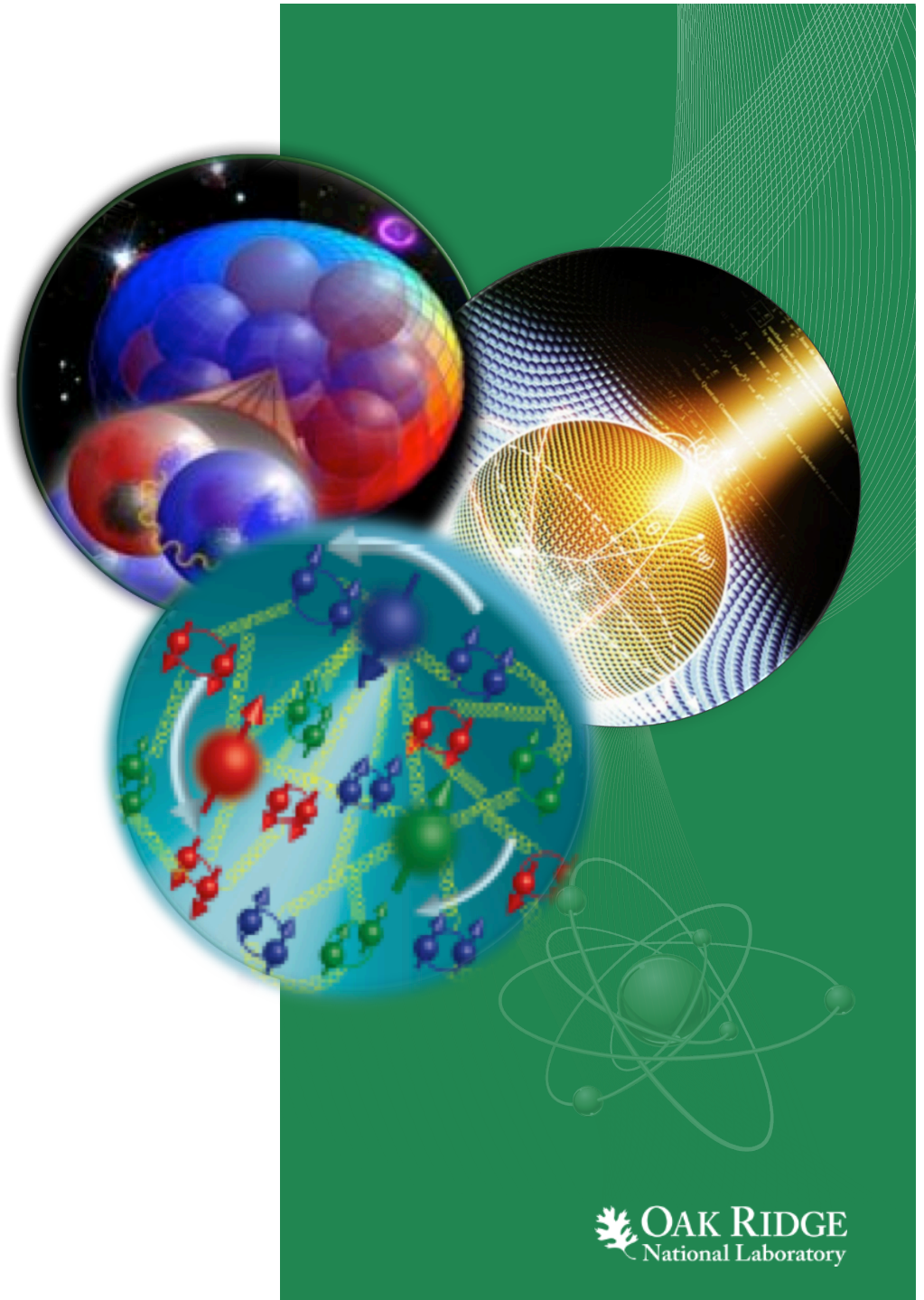


# Computational Science

**David J. Dean**  
Director, Physics Division  
ORNL

June 24, 2015

ORNL is managed by UT-Battelle  
for the US Department of Energy



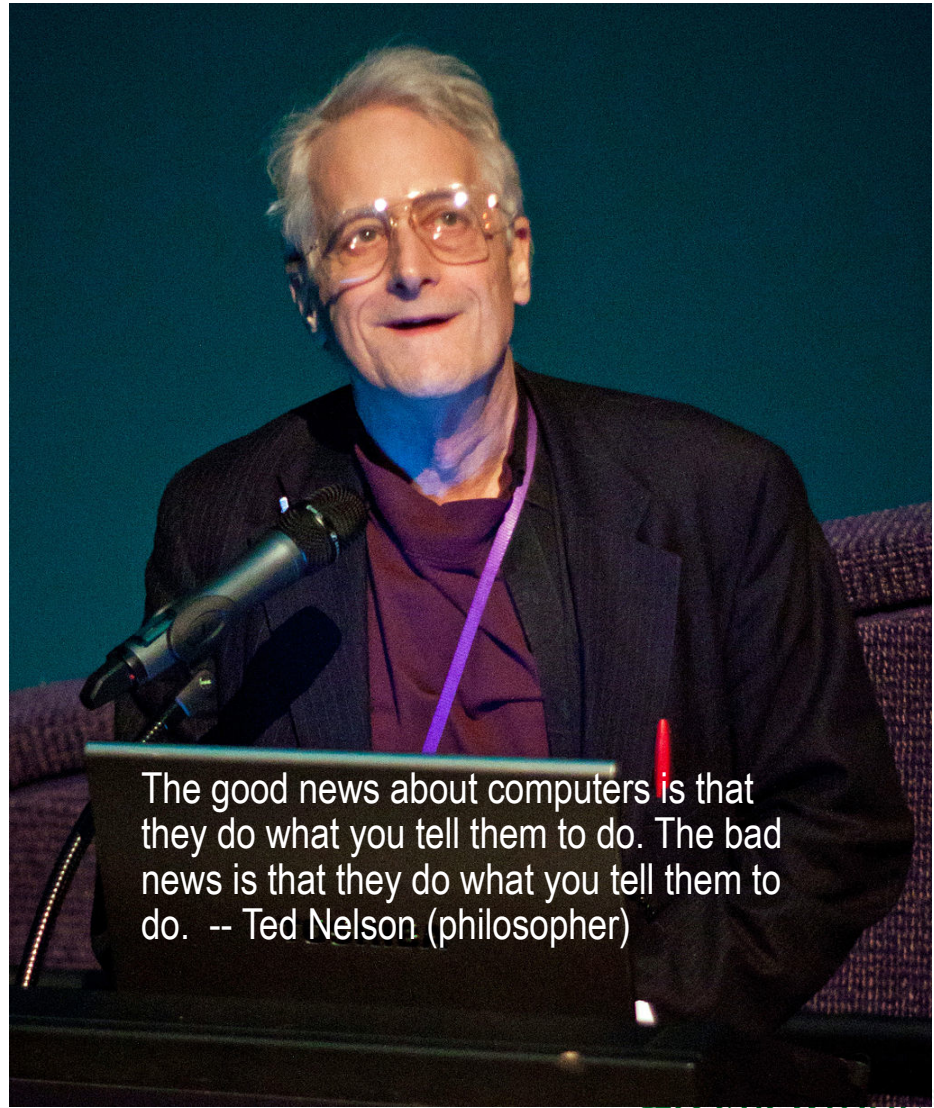
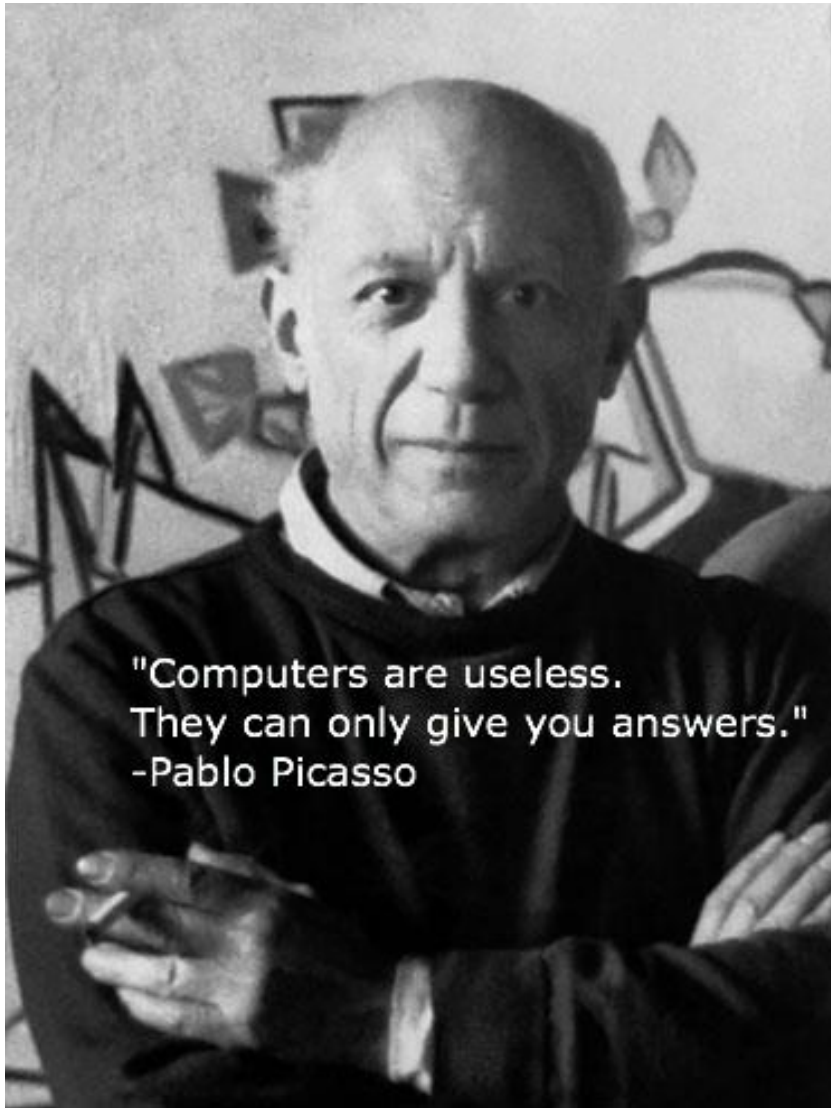
# Outline

- Why do we compute?
- Some trends in HPC
- Primary computational programs at DOE
- Examples
  - Nuclear Physics
  - Climate and energy R&D
- Beyond exascale



# Why do we compute?

# Why do we compute?

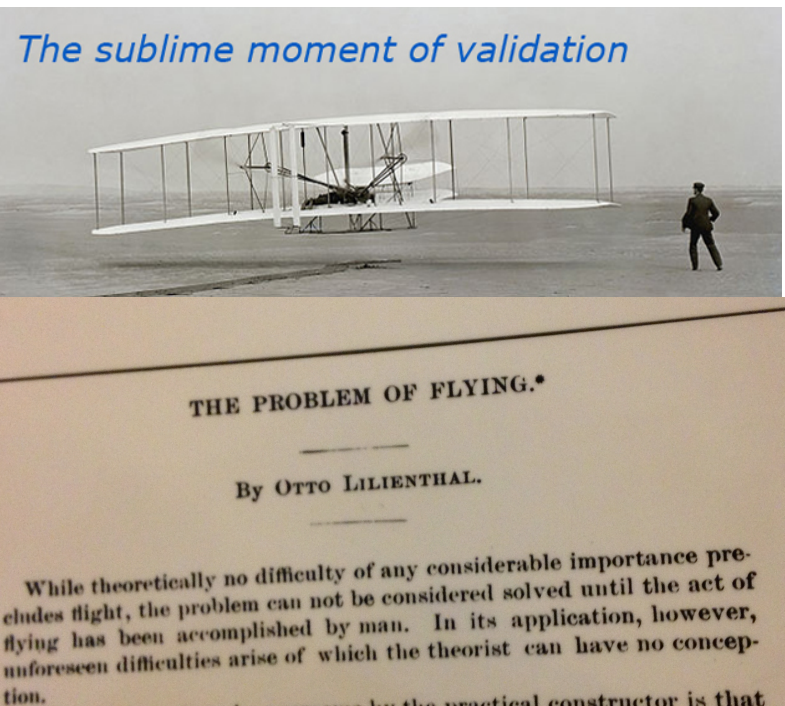


# Why and how do we compute?

- Why?
  - Very few instances of analytical, closed form, real life solutions exist.
  - Nonlinearity and emergent behavior exist everywhere.
- We compare theory (as codified in equations) to experiment
- We predict the outcomes of experiments to test theory
- We employ methods of Validation and Verification (V&V)
  - Doing the problem right (numerically sound approaches)
  - Doing the right problem (physically sound approaches)
- We quantify our uncertainties (UQ)
- We apply liberal amounts of physics intuition

A fact of life

Application of the scientific method





# How do you know what you know?

PHYSICAL REVIEW A 83, 040001 (2011)

## Editorial: Uncertainty Estimates

The purpose of this Editorial is to discuss the importance of including uncertainty estimates in papers involving theoretical calculations of physical quantities.

It is not unusual for manuscripts on theoretical work to be submitted without uncertainty estimates for numerical results. In contrast, papers presenting the results of laboratory measurements would usually not be considered acceptable for publication in *Physical Review A* without a detailed discussion of the uncertainties involved in the measurements. For example, a graphical presentation of data is always accompanied by error bars for the data points. The determination of these error bars is often the most difficult part of the measurement. Without them, it is impossible to tell whether or not bumps and irregularities in the data are real physical effects, or artifacts of the measurement. Even papers reporting the observation of entirely new phenomena need to contain enough information to convince the reader that the effect being reported is real. The standards become much more rigorous for papers claiming high accuracy.

