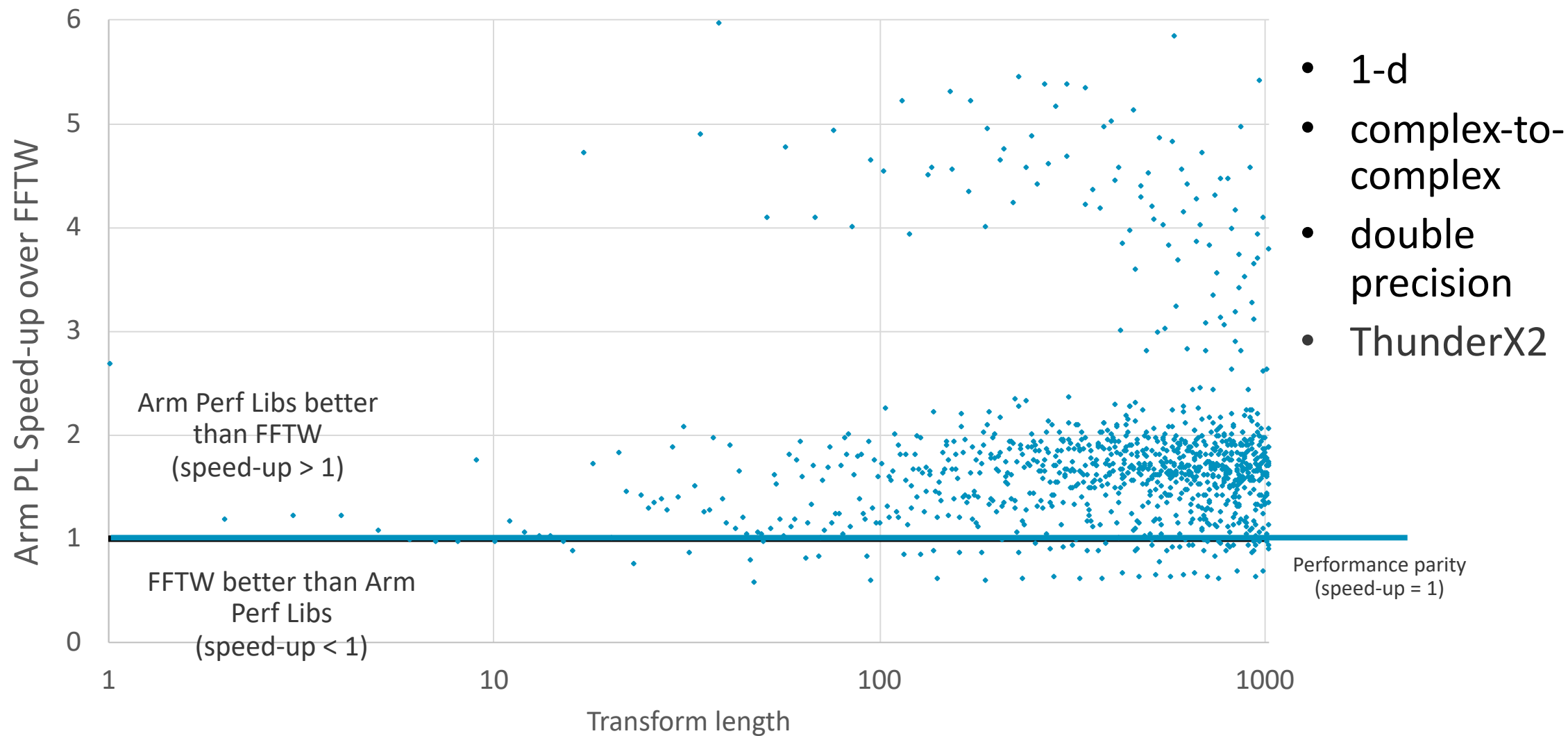
Architecture Adoption: Community Engagement

Training Events and Hackathons

- Arm as a viable alternative to X86

- Needs to be easy to port to
  - Working codes and performant codes

- Team of field application engineers
  - Work with code teams
  - Educate, port and optimize

