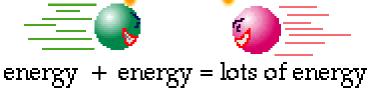
## **Computing in HEP and Its Future**

KAIST-KAIX Workshop for Future Particle Accelerators July 8 - 19, 2019

> Jaehoon Yu University of Texas at Arlington

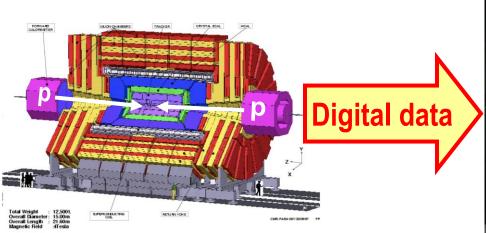
Heh-heh. I have a lot of kinetic energy!



## What does Computing do in HEP?

- High Level Event Triggering
- Data Recording
- Data Reconstruction and Processing

   PID and pattern recognition
- Data Storage and Access
  - Selection and streaming
- Data Analysis
- Simulations

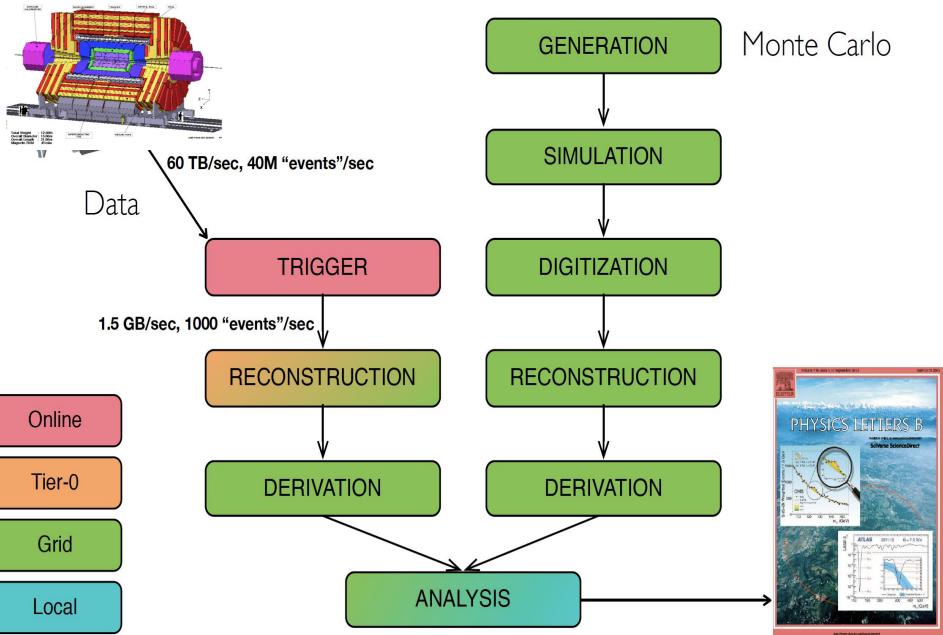








### **Chain of HEP Data**

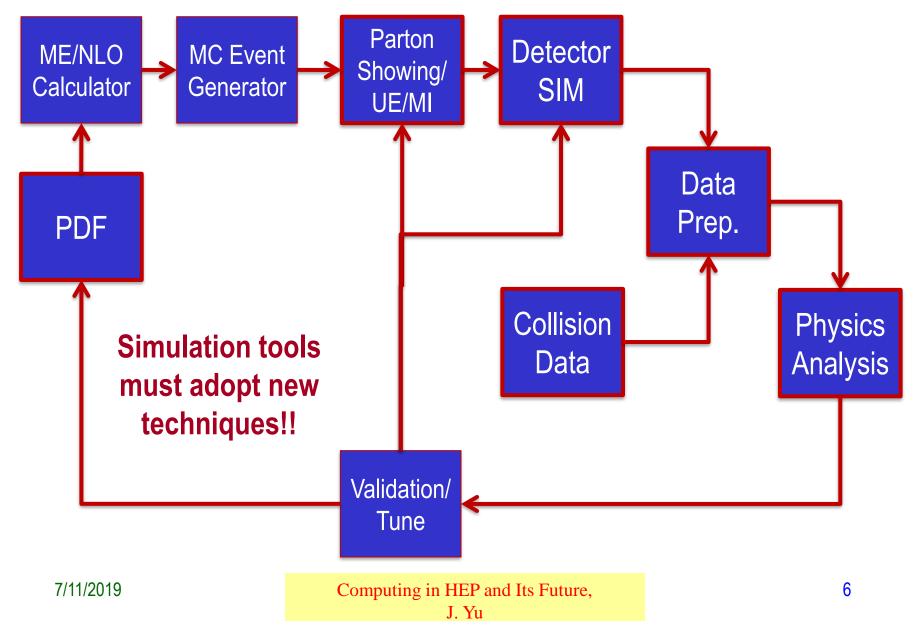


### **Factors for Computing Needs**

- Computing needs: CPU, Network bandwidths, Storage space
- Data size 
   Network bandwidths, storage space, CPU
  - Accelerator capabilities  $\rightarrow$  CMS energy and luminosity
  - Detector capabilities → number of channels, data zero suppression, trigger reduction factor, etc → Event size
  - Data output rates
    - Manner of triggering (triggered or continuous readout)
- Data reconstruction and analysis software 