The question is to what extent can the same high standards be applied to papers reporting the results of theoretical calculations. It is all too often the case that the numerical results are presented without uncertainty estimates. Authors sometimes say that it is difficult to arrive at error estimates. Should this be considered an adequate reason for omitting them? In order to answer this question, we need to consider the goals and objectives of the theoretical (or computational) work being done. Theoretical papers can be broadly classified as follows:

1. Development of new theoretical techniques or formalisms.
2. Development of approximation methods, where the comparison with experiment, or other theory, itself provides an assessment of the error in the method of calculation.
3. Explanation of previously unexplained phenomena, where a semiquantitative agreement with experiment is already significant.
4. Proposals for new experimental arrangements or configurations, such as optical lattices.
5. Quantitative comparisons with experiment for the purpose of (a) verifying that all significant physical effects have been taken into account, and/or (b) interpolating or extrapolating known experimental data.
6. Provision of benchmark results intended as reference data or standards of comparison with other less accurate methods.

It is primarily papers in the last two categories that require a careful assessment of the theoretical uncertainties. The uncertainties can arise from two sources: (a) the degree to which the numerical results accurately represent the predictions of an underlying theoretical formalism, for example, convergence with the size of a basis set, or the step size in a numerical integration, and (b) physical effects not included in the calculation from the beginning, such as electron correlation and relativistic corrections. It is of course never possible to state precisely what the error is without in fact doing a larger calculation and obtaining the higher accuracy. However, the same is true for the uncertainties in experimental data. The aim is to estimate the uncertainty, not to state the exact amount of the error or provide a rigorous bound.

There are many cases where it is indeed not practical to give a meaningful error estimate for a theoretical calculation; for example, in scattering processes involving complex systems. The comparison with experiment itself provides a test of our theoretical understanding. However, there is a broad class of papers where estimates of theoretical uncertainties can and should be made. Papers presenting the results of theoretical calculations are expected to include uncertainty estimates for the calculations whenever practicable, and especially under the following circumstances:

1. If the authors claim high accuracy, or improvements on the accuracy of previous work.
2. If the primary motivation for the paper is to make comparisons with present or future high precision experimental measurements.
3. If the primary motivation is to provide interpolations or extrapolations of known experimental measurements.

These guidelines have been used on a case-by-case basis for the past two years. Authors have adapted well to this, resulting in papers of greater interest and significance for our readers.

The Editors

Published 29 April 2011  
DOI: [10.1103/PhysRevA.83.040001](https://doi.org/10.1103/PhysRevA.83.040001)  
PACS number(s): 01.30.Ww

1050-2947/2011/83(4)/040001(1)

040001-1

©2011 American Physical Society

‘It is not unusual for manuscripts on theoretical work to be submitted without uncertainty estimates for numerical results’

‘Papers presenting the results of theoretical calculations are expected to include uncertainty estimates for the calculations whenever practicable.’

- Claim of high accuracy
- Comparison with high precision experimental measurements
- Interpolation or extrapolation of known experimental measurements

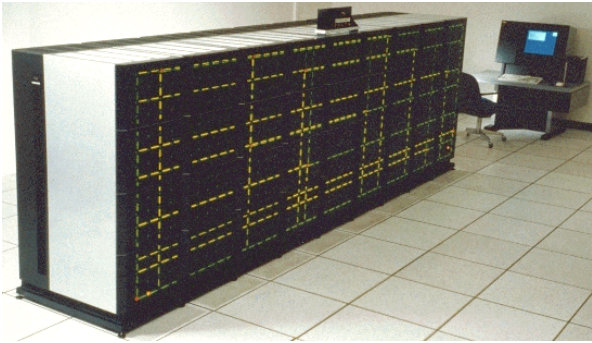
Phys. Rev. A 83, 040001 (2011)  
(atomic, molecular, optical physics)



# Some trends in High Performance Computing



# Some open science computers...



Touchstone Delta – Caltech  
June 1993  
#8 on Top500  
Rpeak=13.9 Gflop/s (#1 = 59.7 GF)



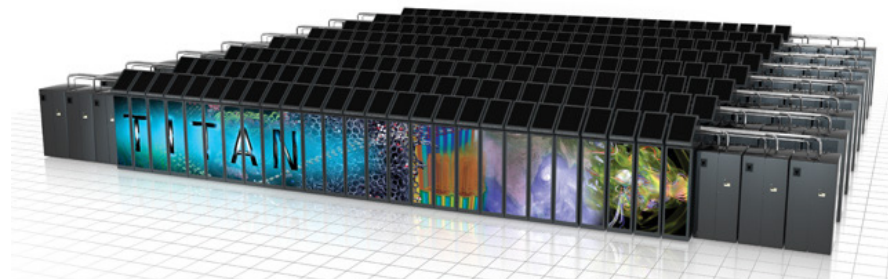
NERSC T3E900  
June 1998  
#8  
321 Gflop/s (#1 = 1,338 GF)



NERSC, IBM SP-3, 16 way  
June 2003  
#4  
7 Tflop/s (#1 = 35.86 TF)



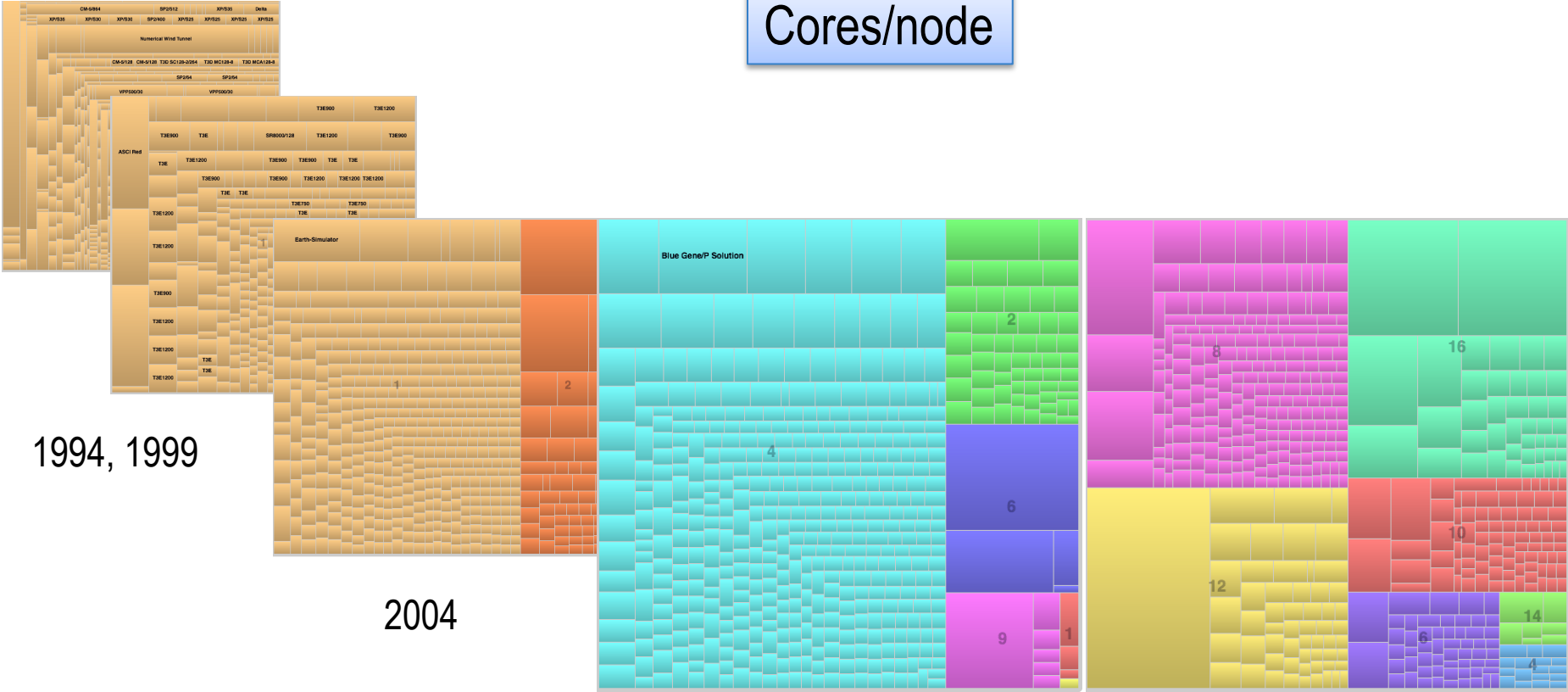
ORNL, Cray XT4 (upgraded components)  
June 2008  
#6  
205 Tflop/s (#1 = 1.026 PF)



ORNL, Cray XK7  
November 2014  
#2  
17.5 Pflop/s (#1 = 33.9 Pflop/s)

# Changes across 21 years...

Cores/node



1994, 1999

2004

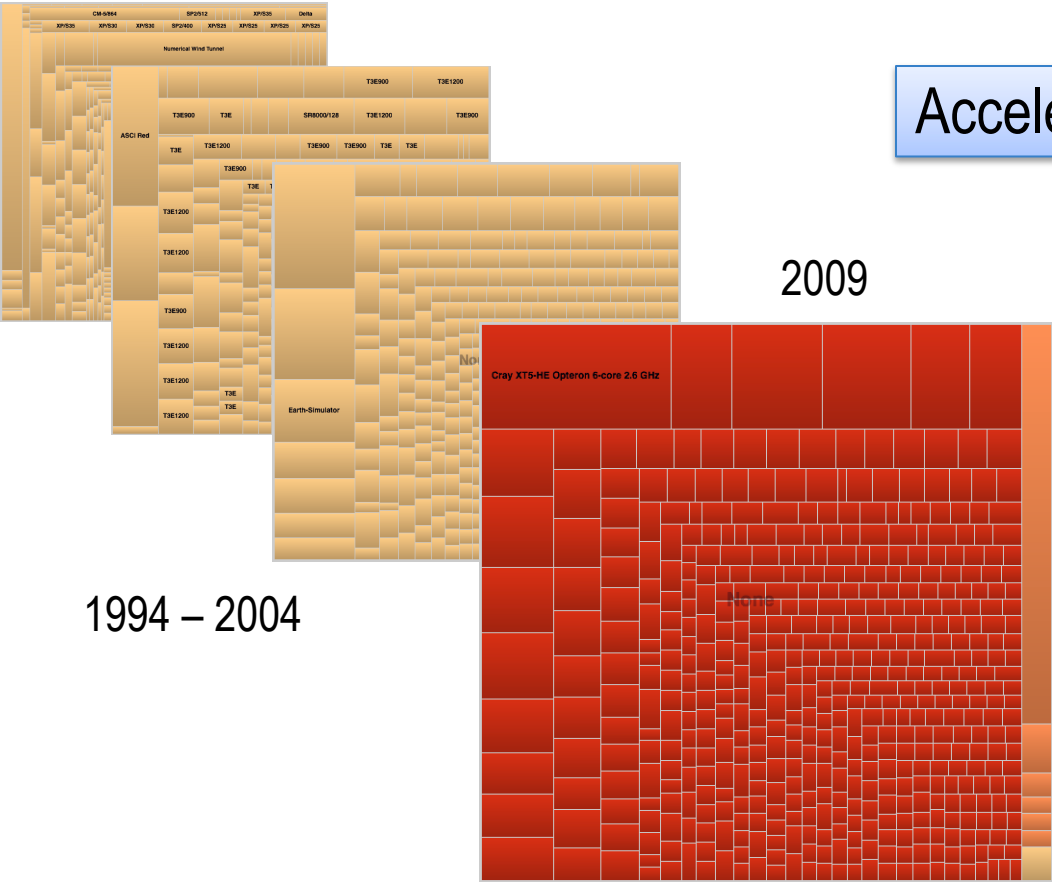
2009

2014

MPI/OpenMP/multi threading...

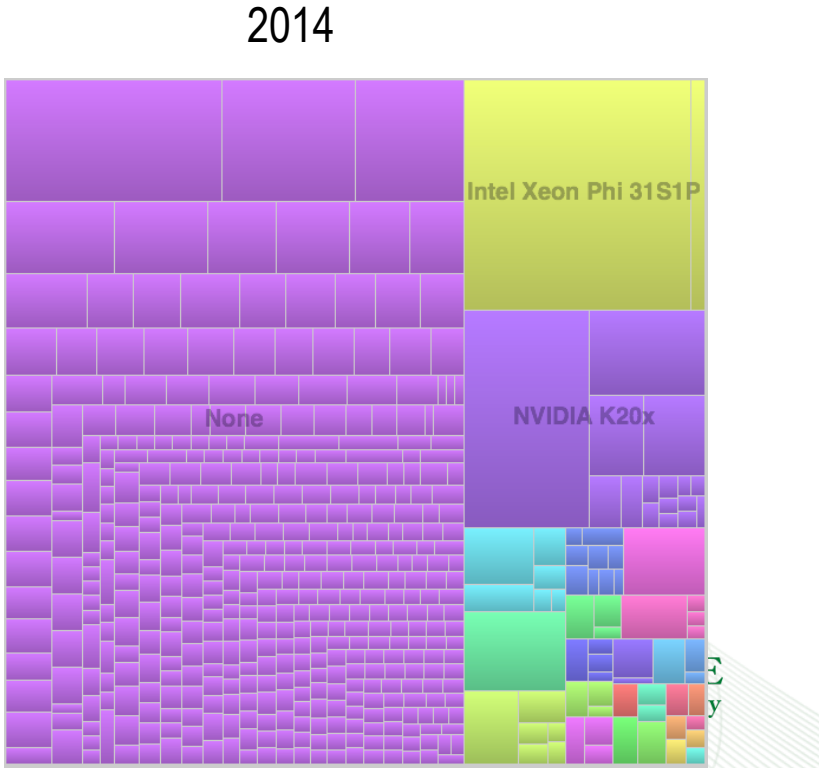
# Changes across 21 years...