- Successful previous events

- Next event:
  - **Arm HPC User Group**
  - https://a-hug.org/
  - SVE Hackathon: **11th March**
  - Meeting: **12th-13th March**
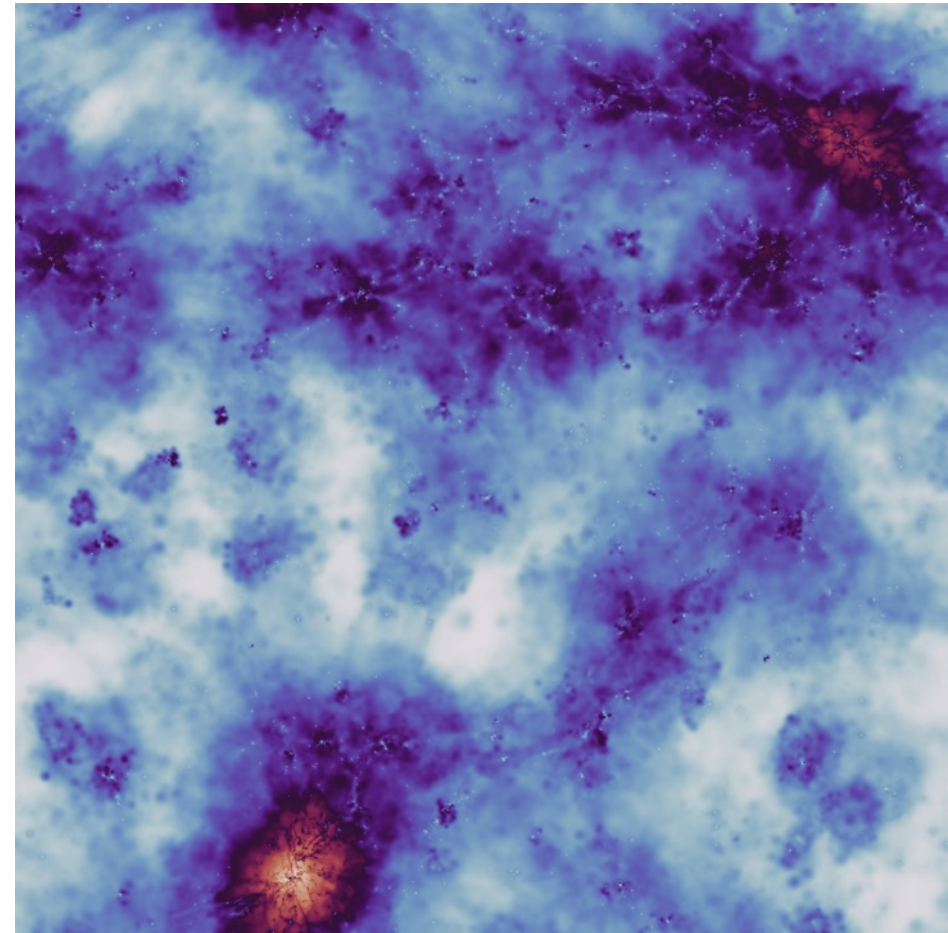
Galaxy simulation in SWIFTsim computed on Arm Catalyst during DiRAC Hackathon

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Machine Learning and Artificial Intelligence

Machine Learning and Artificial Intelligence

Ecosystem	**AI/ML Applications, Algorithms and Frameworks**
	TensorFlow™ TensorFlowLite™ ○ PyTorch™ ◇ ONNX™
	mxnet™ Caffe™ ♨ Caffe2™ Android™ NNAPI

Software Products	**Software Libraries Optimized for Arm Hardware**
	arm NN **arm** COMPUTE LIBRARY **CMSIS-NN**

Hardware Products	**Arm Hardware IP for AI/ML**
	CPU — **arm** CORTEX, **arm** DynamIQ, **arm** NEOVERSE
	GPU — **arm** MALI
	NPU — Machine Learning Processor (ML)
	Partner IP — DSPs, FPGAs, Accelerators

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ML Frameworks on server-class Aarch64 platforms

- On-CPU server-scale ML workloads

- Leading frameworks and dependencies built on AArch64
  - TensorFlow: https://gitlab.com/arm-hpc/packages/-/wikis/packages/tensorflow
  - PyTorch: https://gitlab.com/arm-hpc/packages/-/wikis/packages/pytorch
  - MXNET: https://gitlab.com/arm-hpc/packages/-/wikis/packages/mxnet

