



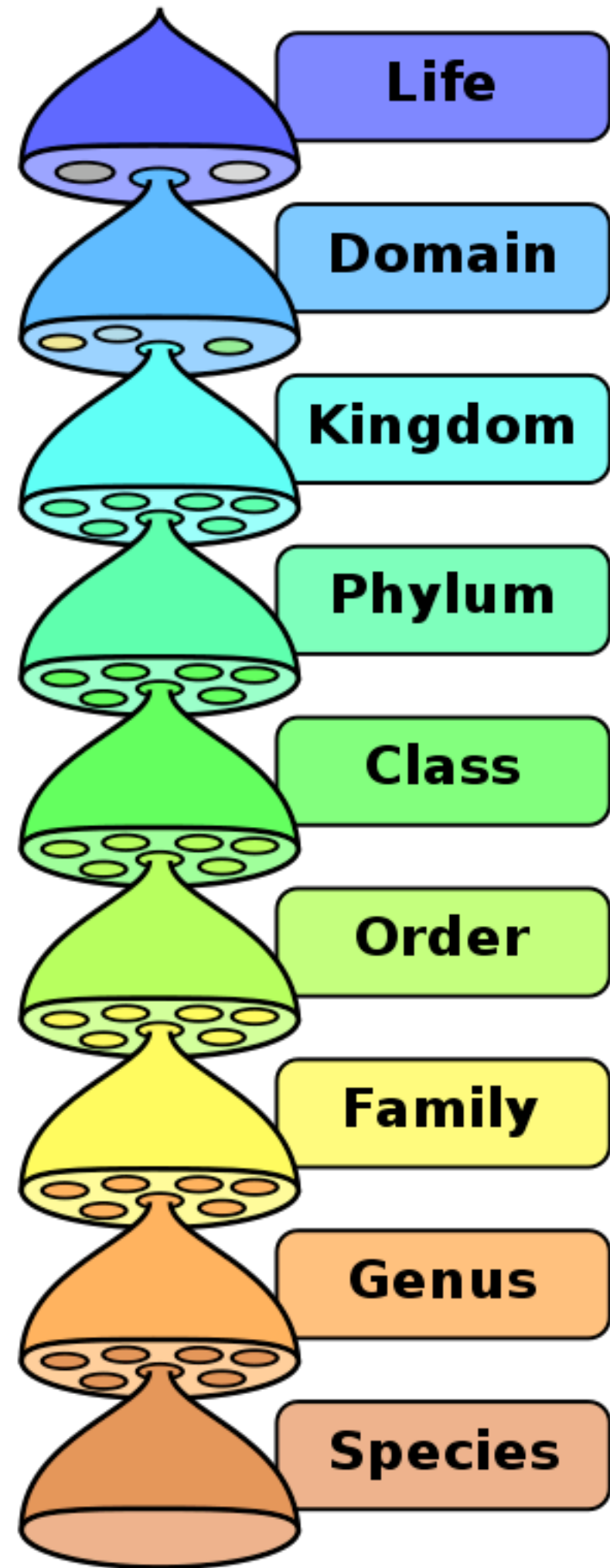
# Algorithms for Reconstruction and Analysis

Nhan Tran for ARA  
Dec 2, 2019

# ARA

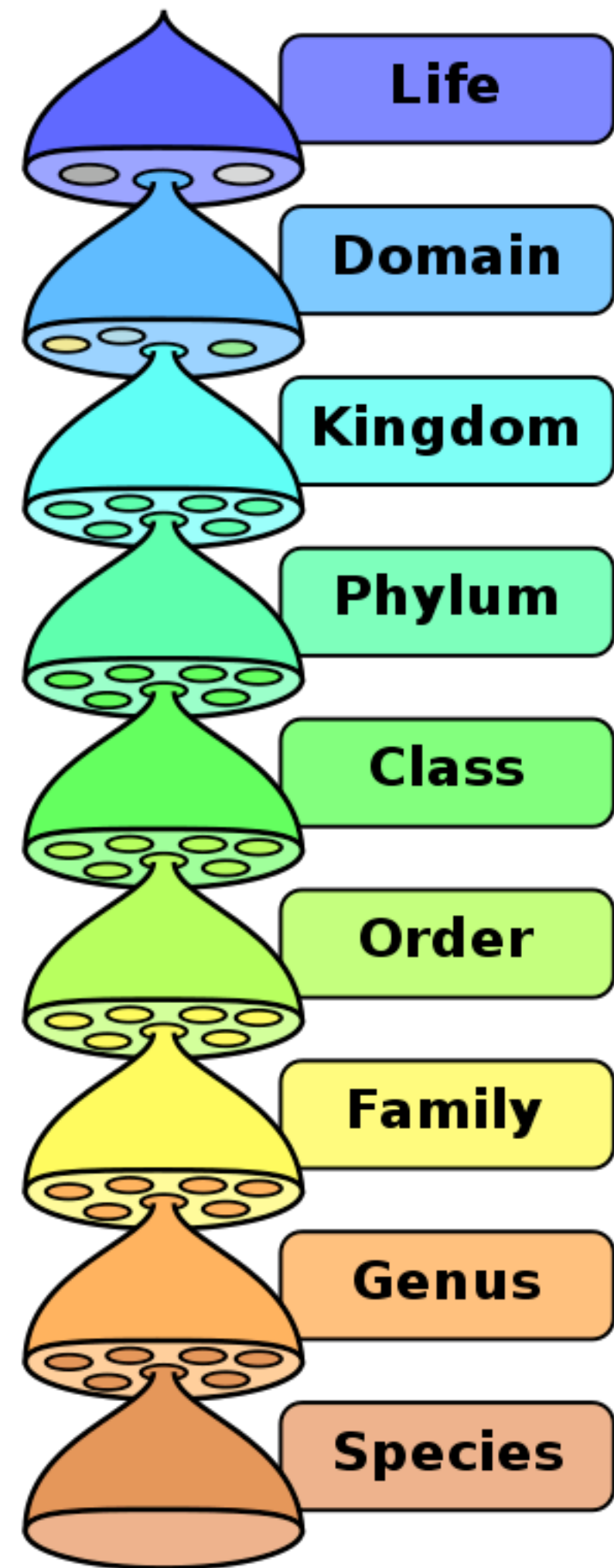
***Ara*** is a [neotropical](#) genus of [macaws](#)<sup>[1]</sup> with eight [extant](#) species and at least two [extinct](#) species.<sup>[2]</sup>