Accelerators: CPU/GPU



1994 – 2004

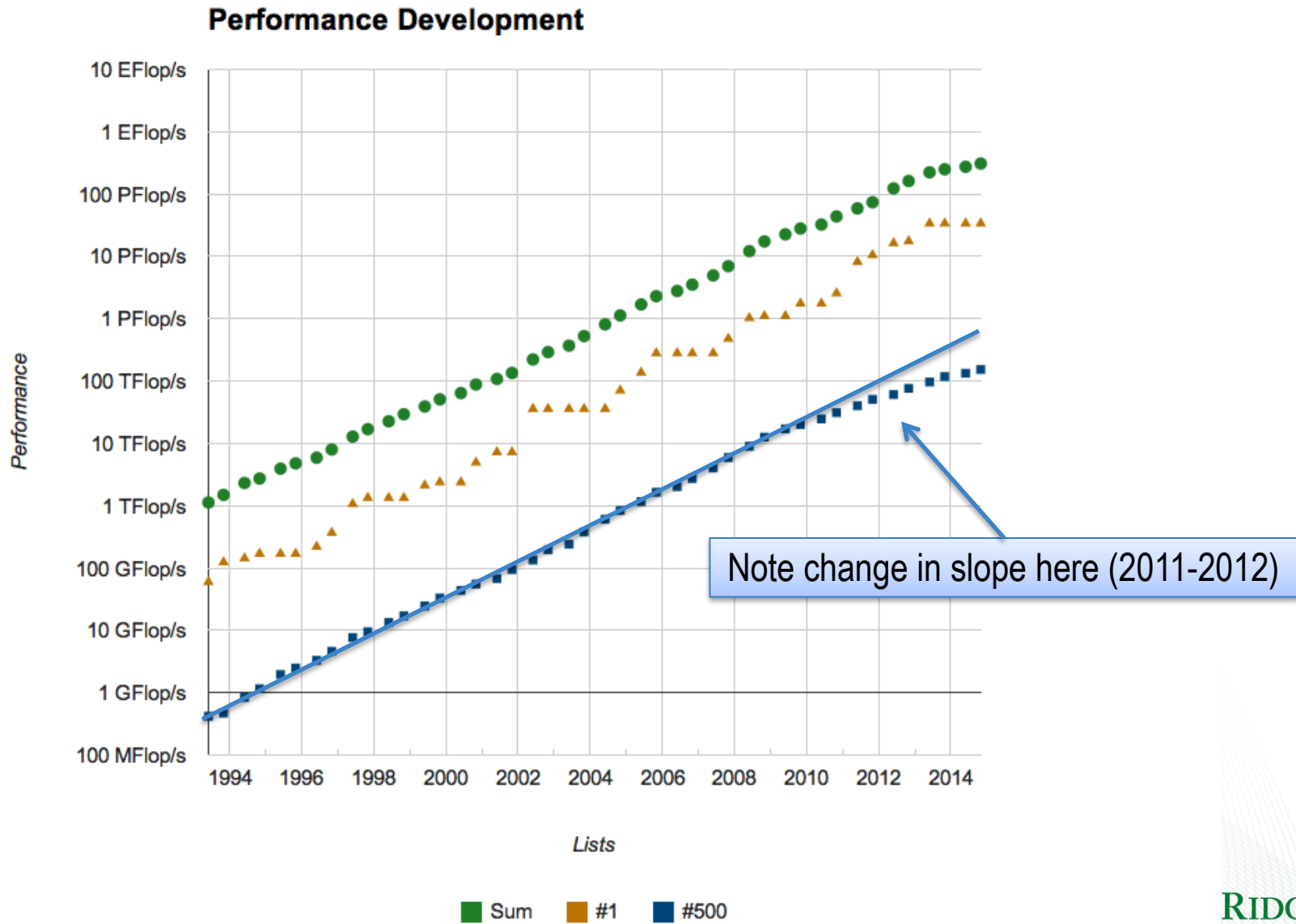
2009



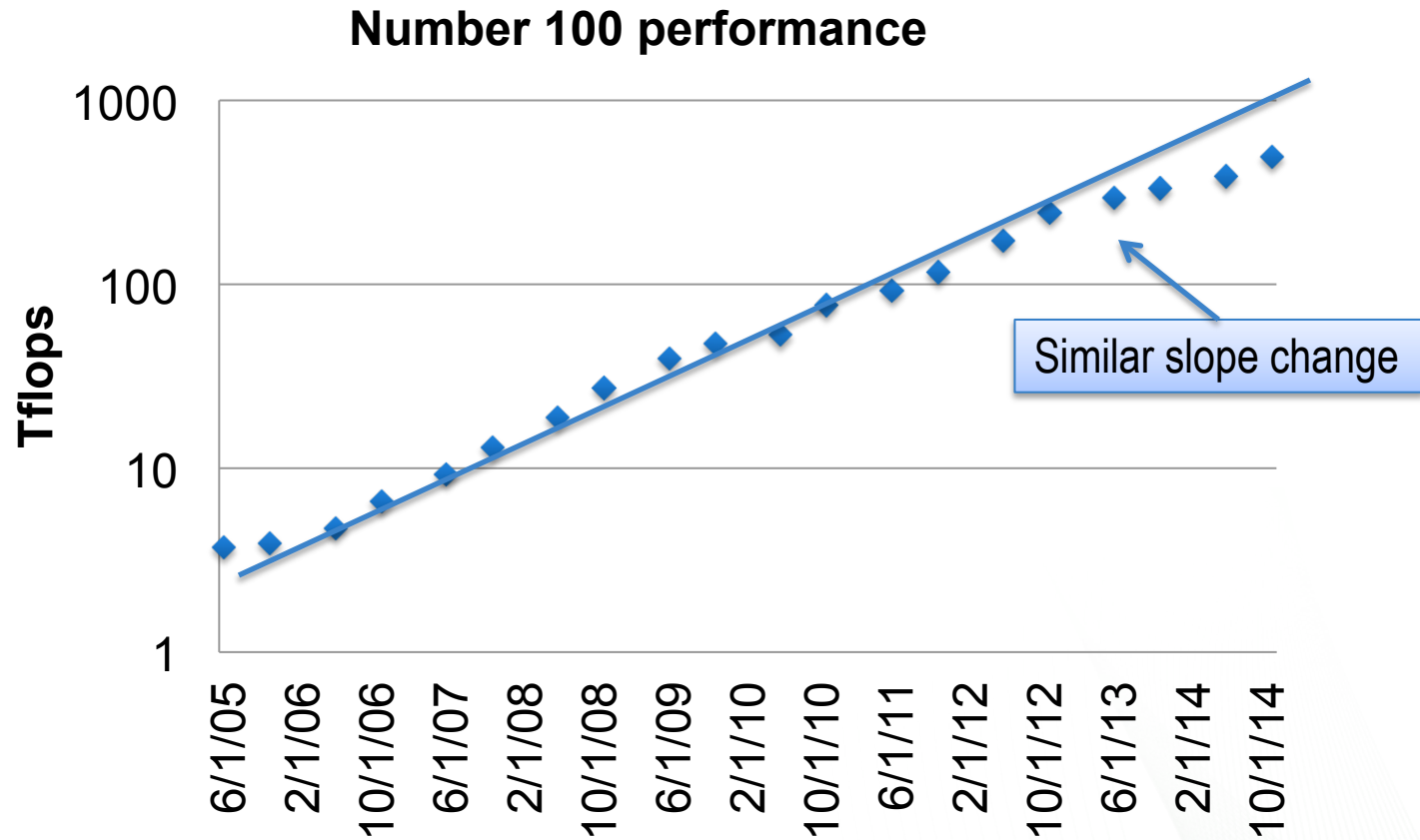
2014

MPI/OpenMP/multi threading/CUDA...

# Development with time



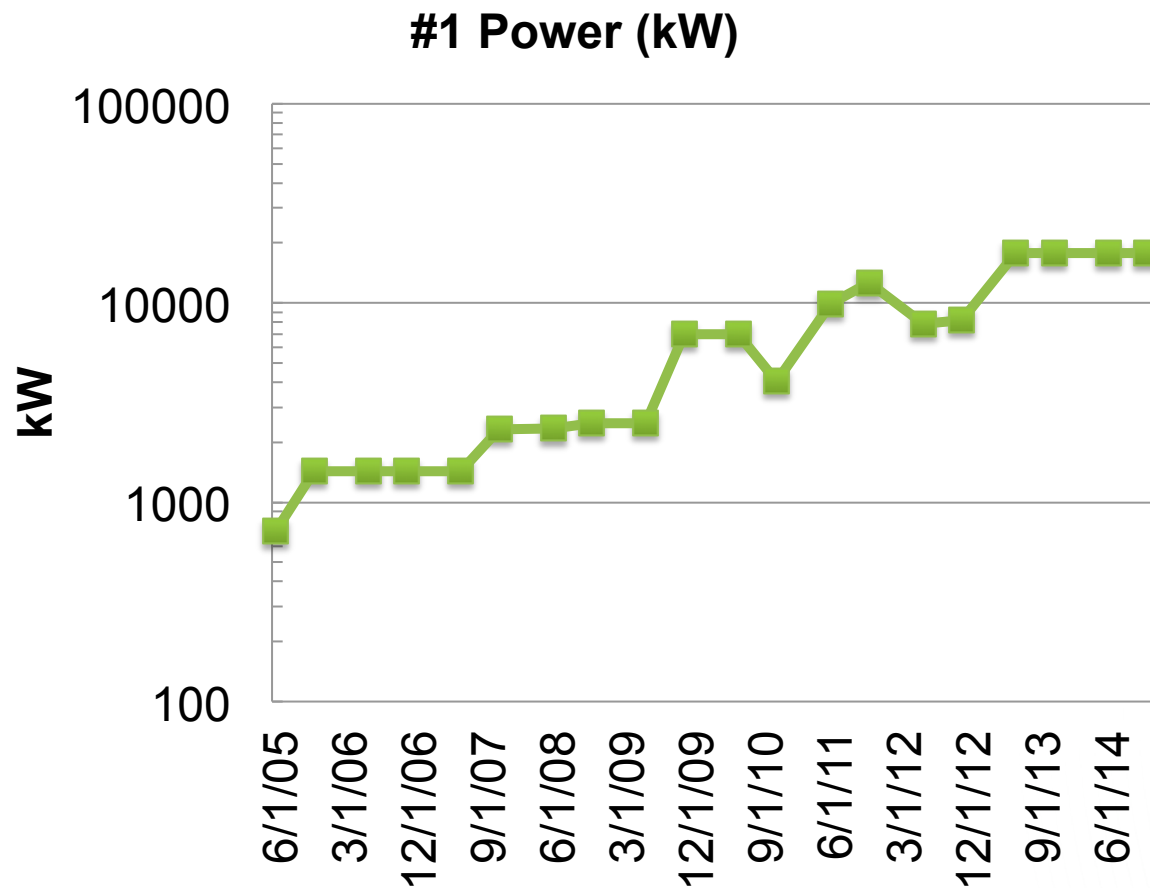
# Performance of #100



Slope is changing...happens later for higher performing systems...  
Implies a longer doubling time for most systems



# A big issue: power



Incremental cost of running RHIC: \$550k/week

Incremental cost of running Titan: \$140k/week

Incremental cost of running Tianhe-2: \$300k/week

(assume \$0.1/kW-h)

June 2005 Tflop/kW = 0.191  
 Nov. 2014 Tflop/kW = 1.901

10x technology improvement

The seal of the United States Department of Energy is a circular emblem. It features a bald eagle with its wings spread, perched atop a shield. The shield is divided into four quadrants: the top-left shows a sunburst, the top-right shows an atomic symbol, the bottom-left shows an oil derrick, and the bottom-right shows a windmill. A large lightning bolt strikes diagonally across the shield. The entire shield is set against a blue background. The outer ring of the seal is gold and contains the text "DEPARTMENT OF ENERGY" at the top and "UNITED STATES OF AMERICA" at the bottom in gold lettering.

# Primary computational programs at DOE

# Advanced Simulations and Computing



Part of the Science Based Stockpile Stewardship Program at NNSA

- Ensuring nuclear weapon reliability, safety, and performance in the absence of testing
- Program incorporates:
  - Integrated codes
  - Physics and engineering models
  - Computational systems and software environments
  - Facility operations (at LLNL, LANL and SNL)



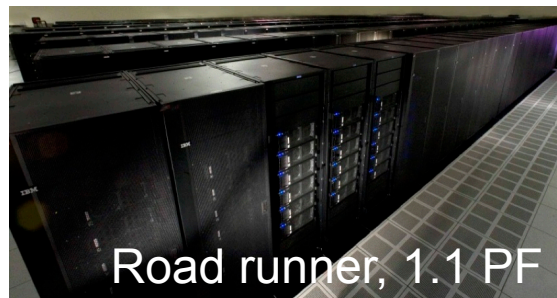
ASCI Red, 1 TF



ASCI White, 7.2 TF



BG/L, 70.7 TF



Road runner, 1.1 PF



Sequoia, 16.3 PF

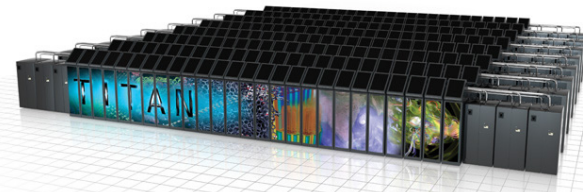


# Advanced Scientific Computing Research



Mission: discover, develop, and deploy computational and networking capabilities to analyze, model, simulate and predict complex phenomena important to the DOE