- Docker tools for TensorFlow on GitHub
  - part of **ARM-software/Tool-Solutions**
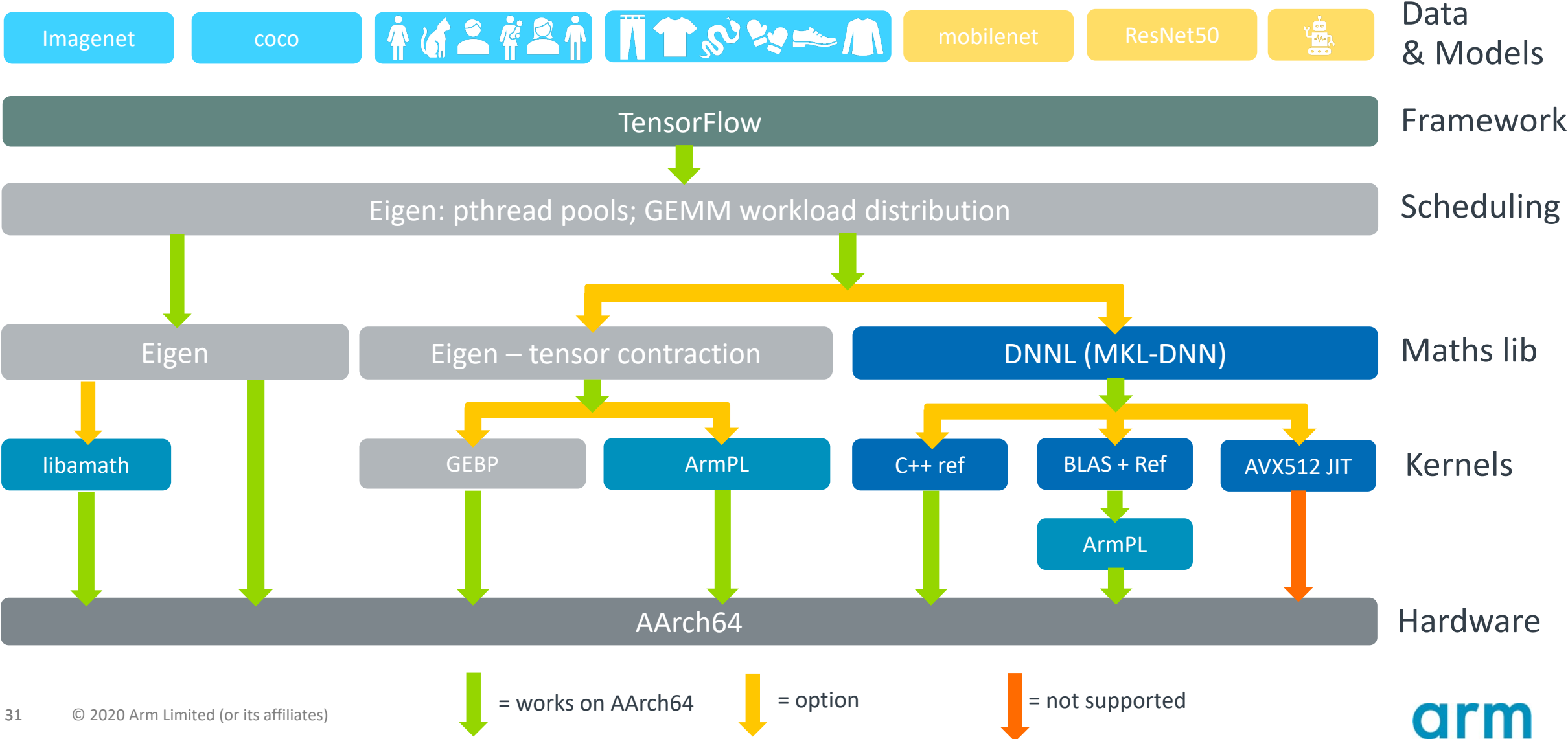 - https://github.com/ARM-software/Tool-Solutions/tree/master/docker/tensorflow-aarch64
    - Compiler: GCC 9.2
    - Maths libraries: Arm Optimized Routines and OpenBLAS 0.3.6
    - Python3 environment built from CPython 3.7 and containing:
      - NumPy 1.17.1
      - TensorFlow 1.15
      - TensorFlow Benchmarks