# ARA



{ *Ara* is a neotropical genus of macaws<sup>[1]</sup> with eight extant species and at least two extinct species.<sup>[2]</sup>

# ARA



**Life**

*Executive Branch*

**Domain**

*DOE*

**Kingdom**

*Office of Science*

**Phylum**

*Fermilab*

**Class**

*CD*

**Order**

*SCD*

**Family**

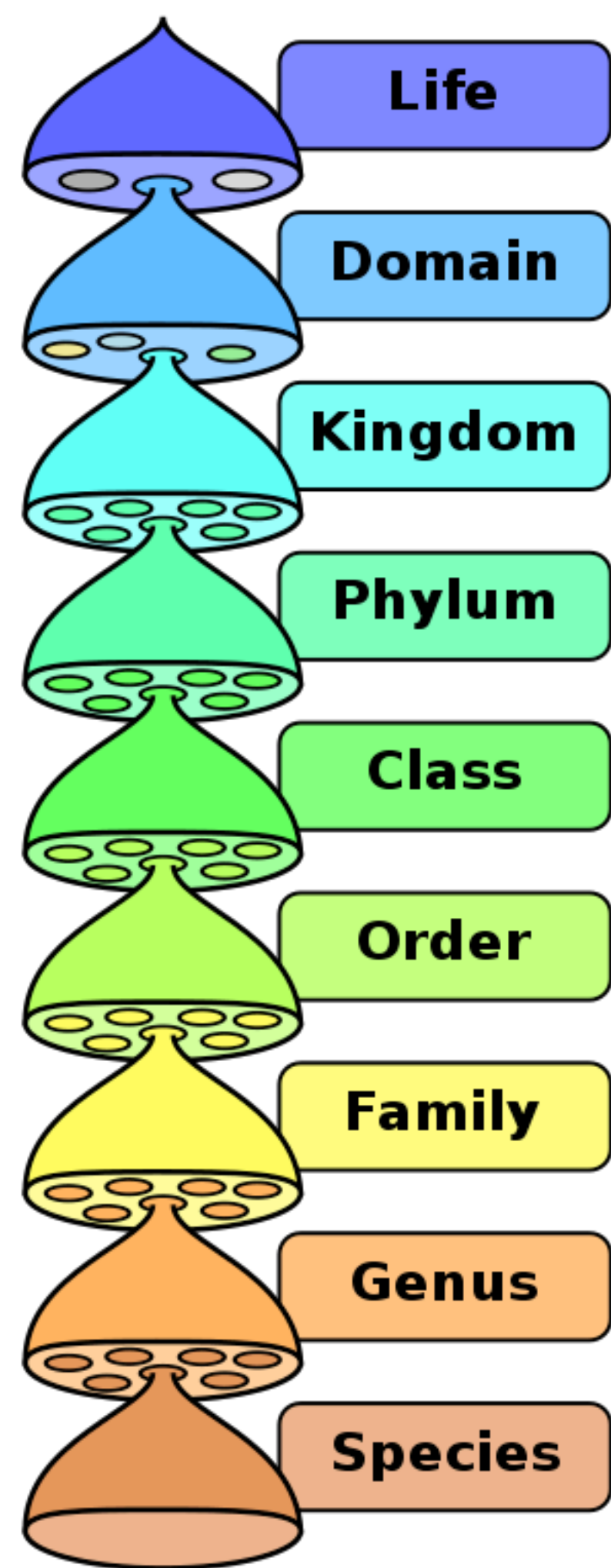
*AISP*

**Genus**

{ *Ara* is a neotropical genus of macaws<sup>[1]</sup> with eight extant species and at least two extinct species.<sup>[2]</sup>