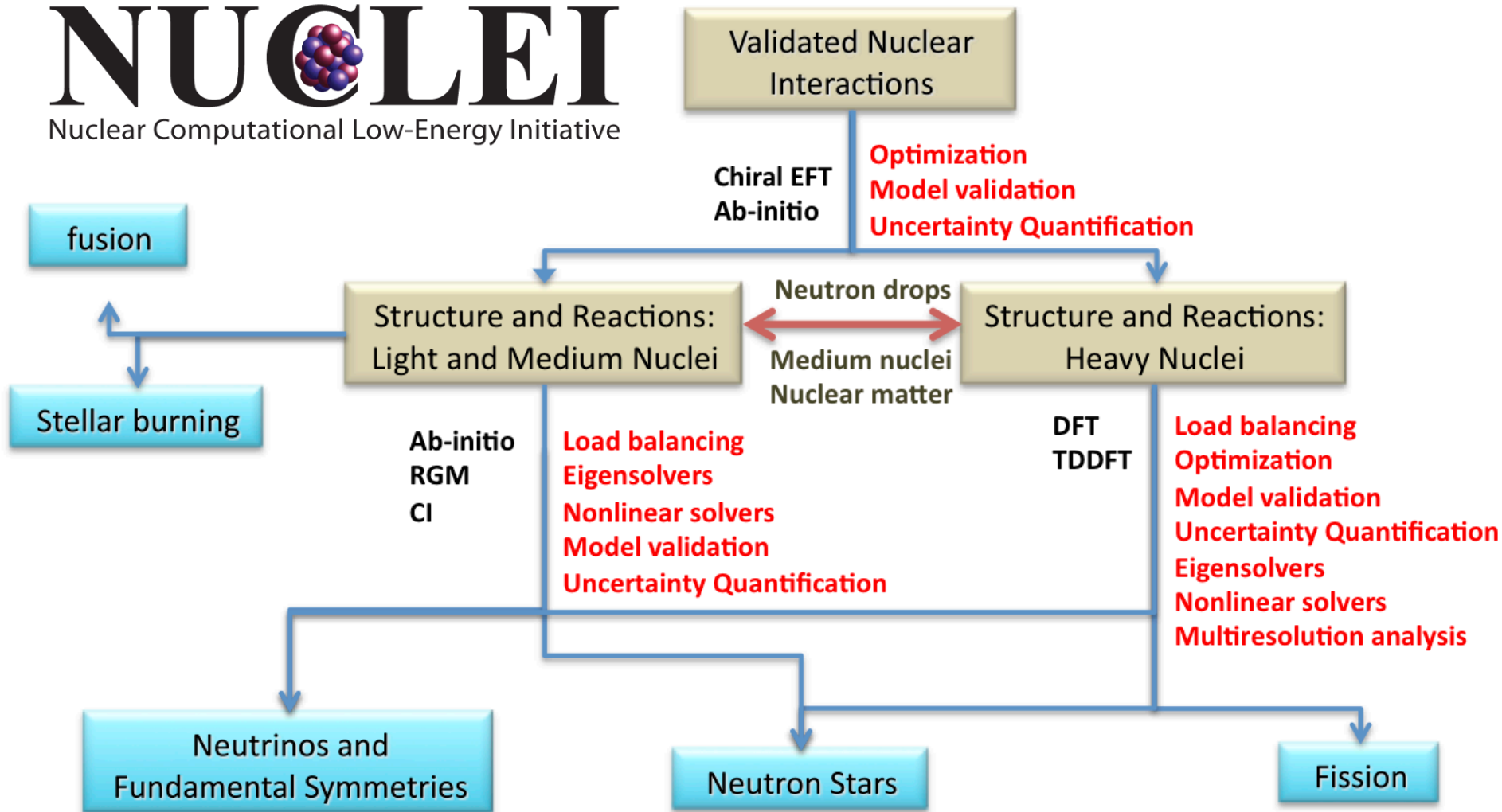
- Applied Math & Computer Science
- Facilities operations



# SciDAC example

## NUCLEI

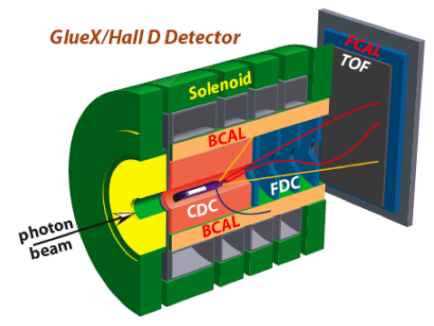
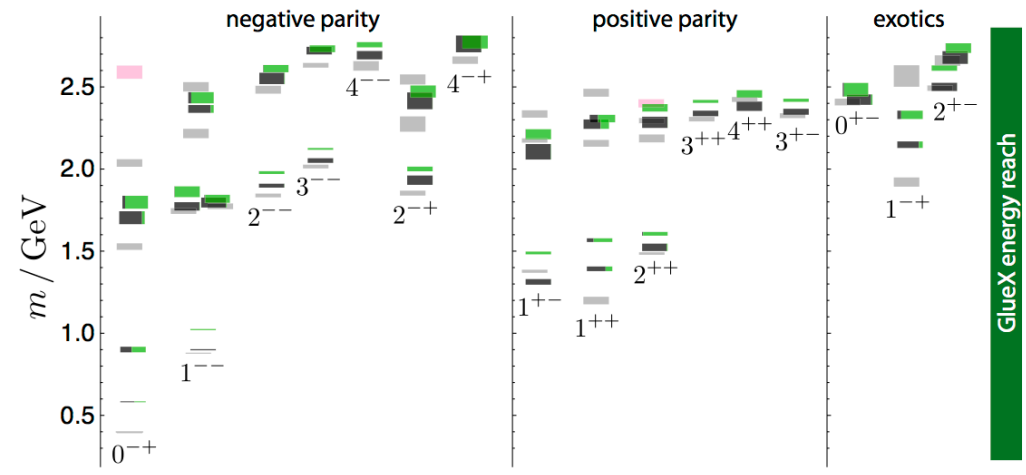
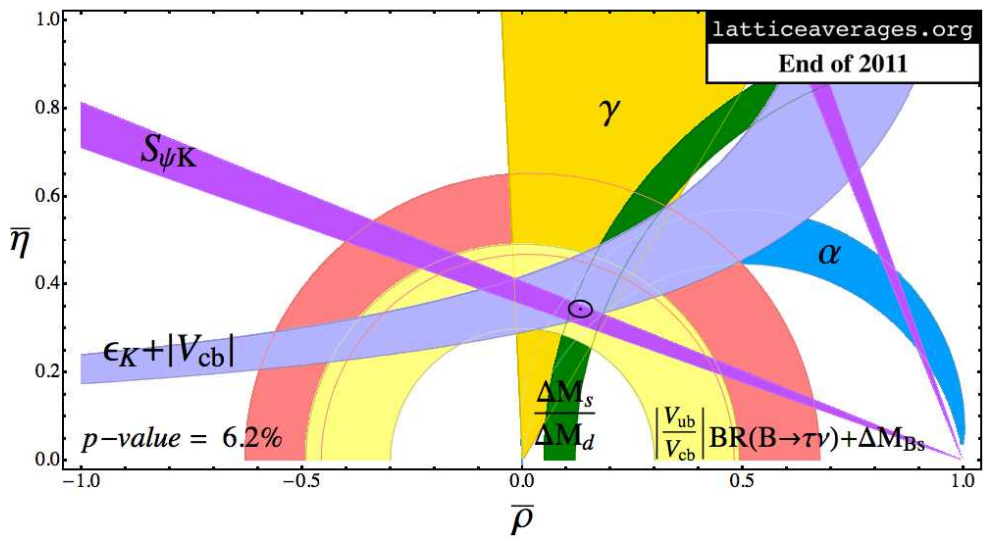
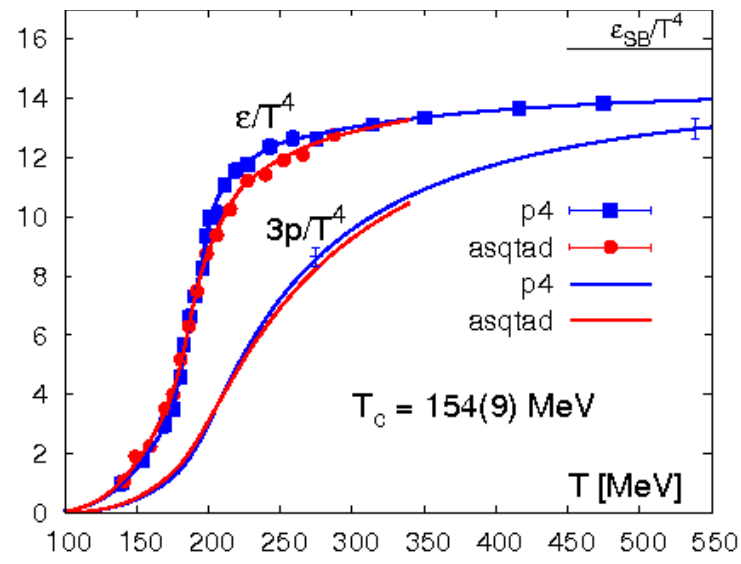
Nuclear Computational Low-Energy Initiative





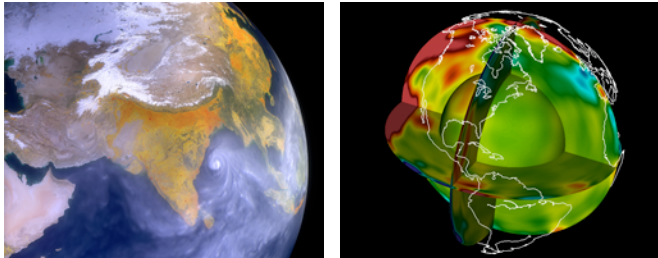
# SciDAC example

Computing properties of hadrons, nuclei and nuclear matter from QCD

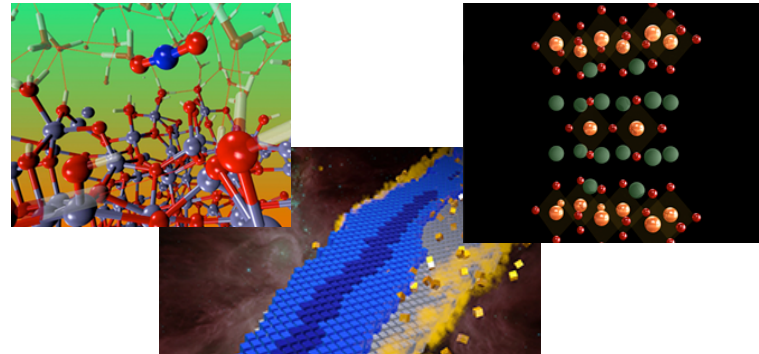


# Science at 100-200 Pflop:

Center for Accelerated Application Readiness (CAAR) program

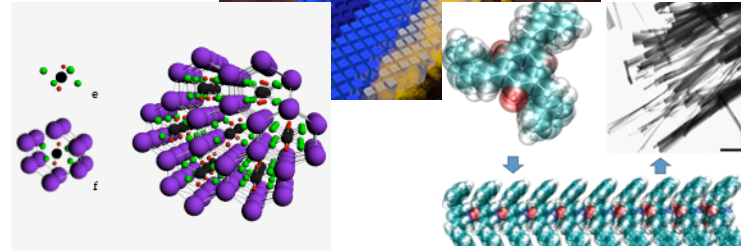
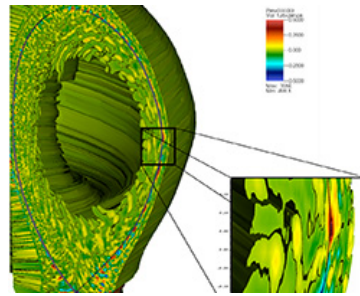
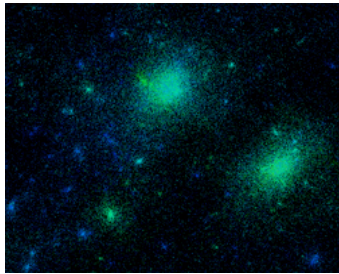


Climate and seismology

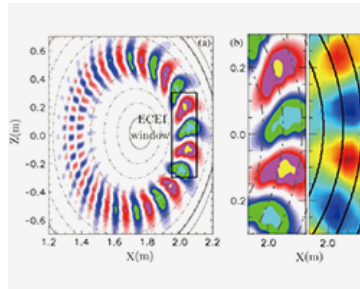
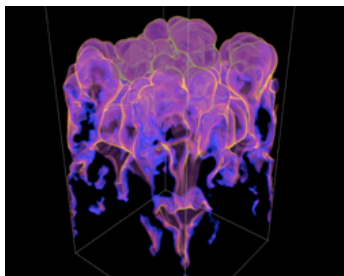


Quantum many body

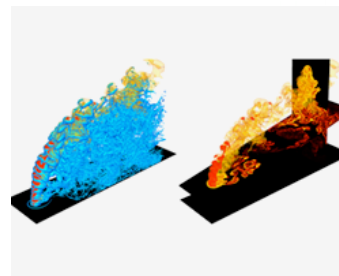
Astro



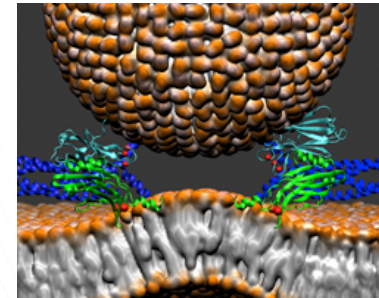
Brain chemistry



Fusion

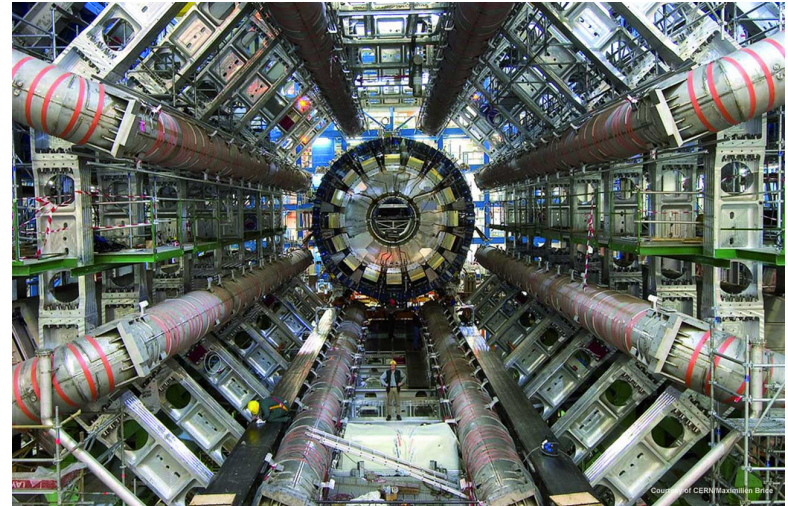


Combustion

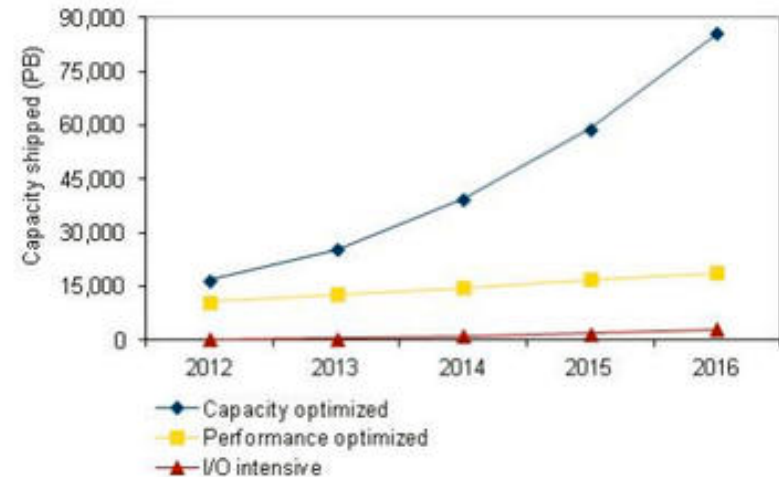


# Data and computing

- Characteristics
  - Volume Example: 100x data from LHC after luminosity and energy upgrades
  - Variety: From LHC to 0nubb
  - Velocity: Flow of data from both experiments and simulations
  - Variability: signal to noise
  - Veracity: how good is the data?
- Data presents significant research opportunities