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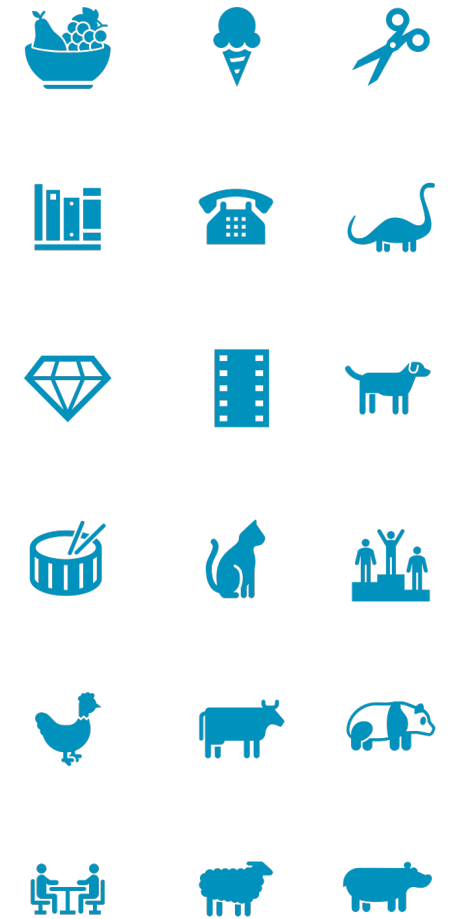
TensorFlow and maths libraries on AArch64

				Data & Models
Imagenet	coco		mobilenet	ResNet50

Framework

TensorFlow

Scheduling

Eigen: pthread pools; GEMM workload distribution

Maths lib

Eigen	Eigen – tensor contraction	DNNL (MKL-DNN)

Kernels

libamath	GEBP	ArmPL	C++ ref	BLAS + Ref	AVX512 JIT

ArmPL

Hardware

AArch64

↓ = works on AArch64   ↓ = option   ↓ = not supported

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ML Frameworks on AArch64

- Focus has been on TensorFlow, and the maths libraries
  - Inference
    - Including ArmNN + ArmCL
  - Many-core systems
    - ArmCL note developed for > 8 cores, and doesn't scale well as-is
  - Significant GEMM, and vector maths, work

- Scope for improvements to performance and parallelism

- We're actively working on:
  - Optimized kernels
  - Improved scaling on many-core SoCs
  - Better support for AArch64 Neon and SVE
  - Leveraging Arm Performance Libraries for HPC-ML workloads
  - Enablement of AArch64 support in key libraries
  - Provision of OS implementations of key kernels

ML in HPC

- Catalyst cluster located in Leicester, 2 x Cavium ThunderX2(R) CPU CN9980 v2.1 @ 2.20GHz per node

- Distributed training benchmarks run at scale on Catalyst system
  - Cosmoflow
  - ResNet101
  - Climate Segmentation
    - https://github.com/sparticlesteve/climate-seg-benchmark
    - DeepLabv3+NN, training via Synchronous SGD

- Work supported by DiRAC Post-Doctoral industrial placement

Climate Segmentation scaling on Catalyst

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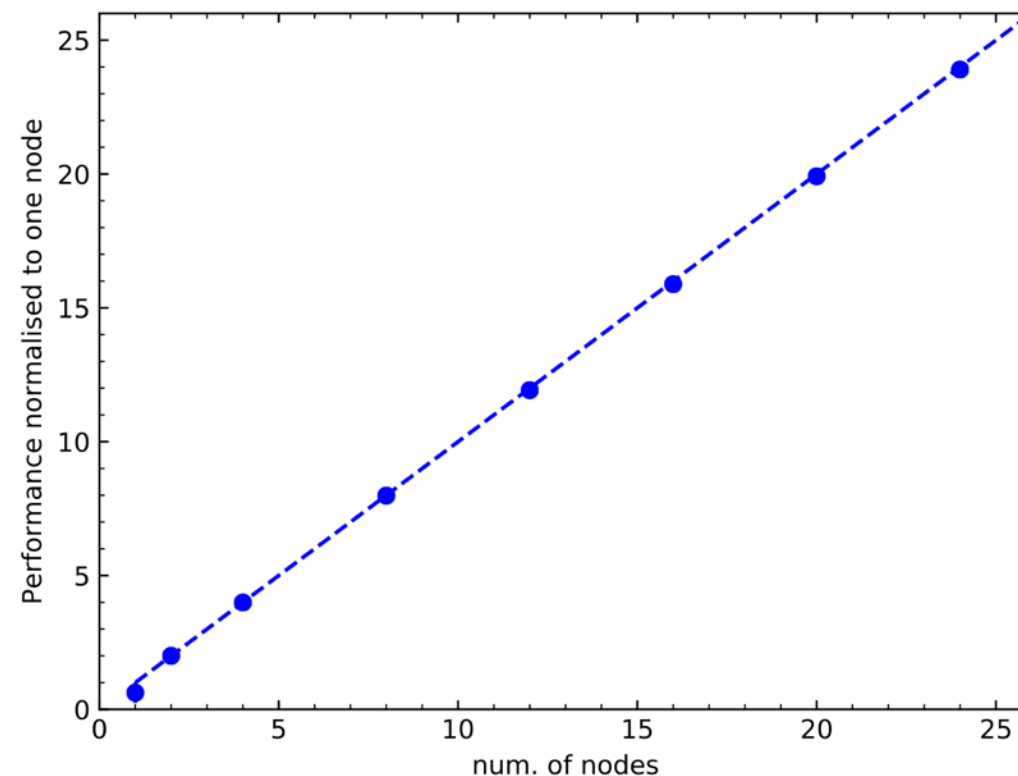
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Going Forward