   Storage and CPU
- Data analysis activities 
   Network bandwidths, storage, CPU
- Amount of simulated data → Storage, CPU
  - Detector design & performance studies
  - Background studies
  - Signal simulation and phase space scanning 7/11/2019 Computing in HEP and Its Future,

#### **Simulation Tool Iteration Process**



#### The Problem

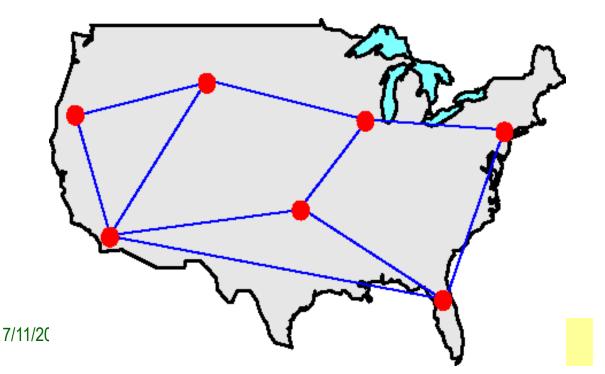
- Detectors are complicated and large 
   Need large 
   number of collaborators
  - They are scattered all over the world!
  - How do we get them communicate quickly and efficiently?
  - How do we leverage collaborators' capabilities?
  - How do we get all the compute resources?
- Data size is large, expected to be EB's
  - Where and how to store the large amount of data?
  - How do we allow collaborators scattered all over the world to access data in an efficient fashion?

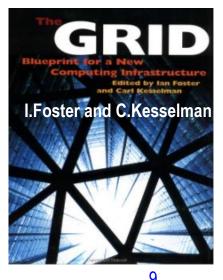
### The Problem, cont'd

- How do we allow people's analysis jobs to access data and make progress rapidly and securely?
  - What is the most efficient way to get jobs' requirements matched with resources?
  - Should jobs go to data or data go to jobs?
  - What level of security should there be?
- How do we allow experiments to reconstruct data and generate the large amount of simulated events quickly?
  - How do we garner the necessary compute and storage resources?
  - What network capabilities do we need in the world?
- How do we get people to analyze at their desktops?

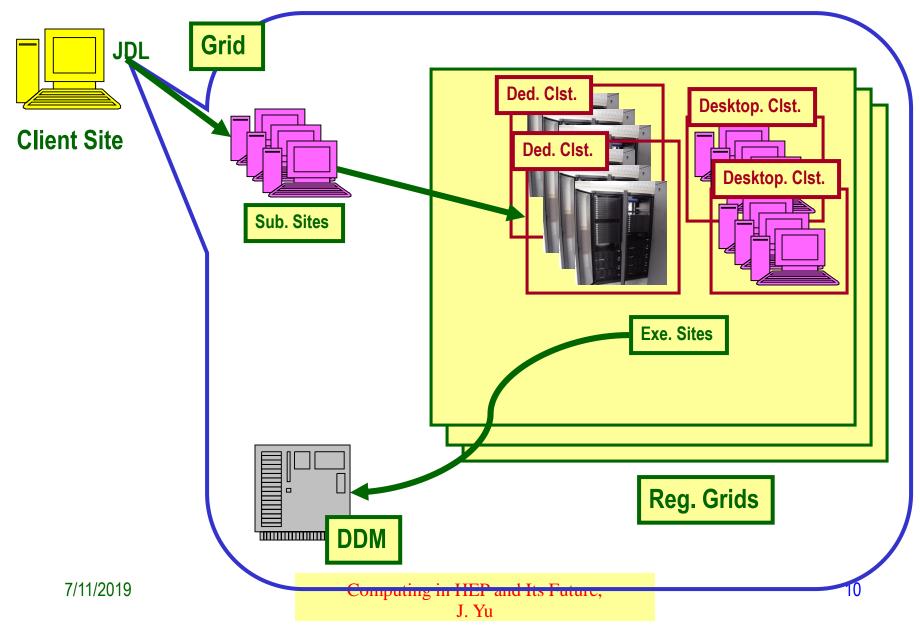
#### What is the Computing Grid?