Worldwide Capacity-Optimized, Performance-Optimized, and I/O-Intensive Storage Systems Shipments, 2012–2016



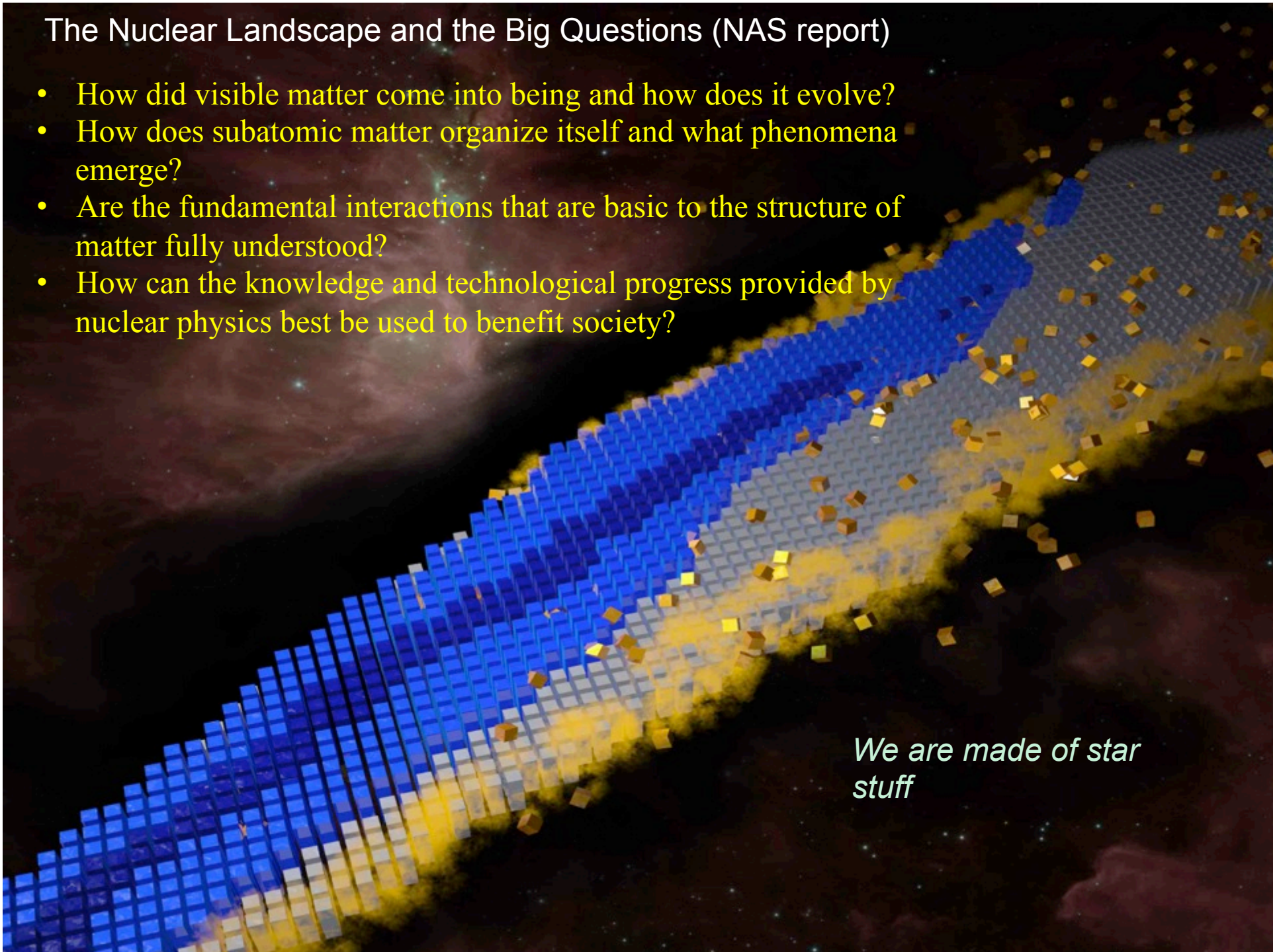


# Nuclear physics example

## The Nuclear Landscape and the Big Questions (NAS report)

- How did visible matter come into being and how does it evolve?
- How does subatomic matter organize itself and what phenomena emerge?
- Are the fundamental interactions that are basic to the structure of matter fully understood?
- How can the knowledge and technological progress provided by nuclear physics best be used to benefit society?

*We are made of star  
stuff*

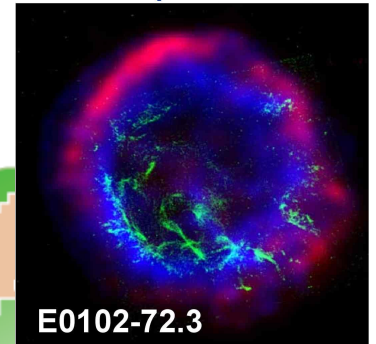




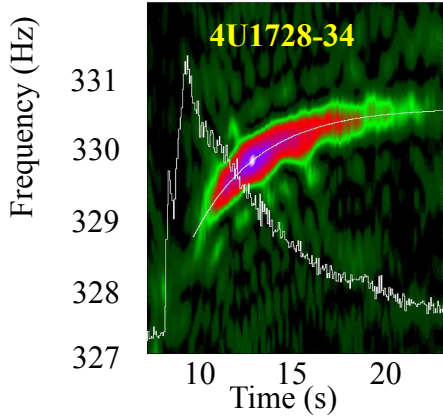
# The nuclear landscape in the cosmos



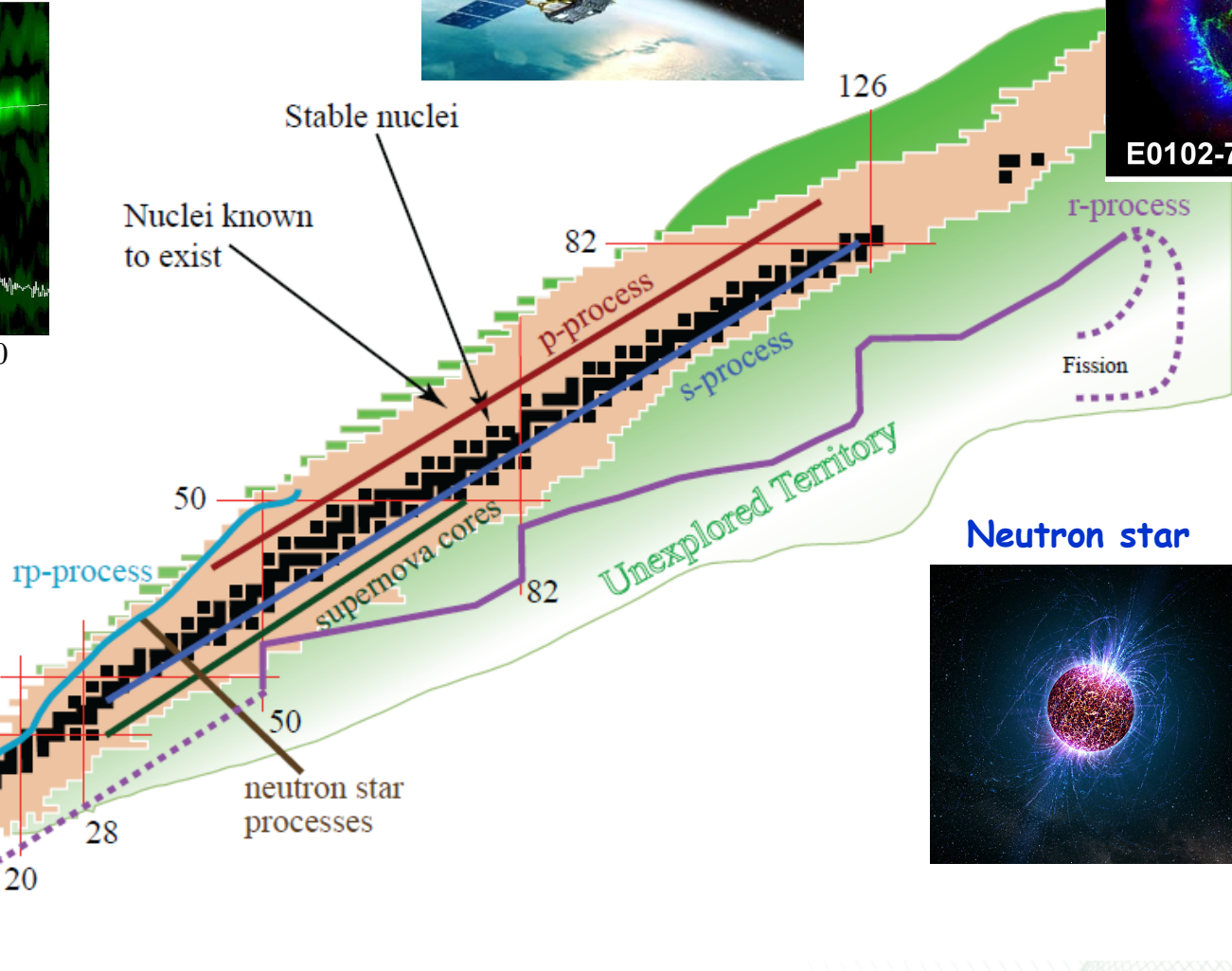
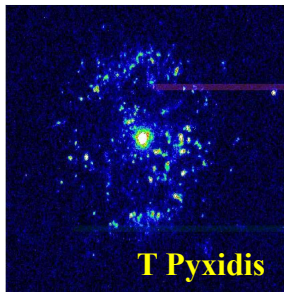
Supernova



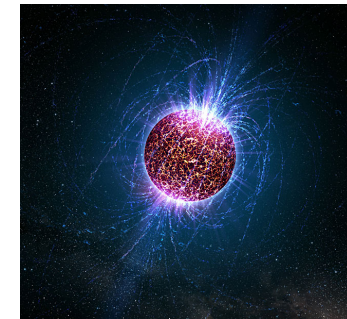
X-ray burst



Nova



Neutron star



protons

# Approaching weakly bound nuclei with coupled cluster theory

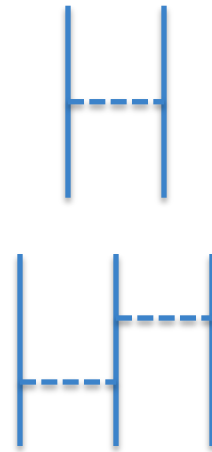
A method that captures the physics

Effective Field Theory for nuclear force (interactions)

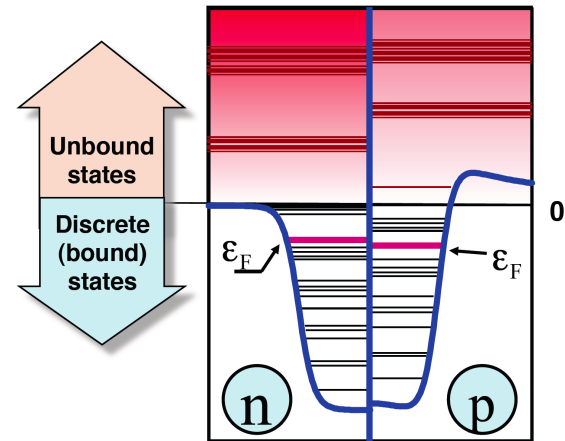
Basis states that incorporate continuum effects

$$|\Psi\rangle = \exp(T)|\Phi\rangle$$

- Coupled cluster theory
- Infinitely summed lower class (1, 2, 3 loop) many-body perturbation theory diagrams
- Amenable to HPC applications