The Future of Arm in HPC

What's next?

Processors

- By more vendors
  - Marvell, Ampere, Amazon, HiSilicon, Fujitsu

- Targeting different market segments

- All built on the Arm ecosystem

- Supported by the tools

Deployments

- Large scale and small scale deployments

- Increased exposure to the architecture

- More applications and libraries ported to Arm
  - Including ISVs

- Growing community

Commitment from Arm

- Neoverse – IP roadmap for silicon vendors

- Investment in software ecosystem
  - E.g. Flang / F18

- Support for customers
  - Applications
  - Software
  - Performance

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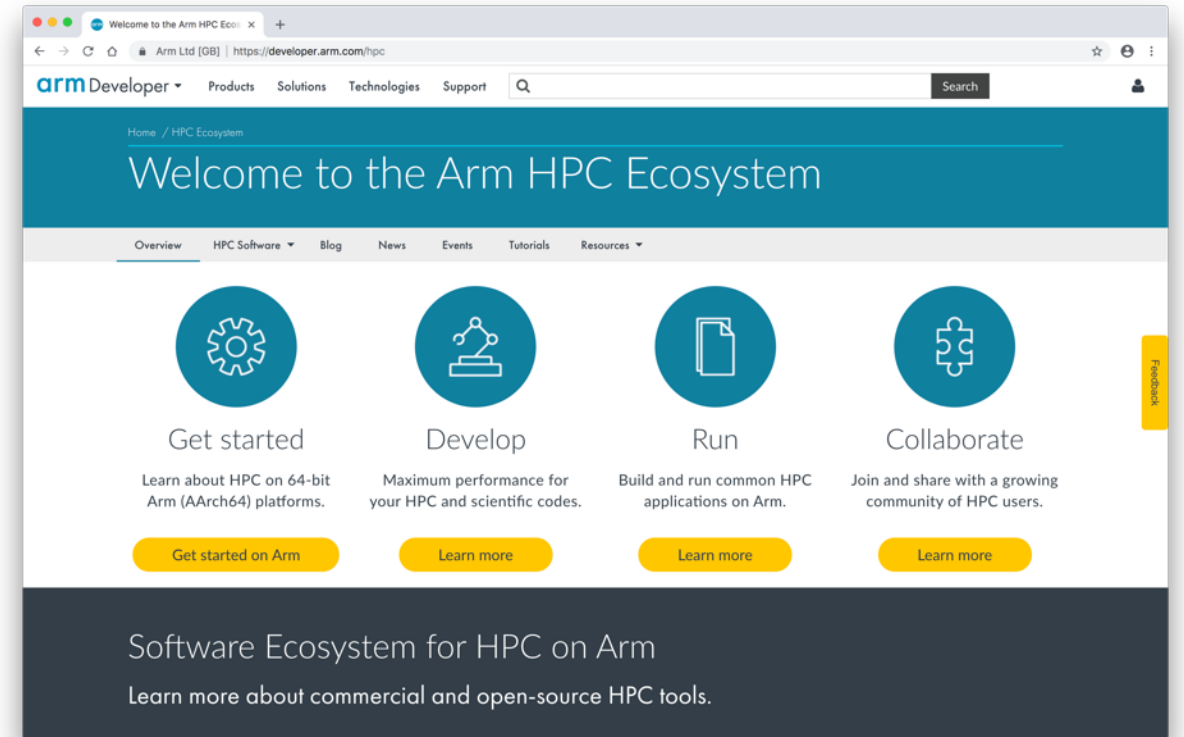# Arm HPC Ecosystem

Get involved

www.arm.com/hpc

- News, events, blogs, webinars, etc.
- Quick-start guides for tools

www.gitlab.com/arm-hpc/packages/wikis

- Community collaboration site
- Guides for porting HPC applications

www.a-hug.org

- Arm HPC Users Group (AHUG)

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