**Species**

# ARA



*Executive Branch*

*DOE*

*Office of Science*

*Fermilab*

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*SCD*

*AISP*

{ *Ara* is a neotropical genus of macaws<sup>[1]</sup> with eight extant species

## ALGORITHMS RECONSTRUCTION & ANALYSIS (ARA)

N. Tran, Group Leader  
A. Alba Hernandez (intern)

S. Berkman

G. Cerati

J Goncalves Cadeira

L. Gray

A. Hall

R. Kutshcke

K. Lato (on-call)

B. Nord

K. Pedro

M. Wang

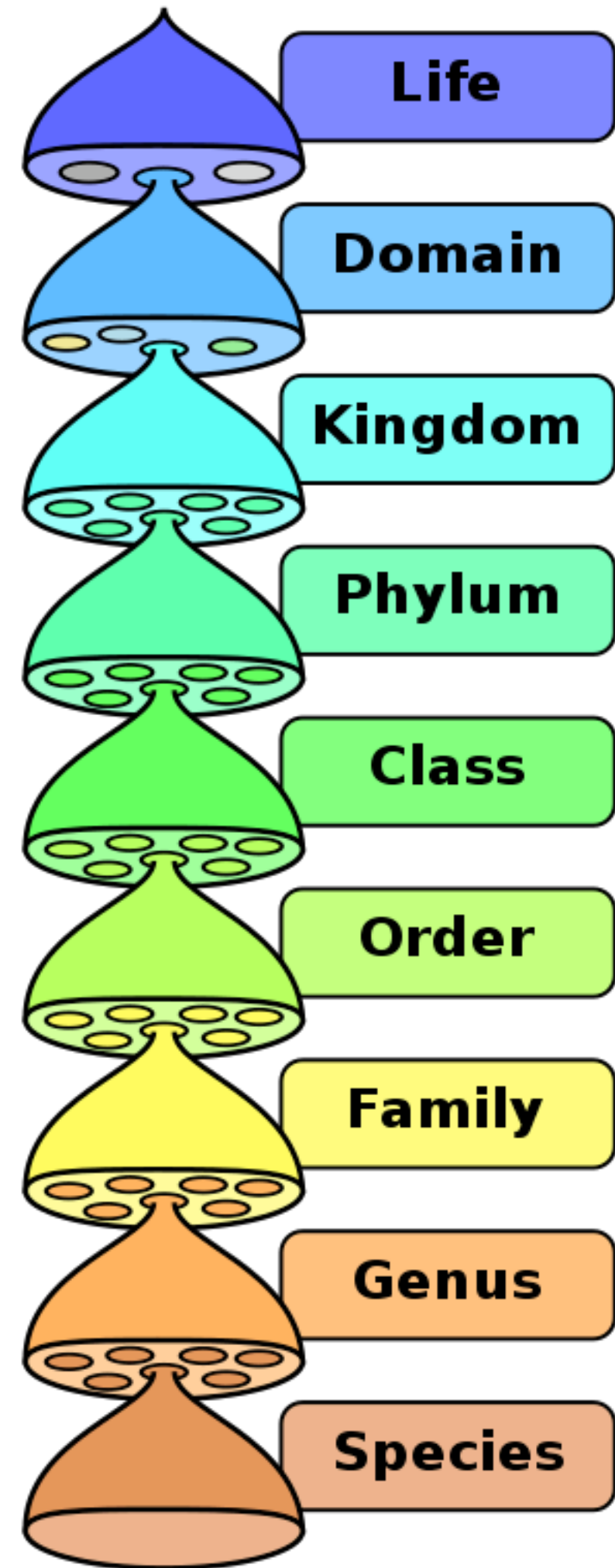
M. Wospakrik

(E. Snider)

(G. Perdue)