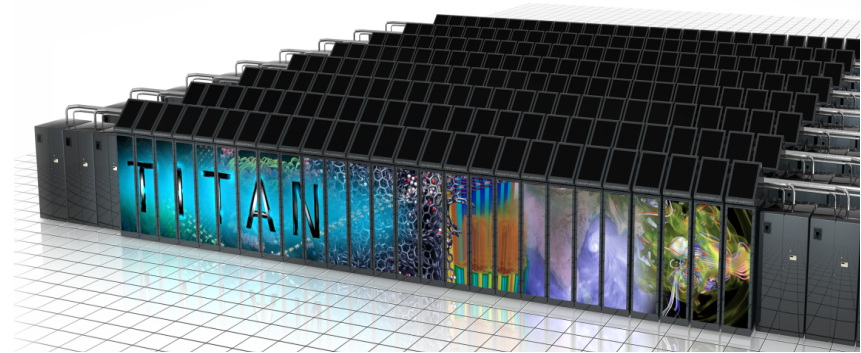
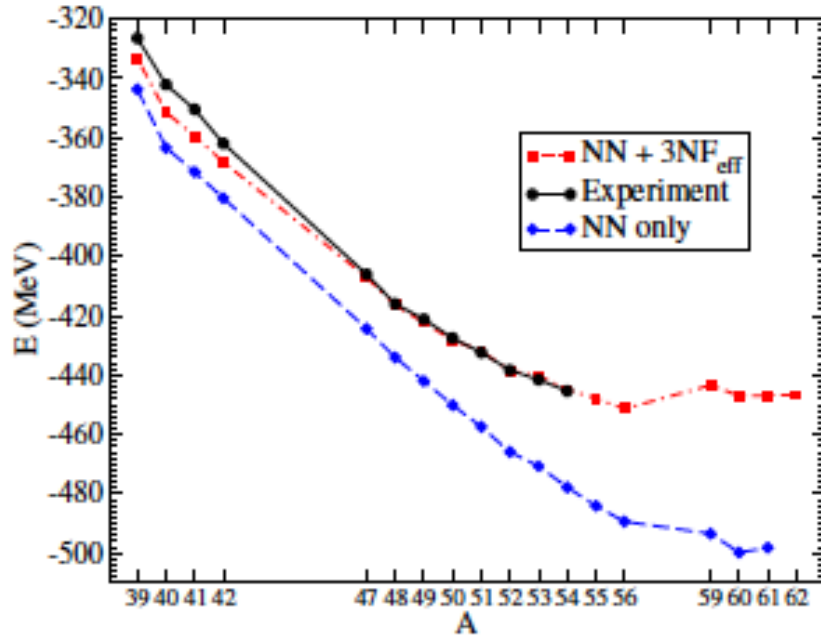
- Effective field theory expansion of the nucleon forces that respects symmetries of QCD
- 2-body and 3-body forces



- Basis includes bound, scattering, and continuum states
- Berggren basis

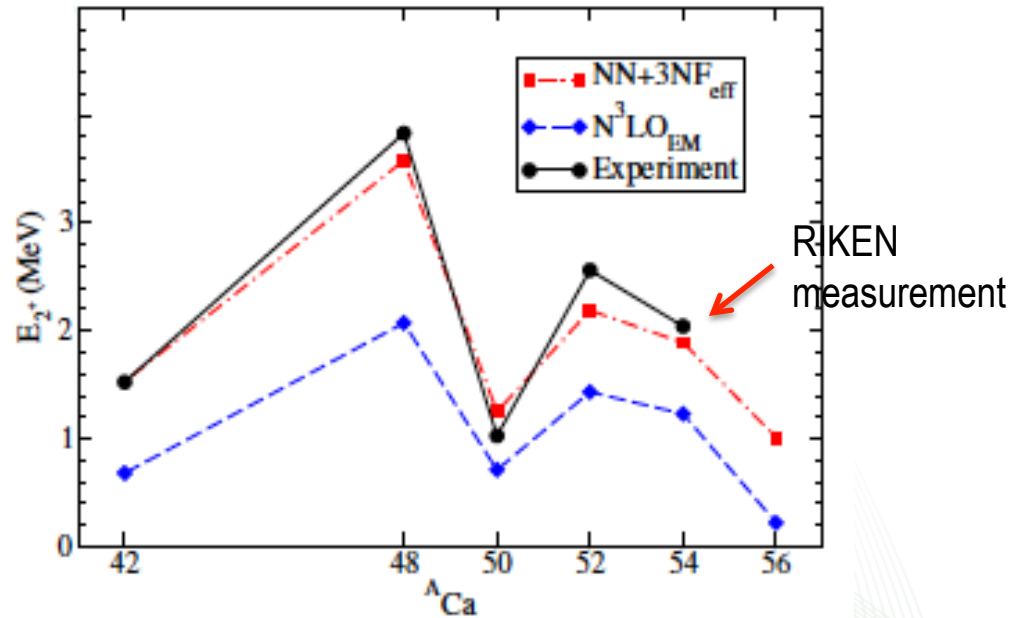
Dean & Hjorth-Jensen, PRC69, 054320 (2004); Kowalski et al., PRL 92, 132501 (2004); Wloch et al., PRL94, 212501 (2005) Gour et al., PRC (2006); Hagen et al, PLB (2006); PRC 2007a, 2007b; Dean, Phys. Today (Nov, 2007)

# Investigating weakly bound nuclei



How does one approach the drip line (quickly, smoothly, or asymptotically)?

Are there new shell structures beyond our standard nuclear magic numbers?



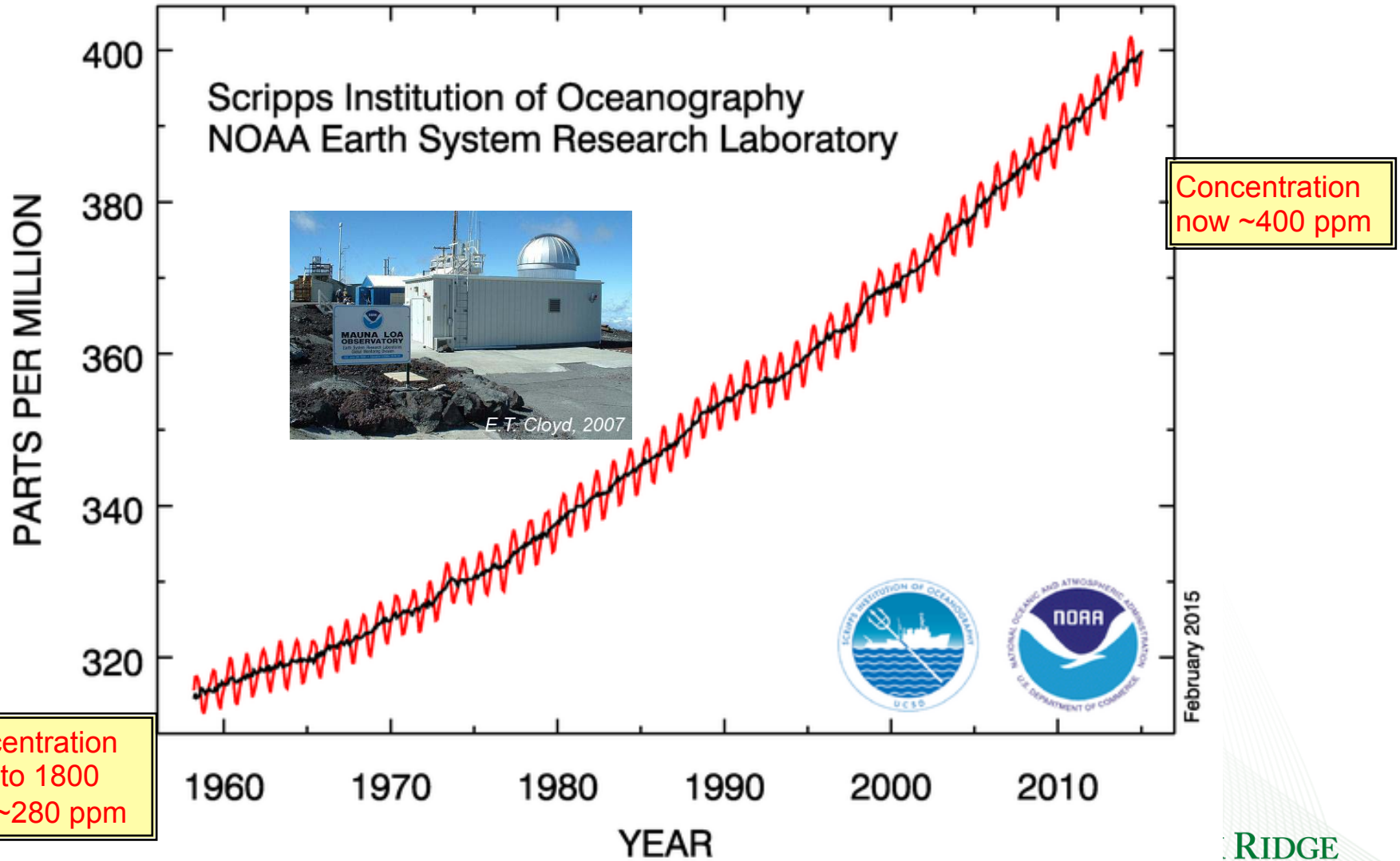




# The environment, energy and R&D

# Observed CO<sub>2</sub> concentrations today

## Atmospheric CO<sub>2</sub> at Mauna Loa Observatory

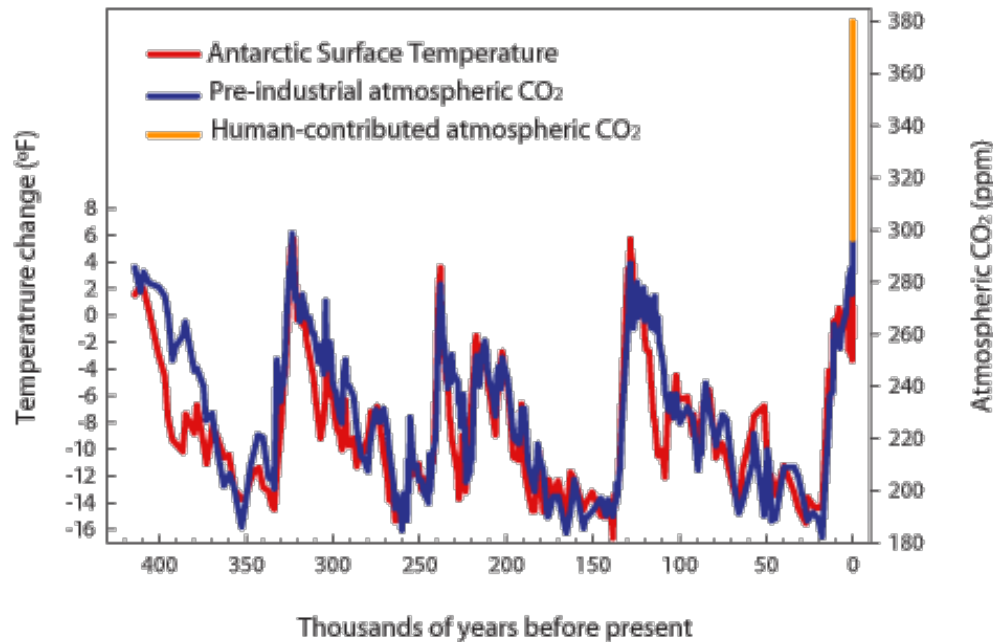




# Paleoclimatology

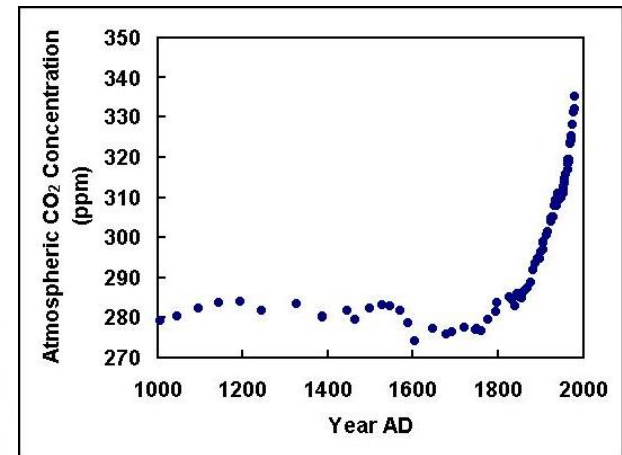
## Trends in Atmospheric CO<sub>2</sub> & Global Surface Temperature

The last 400,000 Years



**Data Sources:**

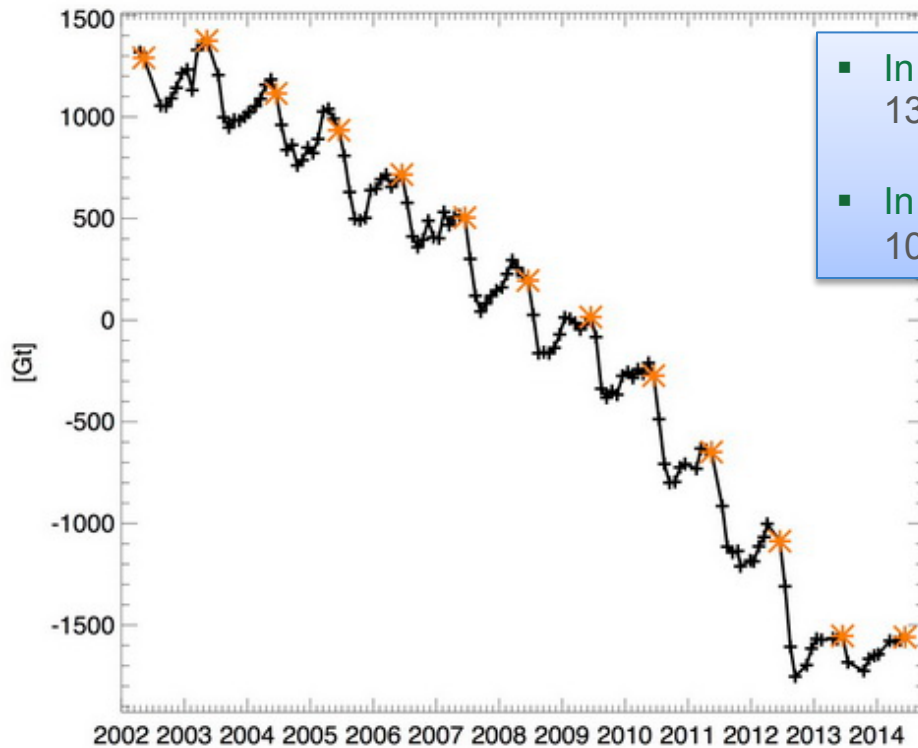
Atmospheric CO<sub>2</sub> prior to 3000 years ago and Antarctic Surface temperature prior to 100 years ago: J.R., Petit, Jouzel J., et al. 1999. Climate and atmospheric history of the past 420,000 years from the Vostok ice core, Antarctica. *Nature* 399:429-436.  
 Pre-industrial CO<sub>2</sub> 40-3000 years ago: Indermühle A., T.F. Stockes, F., et. al. 1999. Holocene carbon-cycle dynamics based on CO<sub>2</sub> trapped in ice at Taylor Dome, Antarctica. *Nature* 398, 121-126.  
 Modern CO<sub>2</sub>: Keeling, C.D. and T.R. Whorf. 2005. Atmospheric CO<sub>2</sub> records from sites in the SIO air sampling network. In *Trends: A Compendium of Data on Global Change*. Carbon Dioxide Information Analysis Center, Oak Ridge National Laboratory, U.S. Department of Energy, Oak Ridge, Tenn., U.S.A.