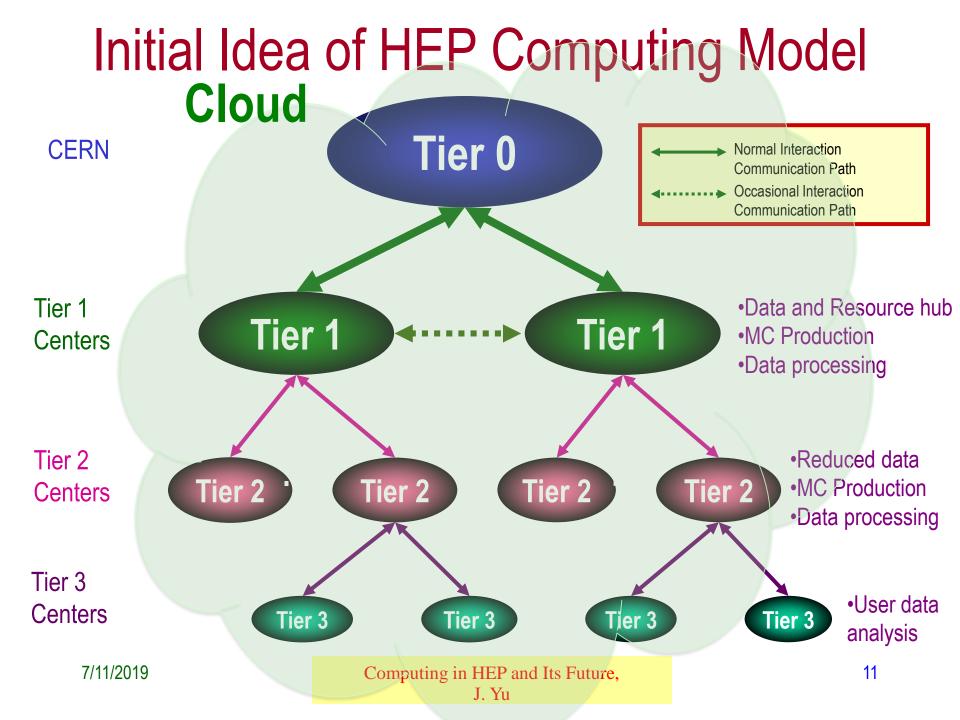
- Grid: Geographically distributed computing resources configured for coordinated use
- Physical resources & good network provide hardware capability
- The "Middleware" software ties it together → data distribution, job managements, security, etc
- HEP drove the initial development and implementations



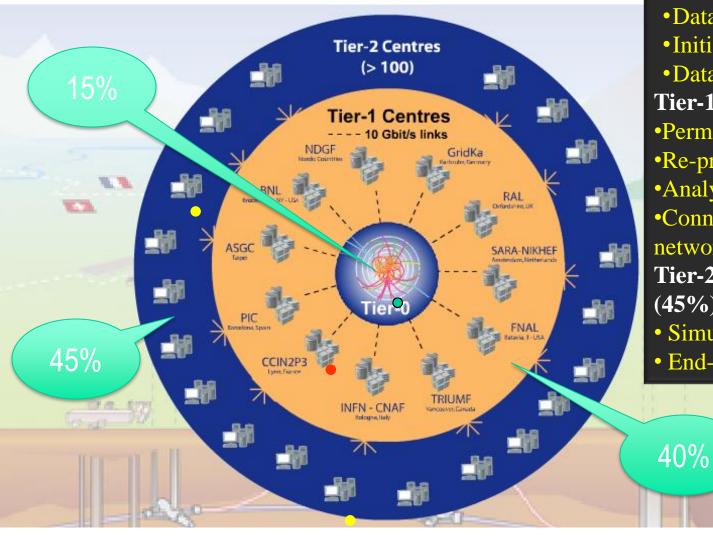


#### How does a computing Grid work?





#### Implemented LHC Grid Structure



**Tier-0 (CERN): (15%)** •Data recording •Initial data reconstruction •Data distribution **Tier-1 (11 centres): (40%)** •Permanent storage •Re-processing •Analysis •Connected by direct 10 Gb/s network links Tier-2 (~200 centres): (45%)• Simulation • End-user analysis







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#### Tiered Example – US Cloud **BNLT1** GLT2 MW T2 NE T2 SWT2 SLAC T2 UC, IU BU, HU UM, MSU UTA, OU Tier 3's IU OSG UTA T3 OU Oscer Wisconsin UC Teraport UTD LTU Many more T3s SMU/UTD 7/11/2019 Computing in HEP and Its Future, J. 13 Yu