s.<sup>[2]</sup>

# ARA

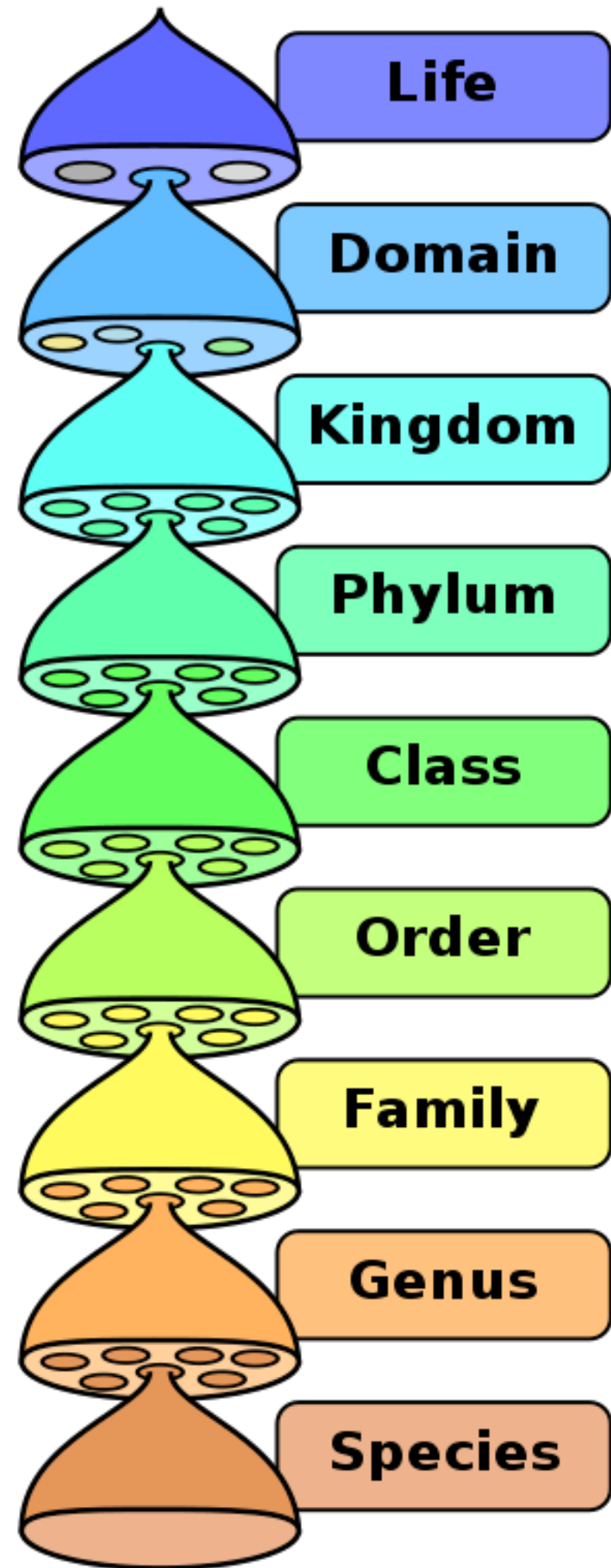


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# ARA



~~Ara is a neotropical genus of macaws<sup>[1]</sup>~~ with eight extant species

**ARA is a nearctic genus of scientists...**

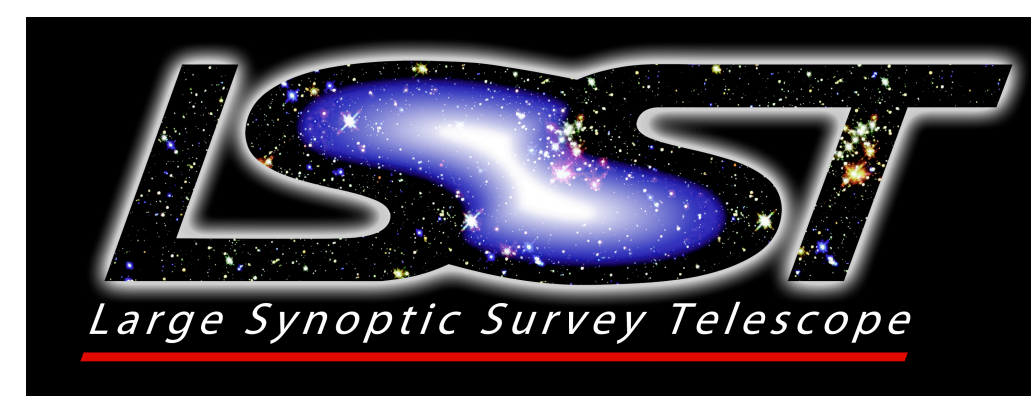
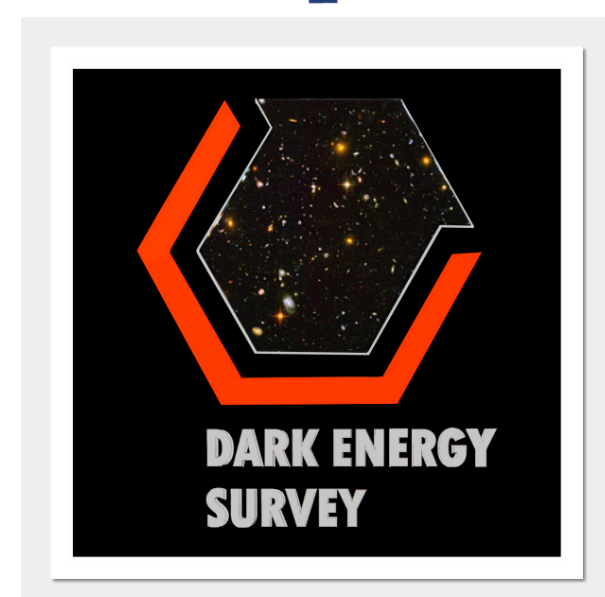
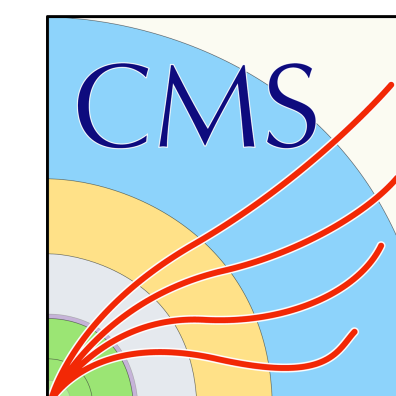
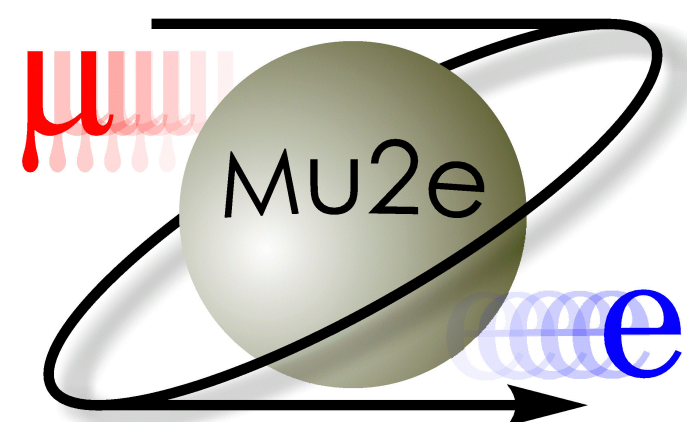
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# ARA - algorithms for reconstruction and analysis

- A wide variety of applications and techniques for reconstruction and analysis
  - Making new algorithms
  - Making current algorithms more (computationally) efficient
  - Connecting algorithms in software framework/pipeline



*... and counting!*



## MIR (→ ARA) highlights

- neutrinos/mu2e (Berkman, Cerati, Kutschke, Perdue, Snider, Wospakrik, Wang)
  - LArSoft:
    - **Large-scale data production campaigns for ProtoDUNE, ICARUS, and MicroBooNE**
    - Making code thread-safe (large workflows and improved efficiency), migrate to GitHub
    - LArSoft workshop well-attended by SCD and neutrino community
  - SciDAC work: implemented improvements in hit finder with parallelization/vectorization; SBNFit fitting framework on HPC
  - General development, support, coordination of reconstruction across neutrinos
    - e.g. First data-driven energy calibration of  $\mu$ BooNE with  $\pi^0 \rightarrow \gamma\gamma$  (joint with ND)  
<https://arxiv.org/abs/1910.02166>
- cosmic (Nord, Caldiera)  
<https://arxiv.org/abs/1810.01483>
  - New study in deploying AI for CMB de-noising  
Papers in review: galaxy mergers, strong lens regression, SZ signal cluster detection
  - LDRD for deep learning pipelines in HEP; JTFI grant for telescope scheduling/controls

# MIR (→ ARA) highlights

- CMS/LHC (Cerati, Gray, Hall, Pedro, Tran)
  - mkFit parallelized track fitter – adapting Kalman Track fitter to SIMD architectures  
<https://arxiv.org/abs/1906.11744>
  - Graph Neural Networks for Calorimetry LDRD: new ML architectures to learn representations from higher dimensional non-Euclidean detector inputs
  - Accelerated machine learning as a Service using FPGAs with Microsoft  
<https://arxiv.org/abs/1904.08986>
  - COFFEA - an efficient columnar analysis framework
- High velocity AI grant (DOE) to accelerate inference and training for uncertainty quantification
- ExaTrkX project kicking off: advanced track finding and pattern recognition with ML, building off of successful HepTrkX