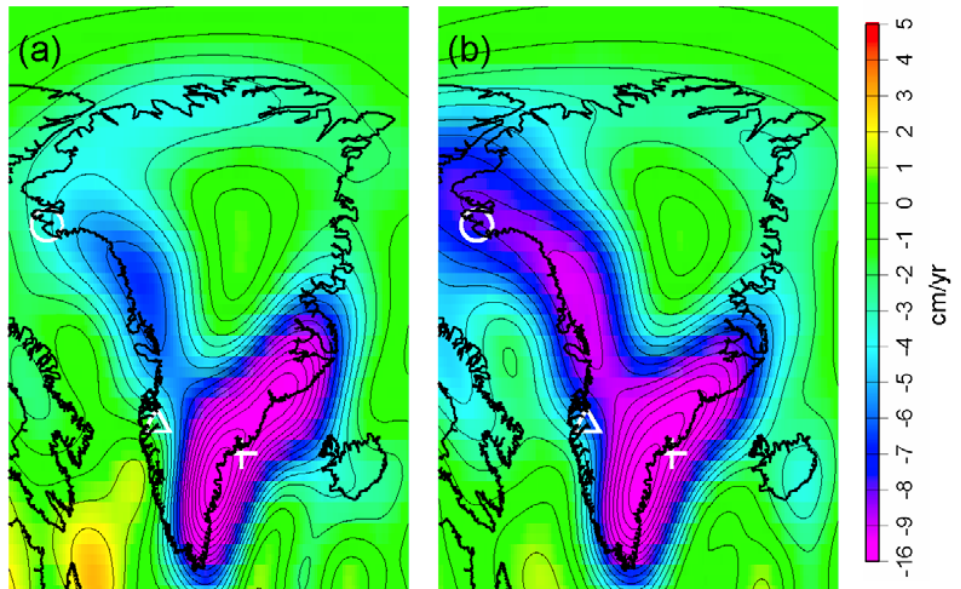
# Observed Greenland Ice Loss 2002-2014

Increasing rates of ice mass loss from the Greenland and Antarctic ice sheets revealed by GRACE (Gravity Recovery and Climate Experiment) satellite:



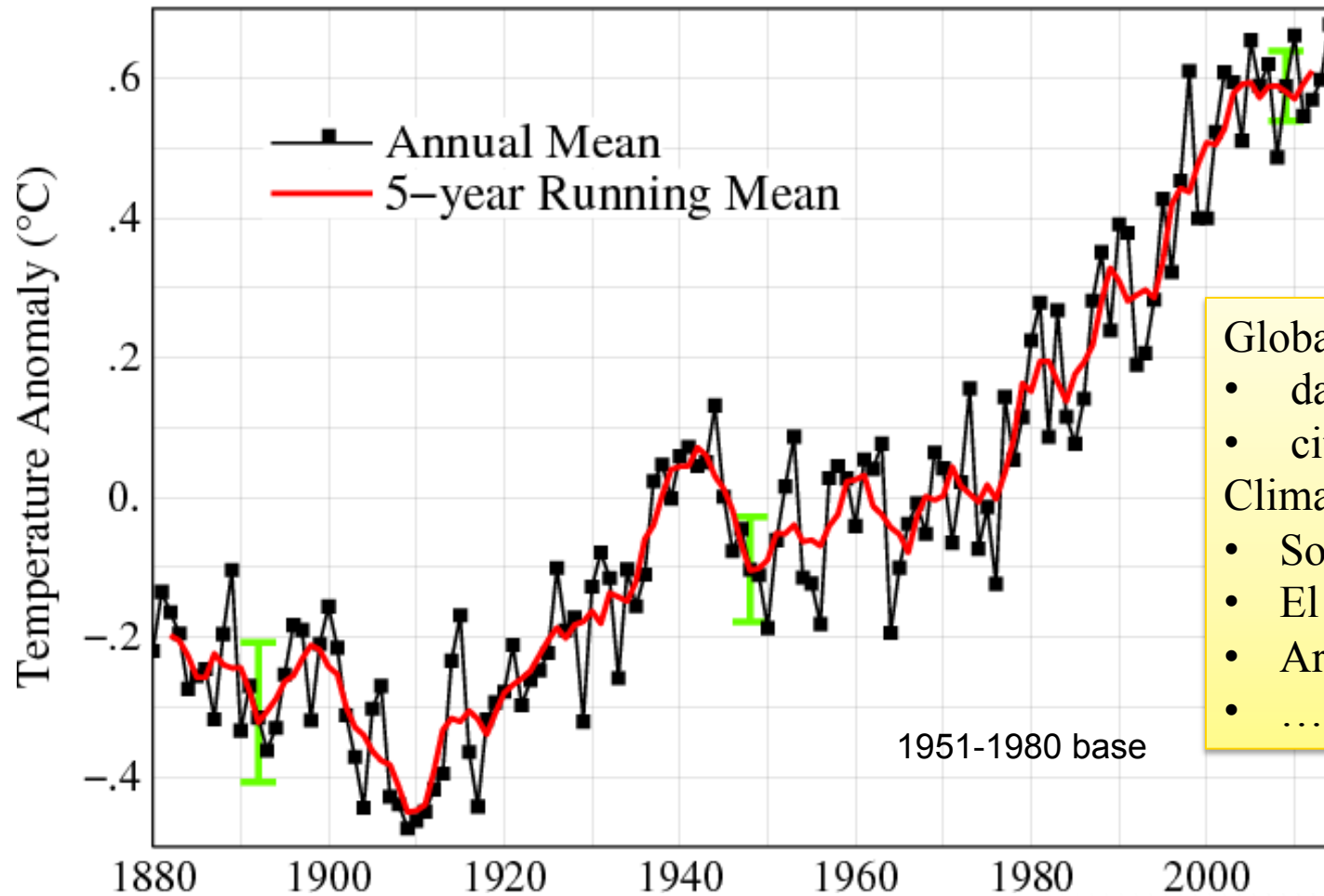
- In Greenland, the mass loss increased from 137 Gt/yr in 2002–2003 to 286 Gt/yr in 2007–2009
- In Antarctica, the mass loss increased from 104 Gt/yr in 2002–2006 to 246 Gt/yr in 2006–2009

Monthly mass anomalies (in Gigatonnes) for the Greenland ice sheet since April 2002 estimated from GRACE measurements



# Observed global temperature

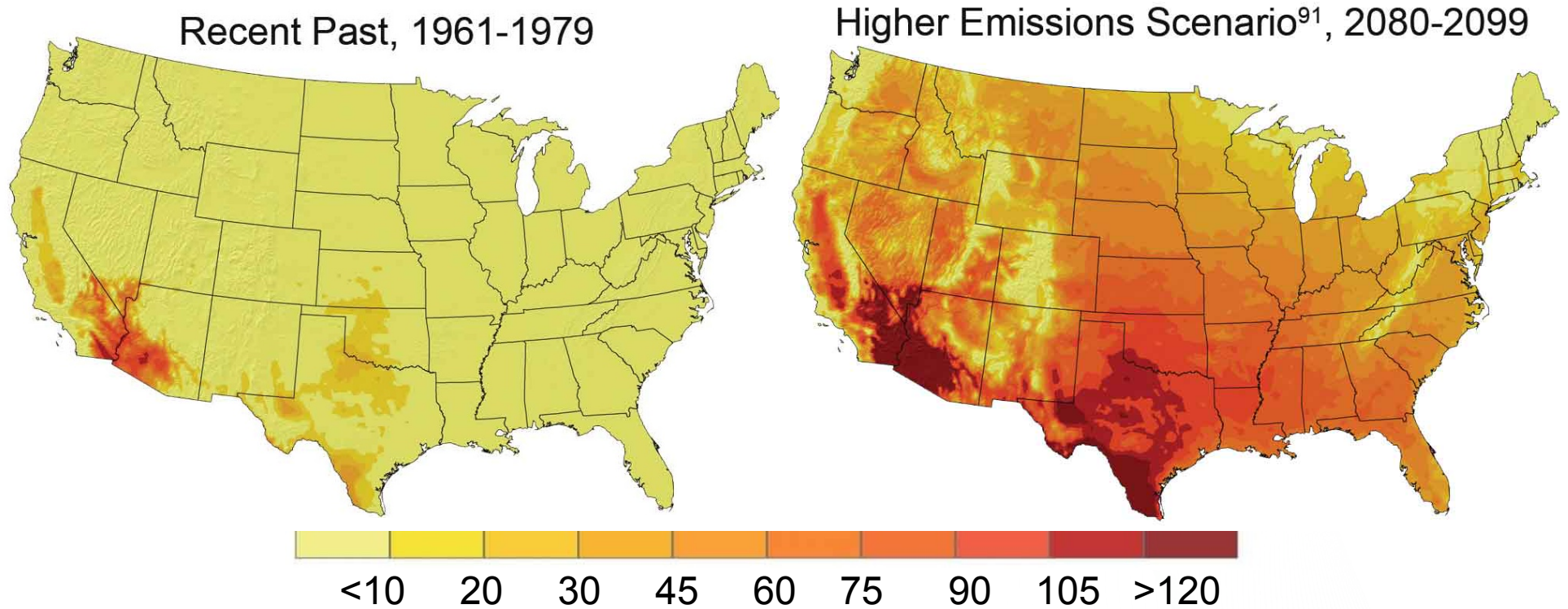
## Global Land–Ocean Temperature Index



- Global analysis includes
- day/night differences
  - city effects
- Climate variability from
- Solar irradiance
  - El Nino cycle
  - Arctic Oscillation
  - ...

<http://data.giss.nasa.gov/gistemp/>  
(Hansen et al.)

# Predicted days above 100° F



Much of the U.S. would go from 0 - 10 days above 100° F to 45 to 70 days per year above 100° F

Source: NOAA U.S. Global Change Research Program (climate.gov)

# Carbon dioxide and climate

*On the Influence of Carbonic Acid  
in the Air upon the Temperature of  
the Ground*

Svante Arrhenius

Philosophical Magazine and Journal of Science  
Series 5, Volume 41, April 1896, pages 237-276.



SA was really interested in explaining ice ages...

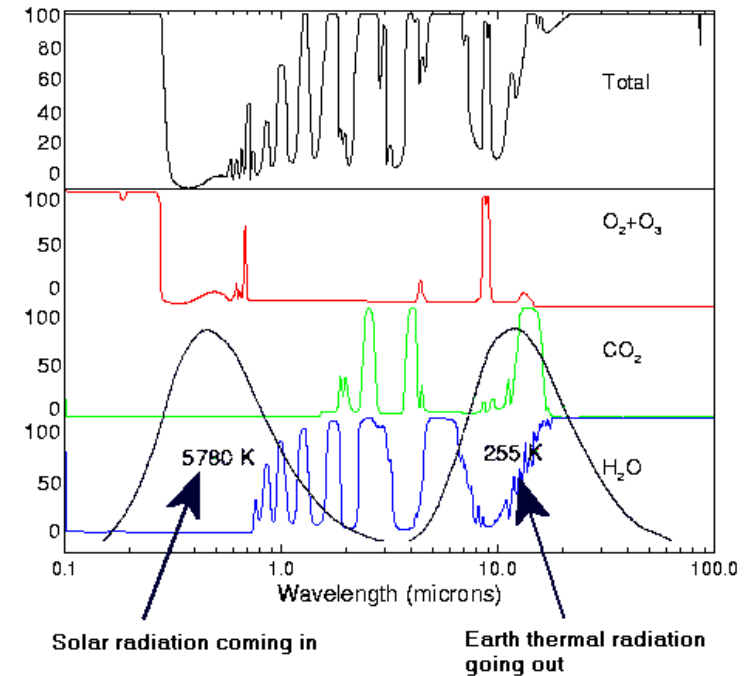
$$\Delta F = \alpha \ln\left(\frac{C}{C_0}\right)$$

$$\Delta T = \lambda \Delta F$$

$$\alpha = 5.35 \text{ Wm}^{-2}$$

$$\lambda = 0.85 \frac{K}{(\text{Wm}^{-2})}$$

- Radiative forcing proportional to the log of the CO<sub>2</sub> concentration
- Proportional to T
- Doubling CO<sub>2</sub> means increasing temperature by about 3K (or 5.4°F)
- λ emerges from coupled-ocean-atmosphere models
- α taken from experiments