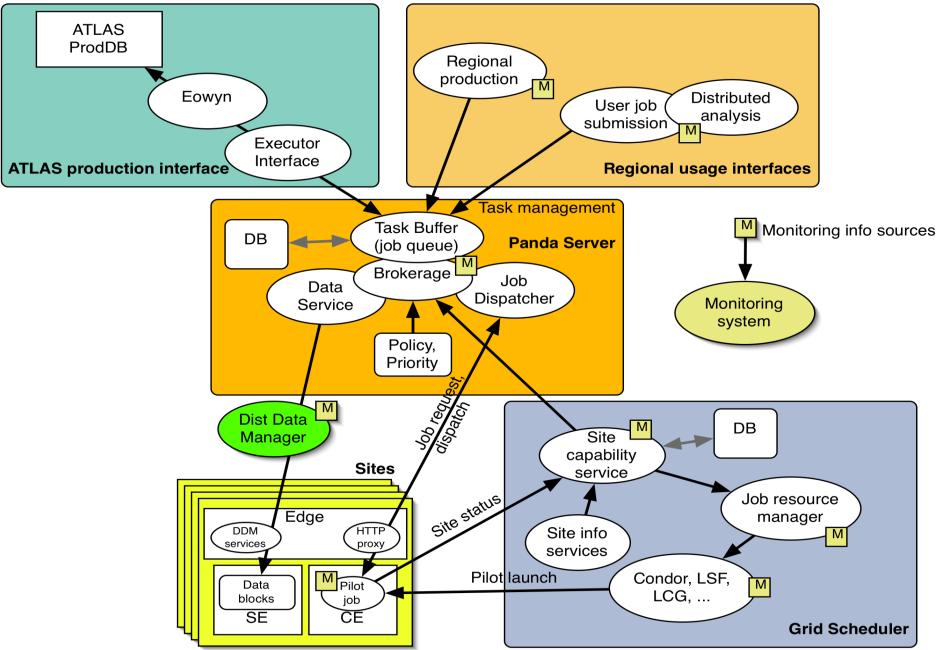
#### ATLAS Production and Distributed Analysis System, Panda

- Designed for analysis as well as production
- Work both with OSG and EGEE/LCG
- A single task queue and pilots
  - Apache-based Central Server



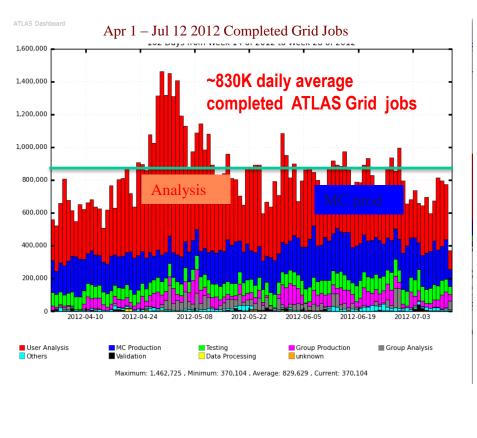
- Pilots retrieve jobs from the server as soon as CPU is available low latency
- Highly automated, has an integrated monitoring system, and requires low operation manpower
- Integrated with ATLAS Distributed Data Management (DDM) system
- Not exclusively ATLAS and HEP but other disciplines use, too

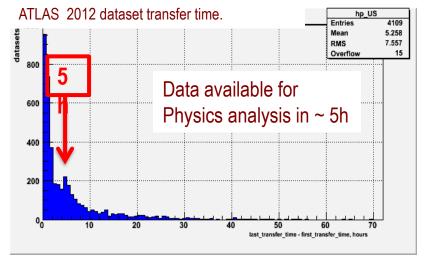
#### **ATLAS Panda Architecture**



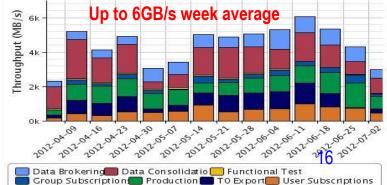
#### The Little Grid that could...

- ATLAS Distributed Computing on the Grid : 10 Tier-1s + CERN + ~70 Tier-2s +...(more than 80 Production sites)
- High volume, high throughput process through fast network!!