# ARA - algorithms for reconstruction and analysis

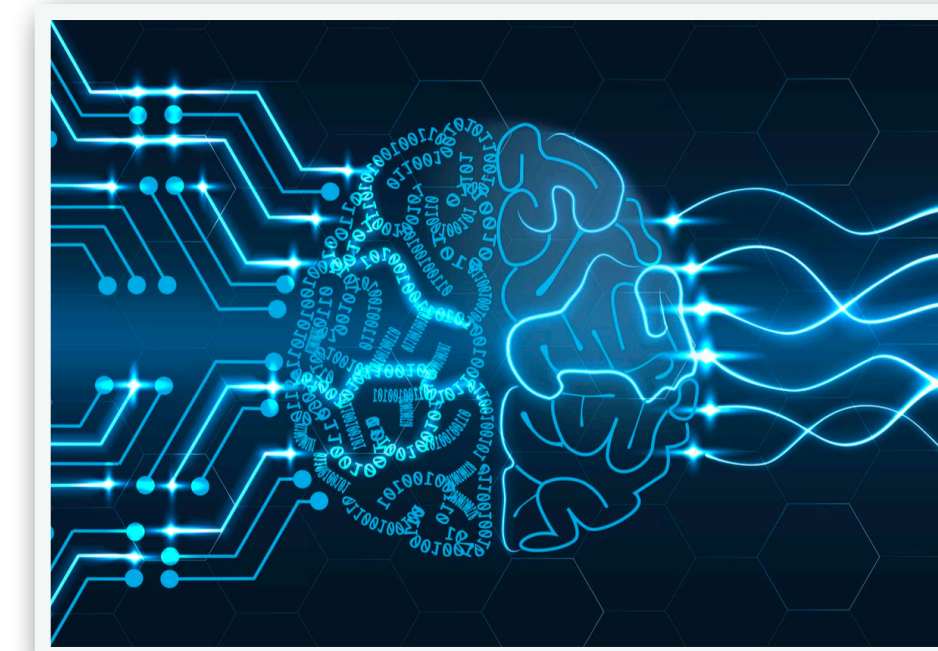
- A wide variety of applications and techniques for reconstruction and analysis
  - Making new algorithms
  - Making current algorithms more (computationally) efficient
  - Connecting algorithms in software framework/pipeline
- Considerations:
  - Physics performance (and knowledge)
  - Efficient algorithms for modern computing architectures
    - Modern chip architectures, multi-core/thread, heterogeneity
  - Ease and accessibility

# Computing architecture evolution

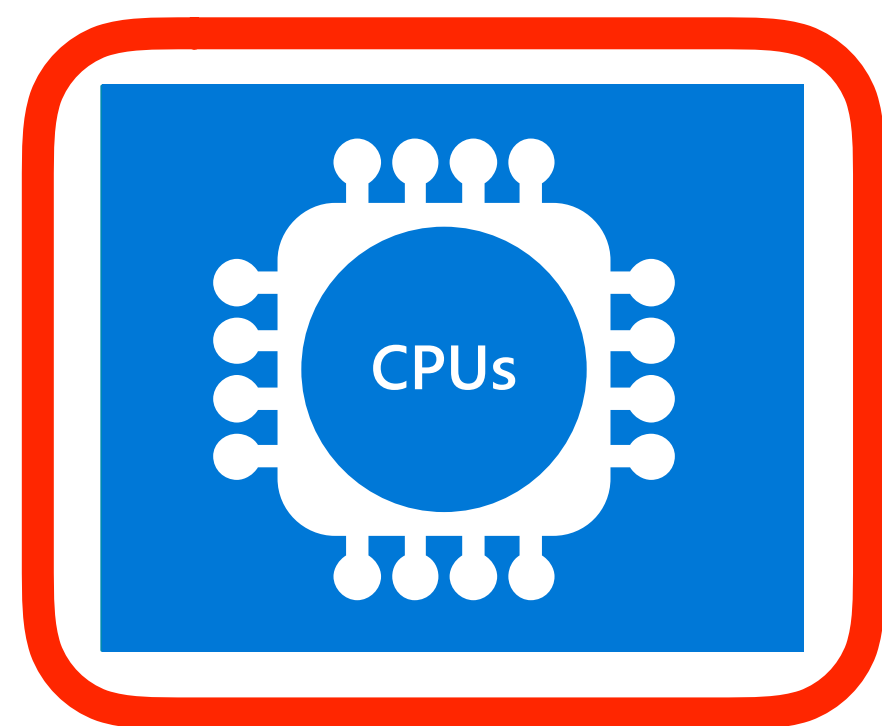


This block contains a collage of images representing modern computing hardware and services. On the left, there is an NVIDIA GPU Cloud logo and a Titan X graphics card, and an AMD Radeon Instinct graphics card. In the center, there is an IBM Power9 CPU connected to a Xilinx UltraSCALE+ FPGA via a PCI Express Gen 4 interface. Below this, there is an Intel logo on a chip, an AWS F1 logo, and a photograph of a server board. On the right, there is a Google Tensor Processing Unit (TPU) and an Apple A12 Bionic chip.

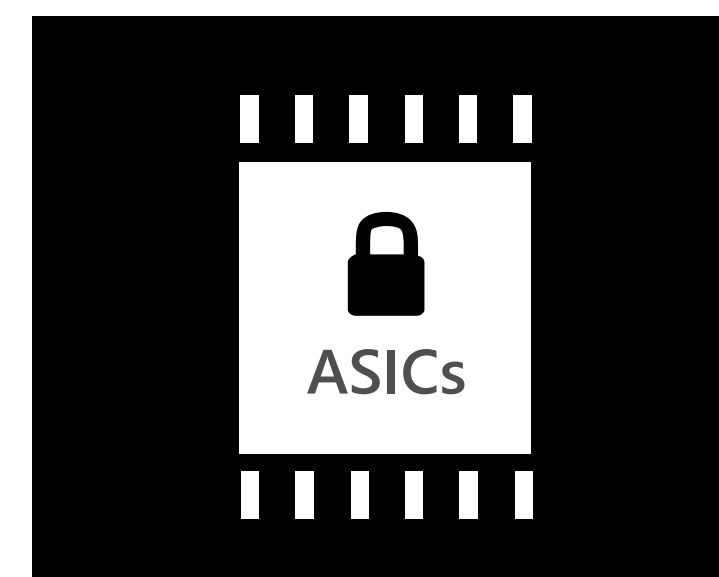
Advances in heterogeneous computing driven by **machine learning**



# Computing architecture evolution

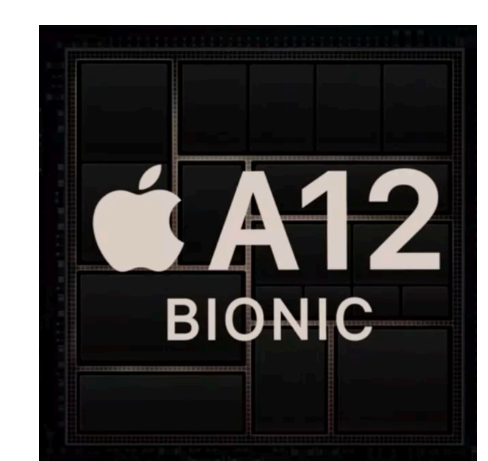
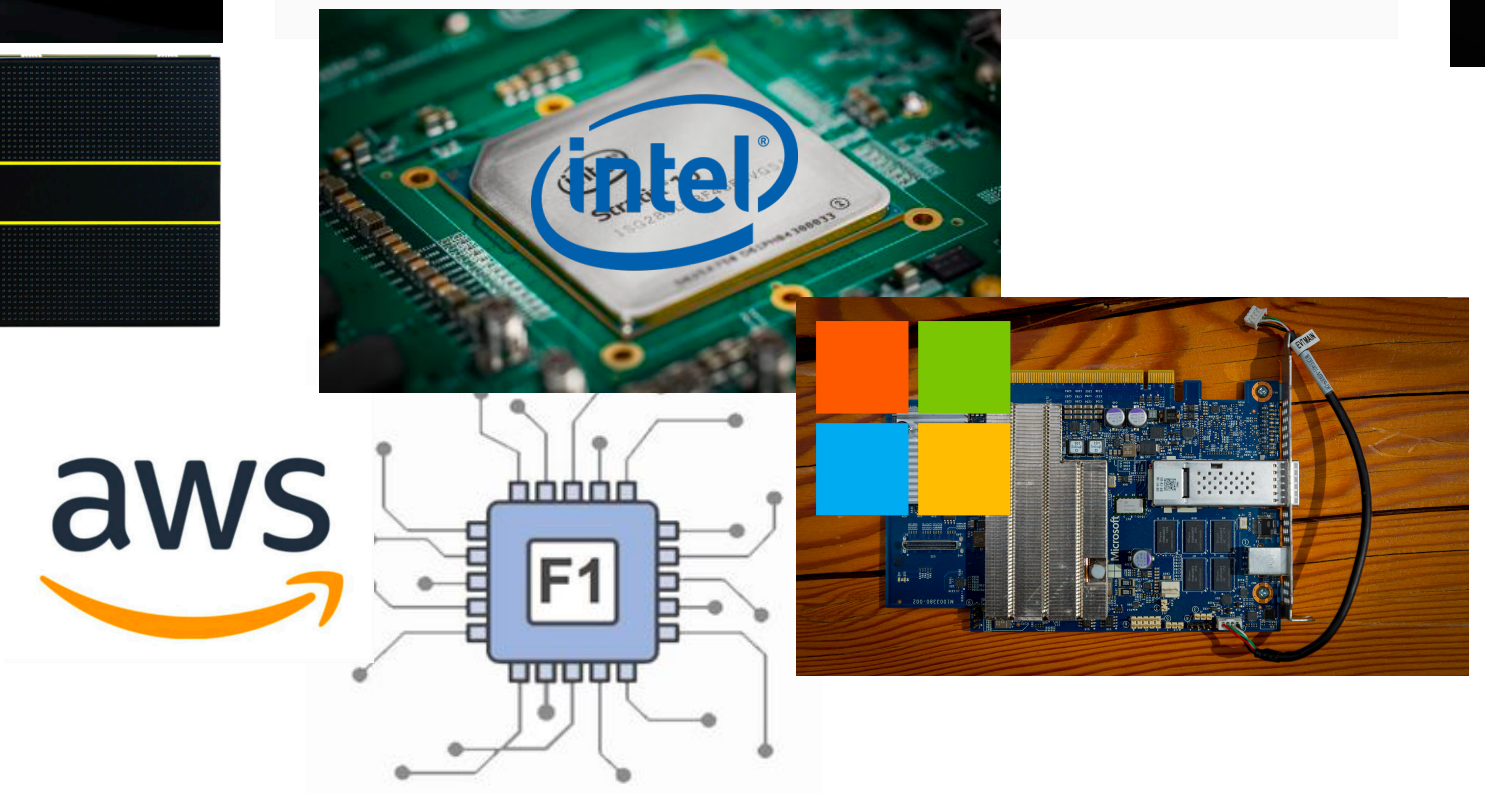