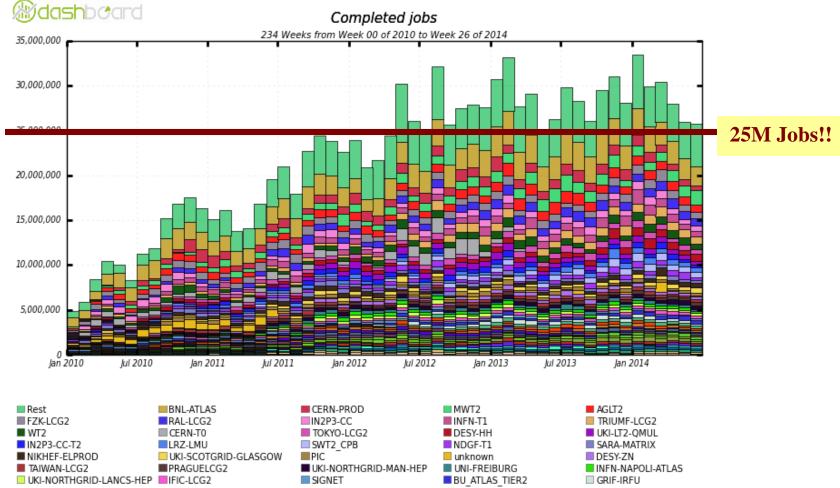




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#### **PanDA Performance**



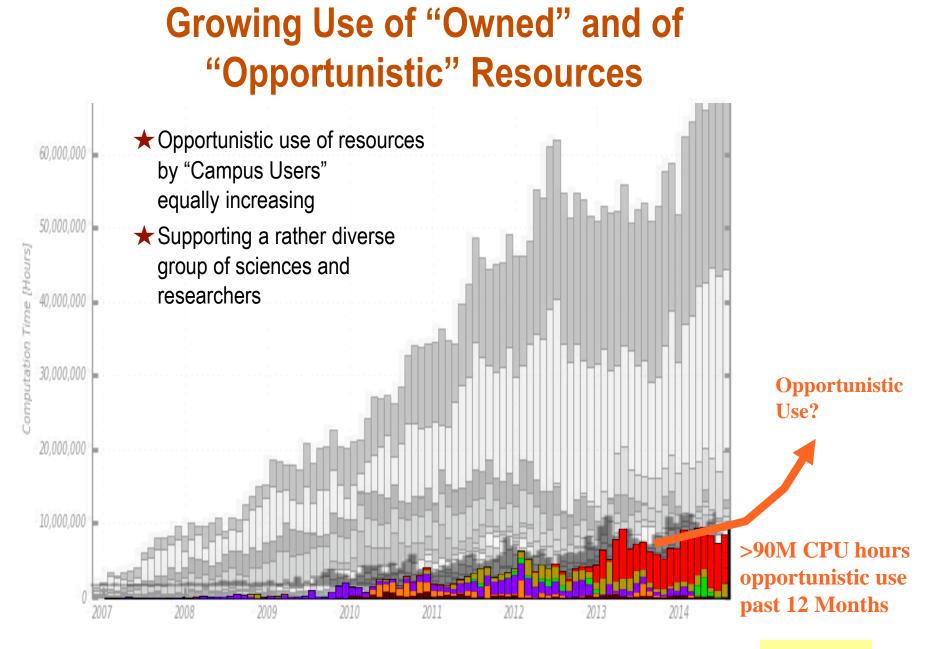
Current scale – 25M jobs completed every month at >hundred sites First exascale system in HEP – 1.2 Exabytes processed already in 2013

Kaushik De

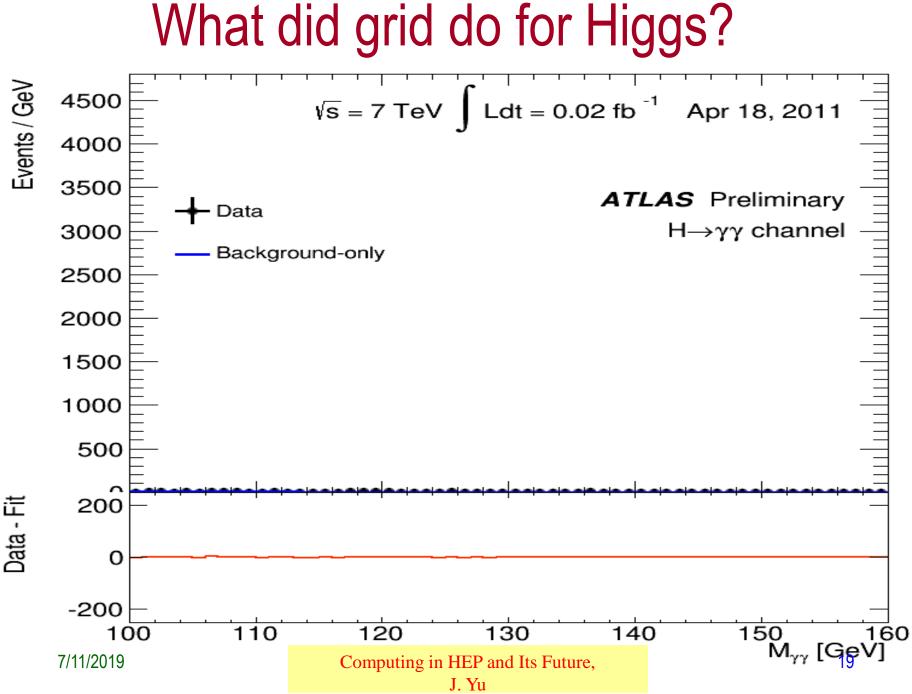
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Lotha



#### Now the industry picked up..

#### Early 90's

1996

1998

| <text><text><text><text><text><text><text><text></text></text></text></text></text></text></text></text> | 2004<br>facebook。   |
|--|---------------------|
| amazon   | <b>Shedoo</b>       |
|  | 2006 <b>Lwitter</b> |

Many private entities fully utilized the internet communication we've developed to multi-trillion dollar venture!!