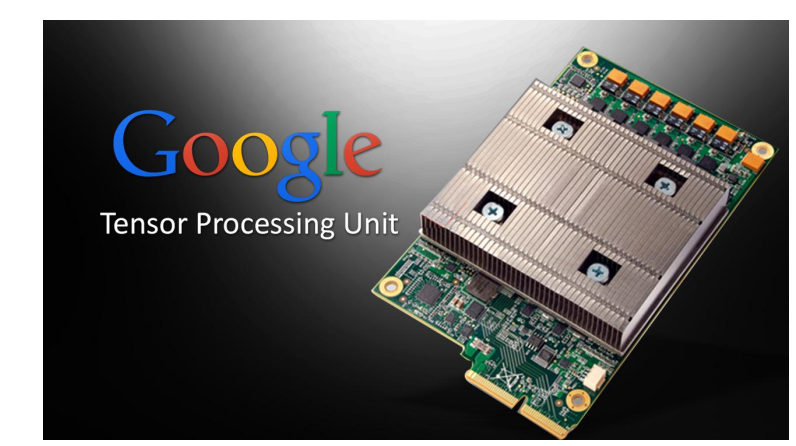
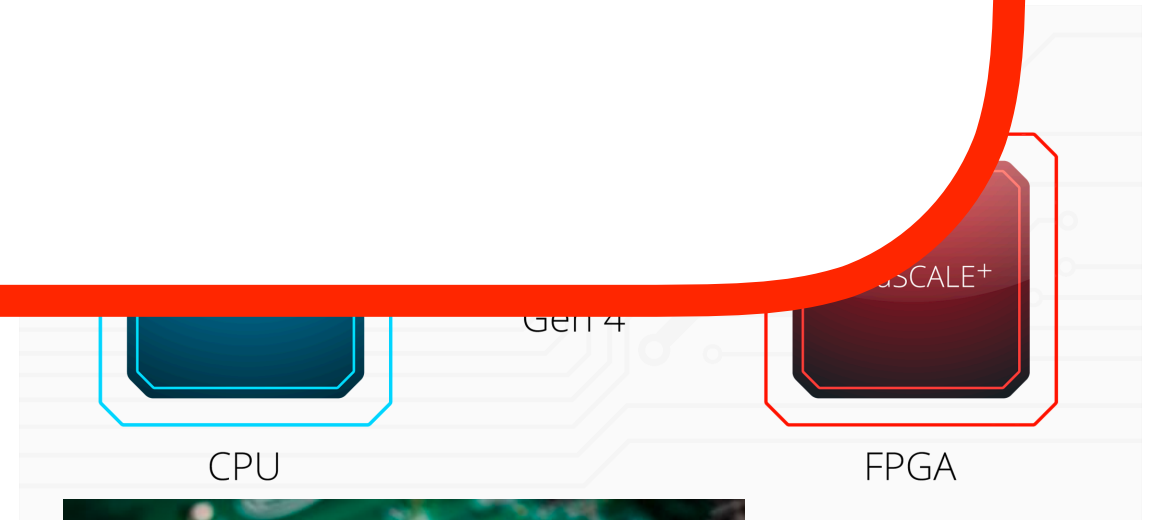
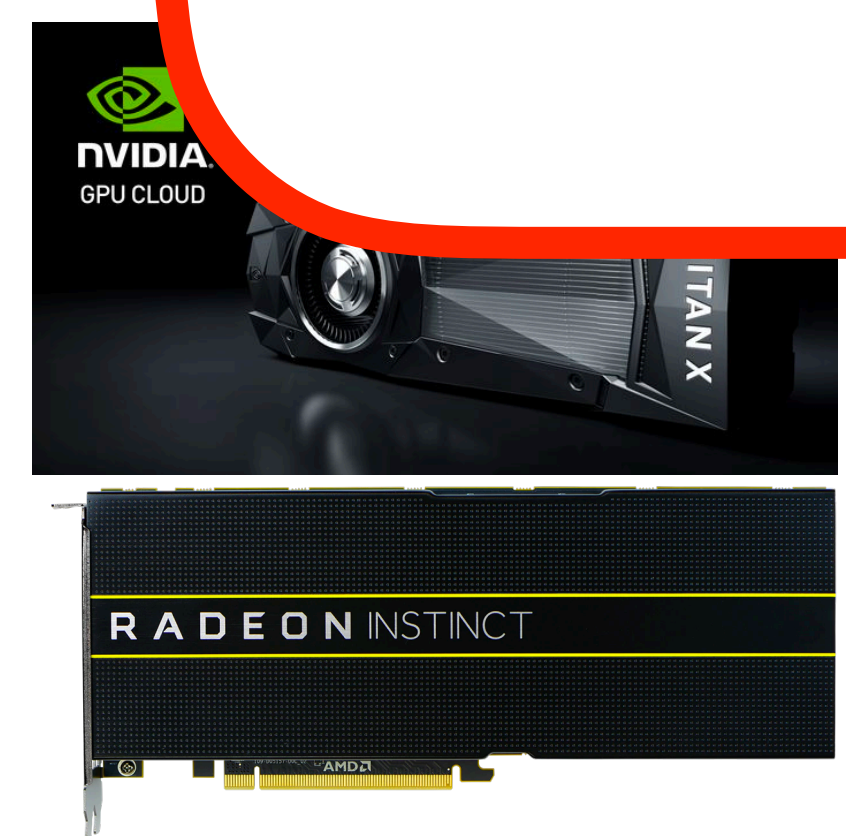


Still the workhorse...  
Many active projects showing large gains optimizing "traditional" hardware

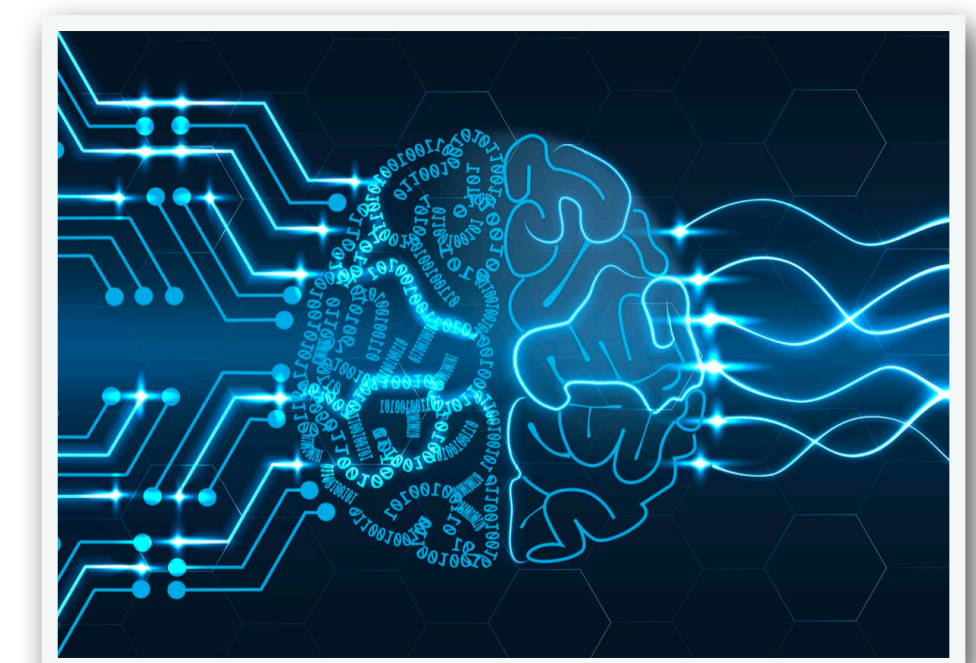


FLEXIBILITY

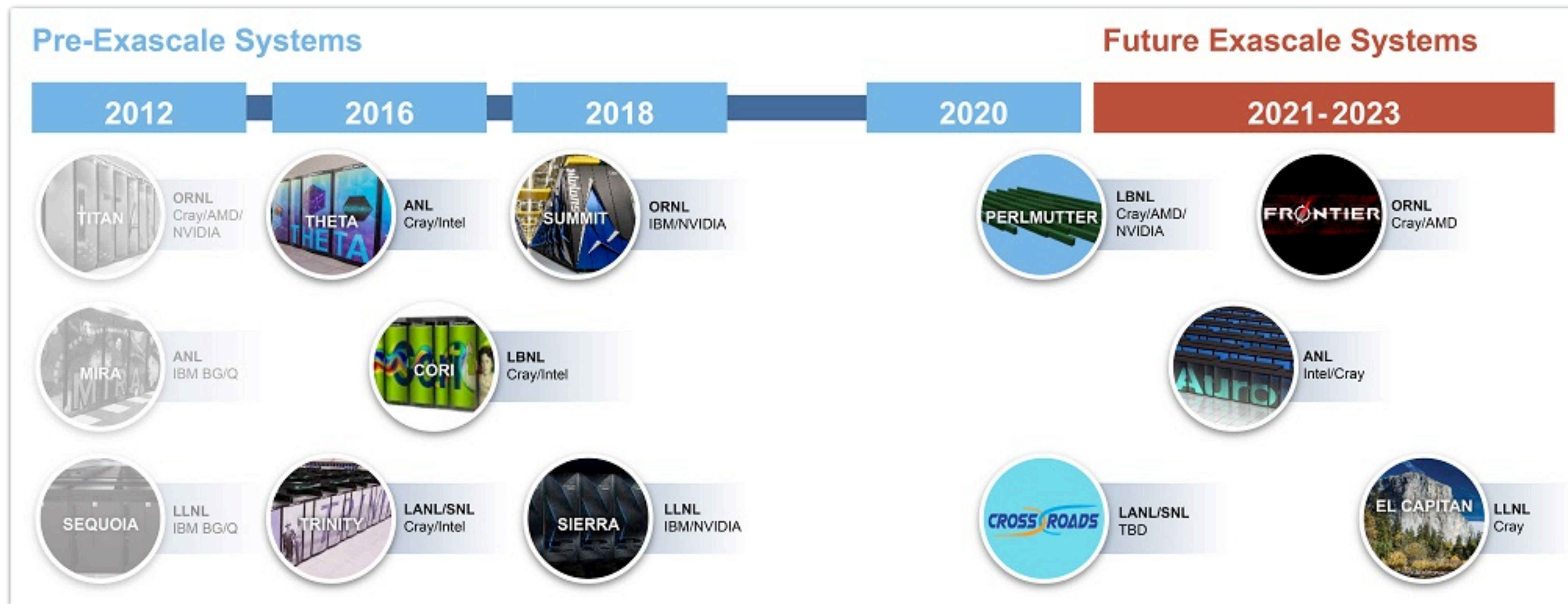
EFFICIENCY



Advances in heterogeneous computing driven by machine learning



# Computing architecture evolution



We should understand how to utilize HPC systems ... but let's understand what our optimal solution is and if possible, how we can use HPC resources. (personal opinion)

# Optimization approach

**Re-engineer physics algorithms  
for new hardware**

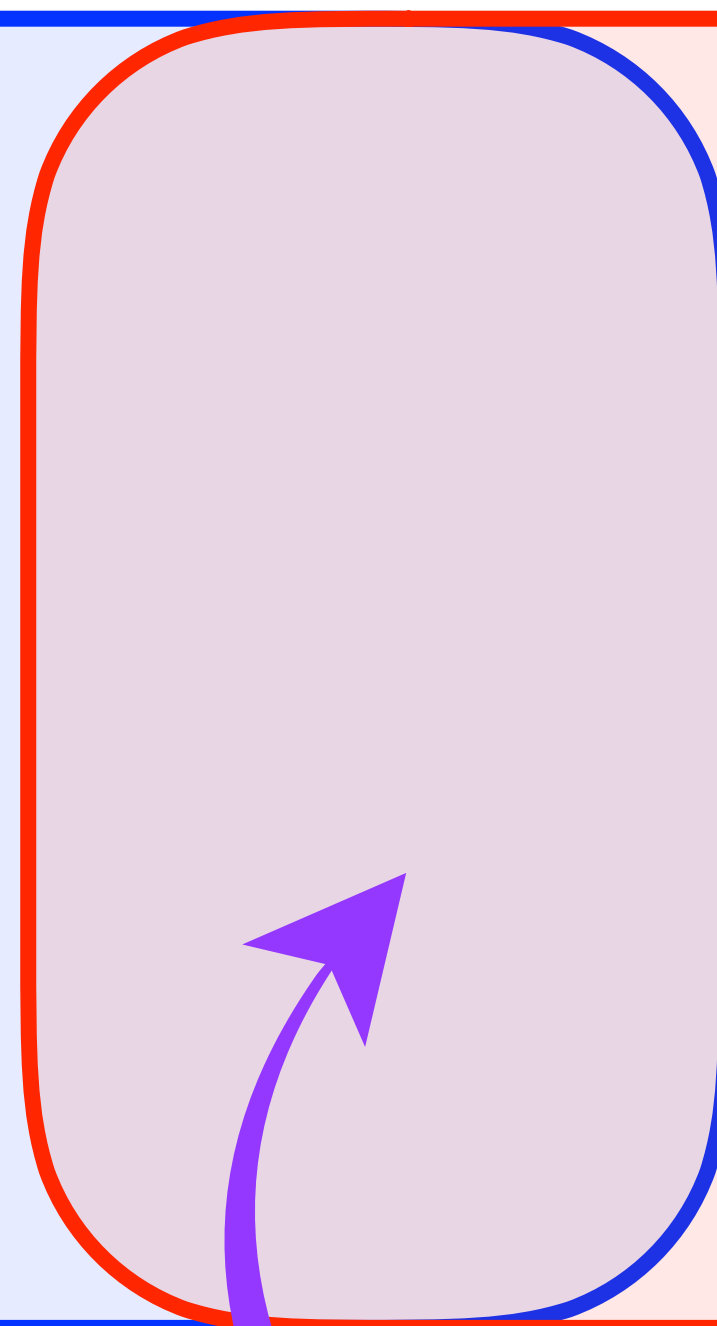
Language: OpenCL, OpenMP, HLS, ...?

Hardware: CPU, FPGA, GPU

**Re-cast physics problem as a  
machine learning problem**

Language: C++, Python  
(TensorFlow, PyTorch,...)

Hardware: CPU, FPGA, GPU, ASIC



*Is there a way to have the best of both worlds?*

# Opportunities and challenges ahead!