HEP working with industry to rent the commercial compute resources for data and simulation processing

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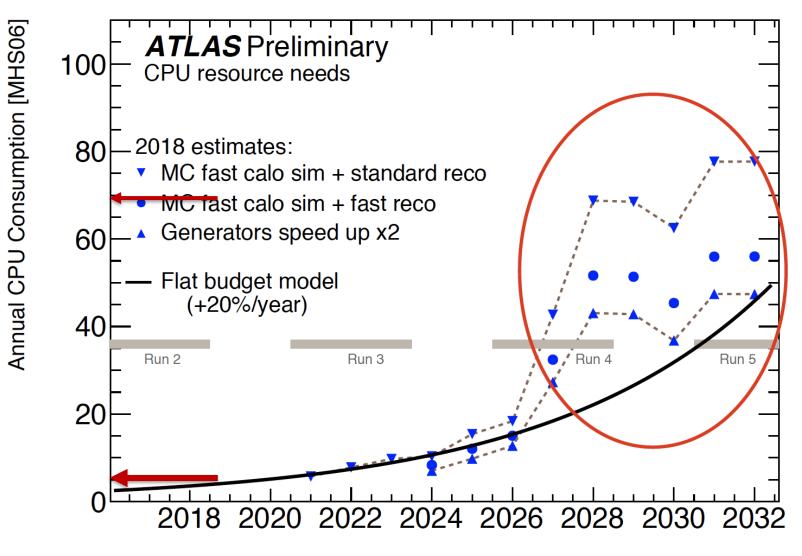


EC<sub>2</sub>

### What would be the next?

- Grid computing infrastructure has served well thus far
   1000's of users process 10s of EBs of data & 10<sup>9</sup> of jobs
- Upcoming experiments will further strain computing → must be much more efficient and speedy

#### **Expected ATLAS Computing Needs**



V. Tsulaia

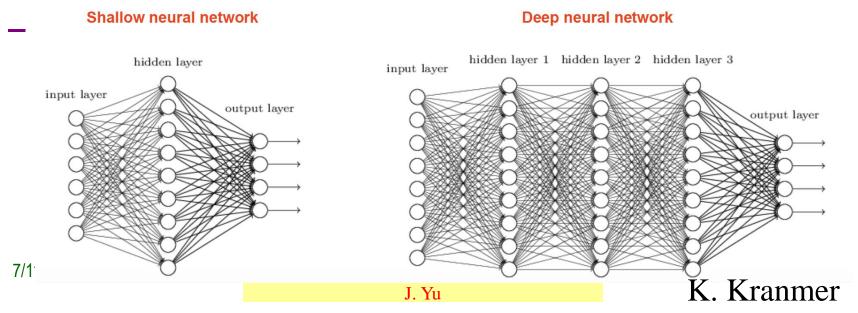
Year 2

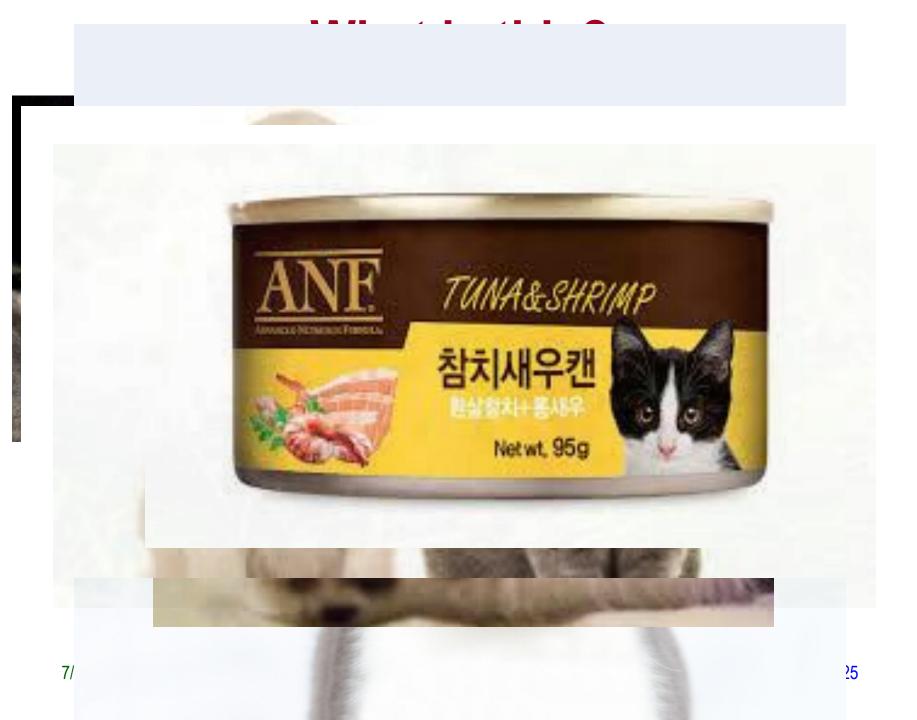
### What would be the next?

- Grid computing infrastructure has served well thus far - 1000's of users process 10s of EBs of data & 10<sup>9</sup> of jobs
- Upcoming experiments will put further strain computing -> must be much more efficient and speedy
- Deep Learning or Machine Learning technology improving fast
- Unlike Computing Grid technology where HEP lead the initial • concept and software infra development
- Industry actively leads the ML technology
  - Very different primary goals but the same idea
  - Train machines and let it make a decision by itself
  - Not just speediest but intelligent, accurate, effective & efficient
- Many current and future HEP experiments are actively adopting ML for PID algorithms and HL triggering 7/11/2019

## What is Deep Learning?

- Artificial Intelligence technology
  - Possible thanks to the dramatic improvements in computing hardware, e.g. GPU and the emergence of Big Data tools
- Enables machines mimicking complicated computations performed by a brain
  - Early 2000's neural network technology could not train big networks



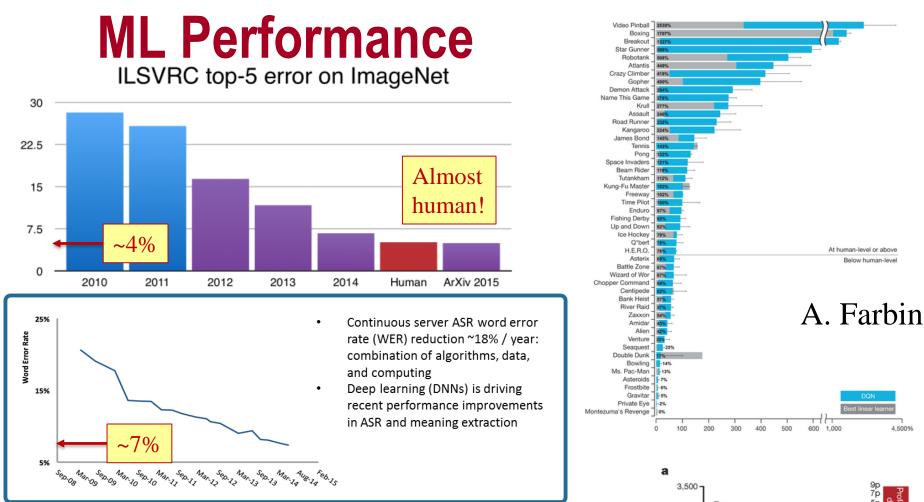


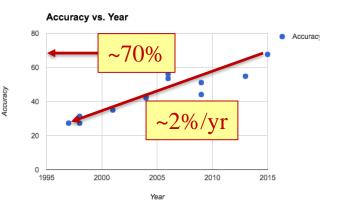
### How does an animal brain work?

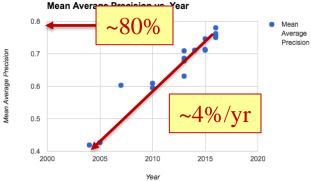
- Brain takes sensory data, build a hierarchical model of the world
  - Cells in visual cortex response specific low level features, such as color contrast or horizontal/vertical lines
  - Other cells combine low level features to identify higher level features such as geometrical shapes
  - Pattern repeats until the recognition of objects, like the chair
- A representation of the input is assembled in the brain
  - Eyes see limited window but scan around to establish the model of the surroundings → These include maps of the environment registered in the cells which light up when we are placed in it
  - These specific cells light up when we imagine specific object or location
- When a decision is made we use these models to predict the outcome of an action

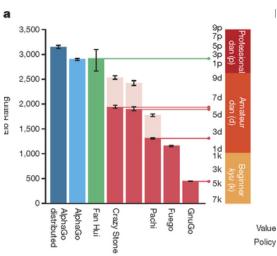
## **Artificial Neural Network**

- Biology inspired computation (1<sup>st</sup> tried in 1943)
  - Probabilistic inference of signal vs background
  - Universal Computational Theorem (1989)
- Multi-layer (or Deep) Neural Networks (DNN)
  - Idea of 1960's impractical to training → new techniques of layer-wide training
  - Feed in a big training data set and intense computations → Utilization of Big Data and GPU
- Deep Learning Renaissance w/ 1<sup>st</sup> DNN in 2014
  - Amazing success in recognition, captioning and generation of audio/image/video
  - Text analysis, Language translation, video game playing agents
  - Picking up speed in industry

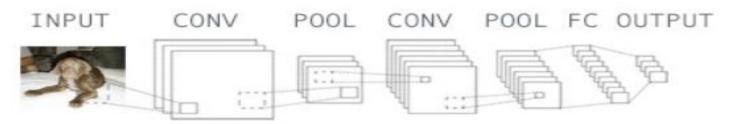


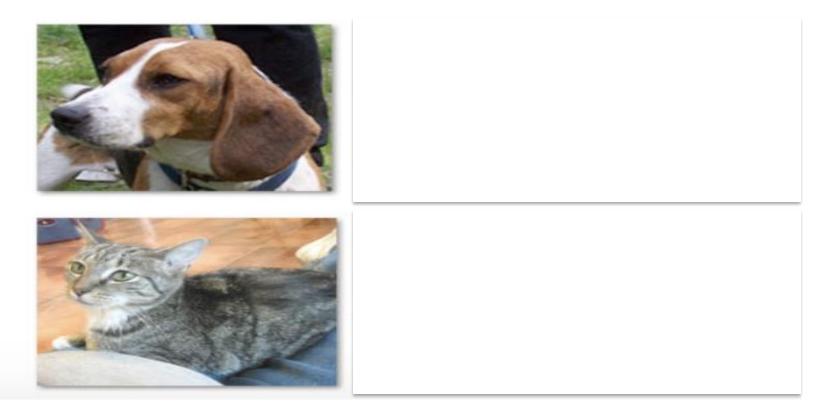






## **Current Level of ML Performance**





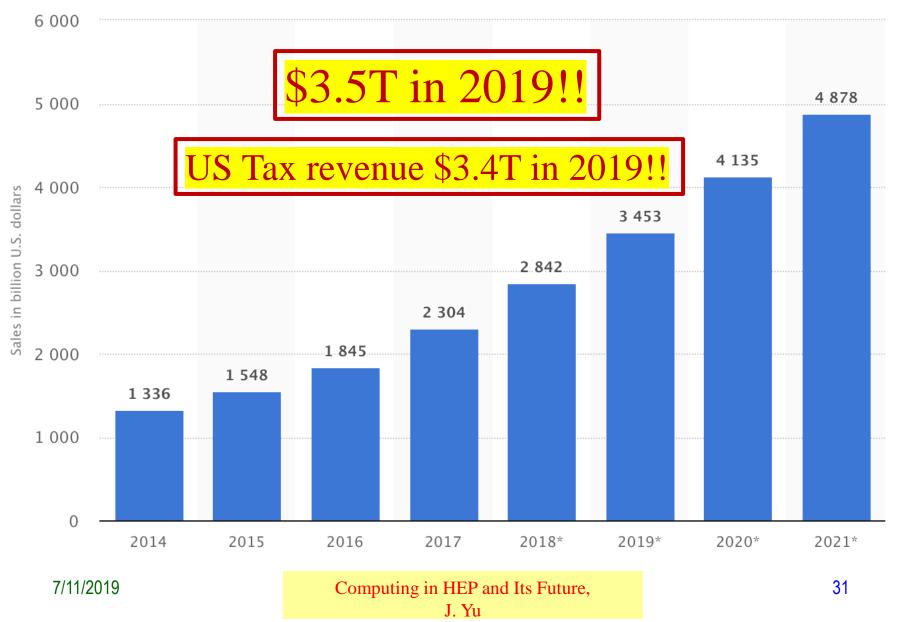
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## Conclusions

- Computing essential for particle physics
- As the amount of data gets bigger, high performance and high throughput computing vital
- HEP driven computing grid technology for hadron collider experiments, delivered necessary performance
  - Software infrastructure established and improving
  - Computing grid now outside of HEP into everyday lives
  - HEP now work together with industry to use their resources
- Powerful computing infra enables highly effective ML
  - Industry drives the development of AI (or ML or DL)
  - Must work adopting ML in preparation for future experiments
- HEP computing helps society virtually immediately <sup>7/11/2019</sup> Computing in HEP and Its Future, 30

## Impact to the World Economy



# KISTI Supercomputing Center Tour

# 9:00 – 9:45am, Friday, July 12 Meet here and depart to the center!

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