# GHG sources: mainly CO<sub>2</sub>

## Sources

Energy  
Electricity & power  
Transportation



Waste



Land

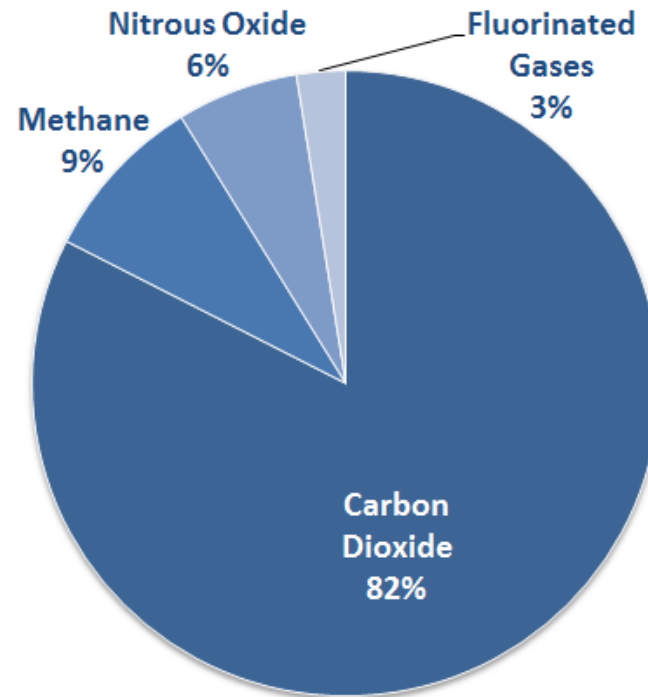


Industry



Other

2012: 6.5M metric tons of CO<sub>2</sub> equivalent



Source: <http://www.epa.gov/climatechange/ghgemissions/usinventoryreport.html>

# US China bilateral agreements

## Copenhagen accord (January 2010)

## US-China Joint Announcement on Climate Change and Clean Energy cooperation (11 November 2014)

- **Reduced US carbon footprint (reduction of 2.3-2.8% per year)**
- **China: 20% of energy needs from clean sources (800 – 1,000 GW) by 2030 (nuclear, wind, solar,...)**

Represents a major policy driver for energy relevant materials and chemistry R&D

[http://www.chinafaqs.org/files/chinainfo/China\\_CPH\\_Accord\\_Submission\\_Letter.pdf](http://www.chinafaqs.org/files/chinainfo/China_CPH_Accord_Submission_Letter.pdf)

<http://www.whitehouse.gov/the-press-office/2014/11/11/fact-sheet-us-china-joint-announcement-climate-change-and-clean-energy-c>

29/01 2010 14:57 FAX 68505877

001

中国国家发展和改革委员会应对气候变化司

DEPARTMENT OF CLIMATE CHANGE, NATIONAL DEVELOPMENT & REFORM COMMISSION OF CHINA  
No. 38, Yue Tan Nan Jie, Beijing, 100824, China, Tel: +86-10-68505862, Fax: +86-10-68505881

28 January 2010

Executive Secretary  
UNFCCC Secretariat  
Bonn, Germany  
Fax: +49-228-8151997

Dear Mr. Yvo de Boer,

I have the honor to communicate to you the information on China's autonomous domestic mitigation actions as announced, for information to the UNFCCC Parties, as follows:

China will endeavor to lower its carbon dioxide emissions per unit of GDP by 40-45% by 2020 compared to the 2005 level, increase the share of non-fossil fuels in primary energy consumption to around 15% by 2020 and increase forest coverage by 40 million hectares and forest stock volume by 1.3 billion cubic meters by 2020 from the 2005 levels.

Please note that the above-mentioned autonomous domestic mitigation actions are voluntary in nature and will be implemented in accordance with the principles and provisions of the UNFCCC, in particular Article 4, paragraph 7.

This Communication is made in accordance with the provisions of Articles 12, paragraph 1(b), Article 12, paragraph 4 and Article 10, paragraph 2(a).

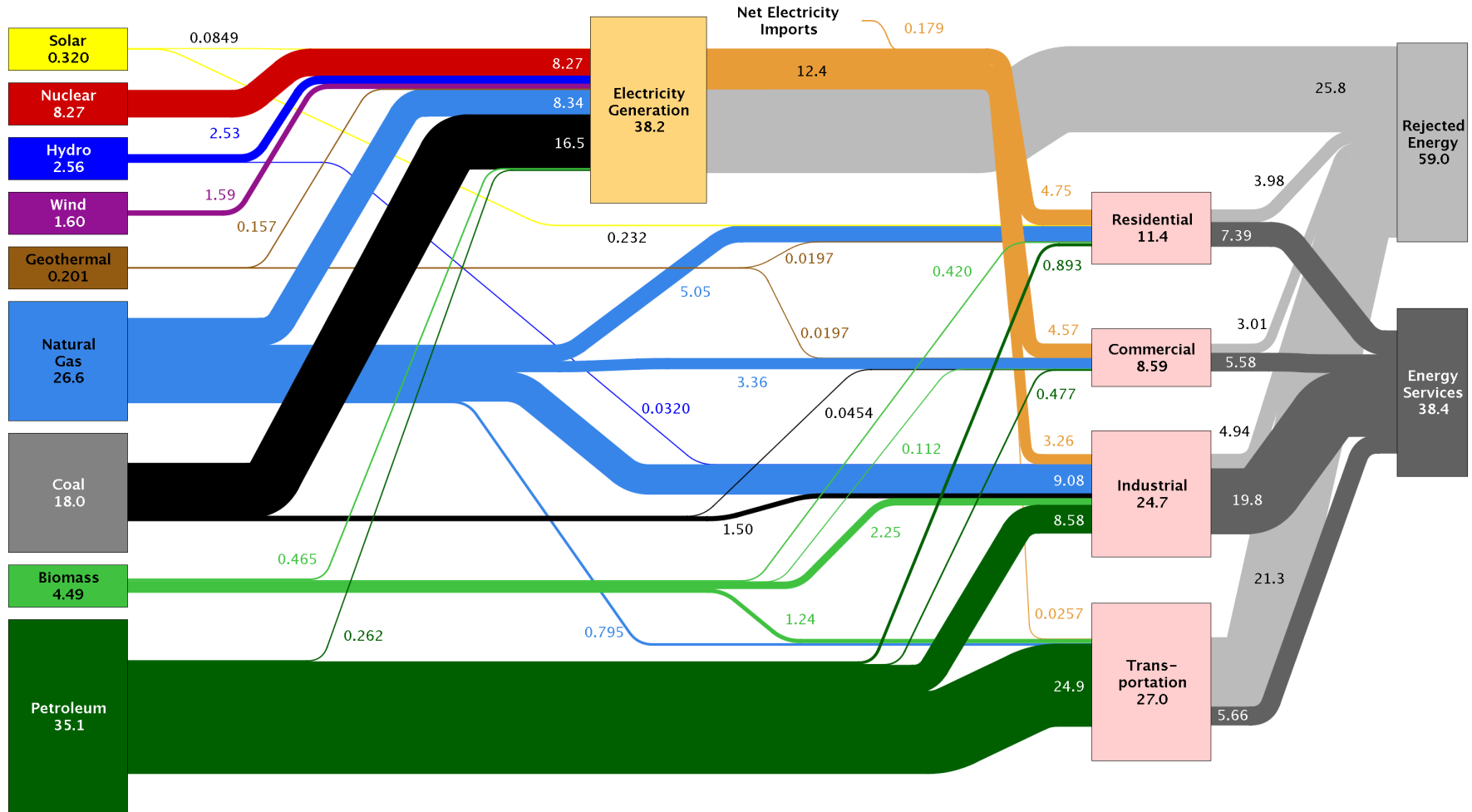
Sincerely yours,



SU Wei  
Director General  
Department of Climate Change  
National Development and Reform Commission of China  
(National Focal Point)

# US Energy Production and Usage 2013 (97.4 Quads)

Estimated U.S. Energy Use in 2013: ~97.4 Quads



Source: LLNL 2014. Data is based on DOE/EIA-0035(2014-03), March, 2014. If this information or a reproduction of it is used, credit must be given to the Lawrence Livermore National Laboratory and the Department of Energy, under whose auspices the work was performed. Distributed electricity represents only retail electricity sales and does not include self-generation. EIA reports consumption of renewable resources (i.e., hydro, wind, geothermal and solar) for electricity in BTU-equivalent values by assuming a typical fossil fuel plant "heat rate." The efficiency of electricity production is calculated as the total retail electricity delivered divided by the primary energy input into electricity generation. End use efficiency is estimated as 65% for the residential and commercial sectors 80% for the industrial sector, and 21% for the transportation sector. Totals may not equal sum of components due to independent rounding. LLNL-MI-410527

# Energy solutions through R&D

## Consumption



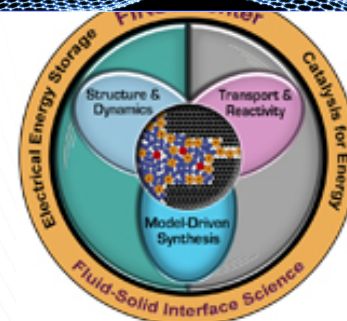
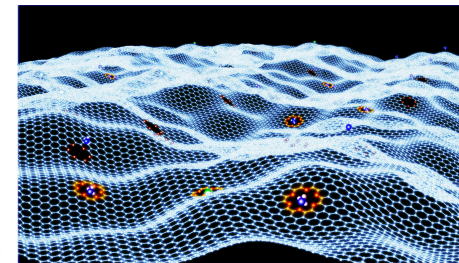
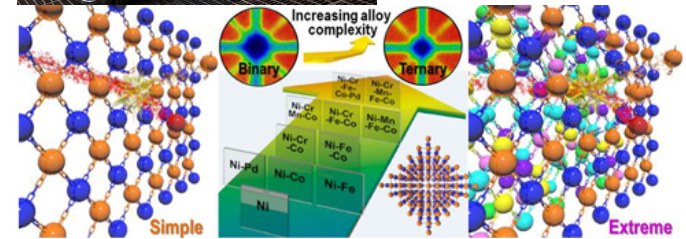
Battery technology  
Advanced biofuels  
Advanced manufacturing

Nuclear fuel materials  
Photovoltaics  
Superconductivity

Catalysis  
Separations chemistry

Theory and simulation  
Materials characterization  
and synthesis

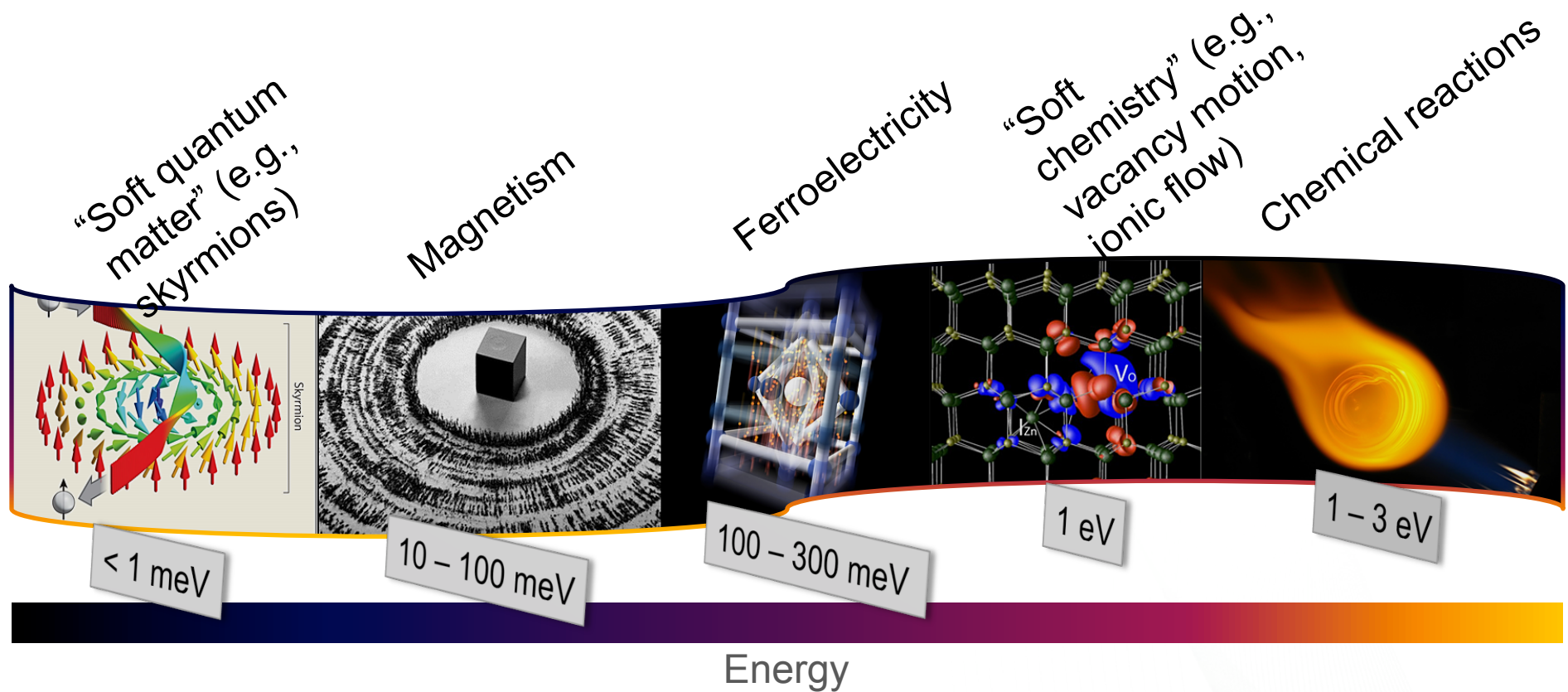
## Reduced consumption through S&T



RIDGE  
laboratory



# Coupled physical and chemical processes span a broad energy scale



Need to develop the appropriate tools to understand processes



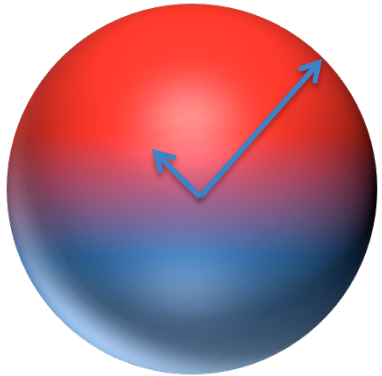
# Beyond exascale computing

# Science questions for quantum computing

● 1 = on

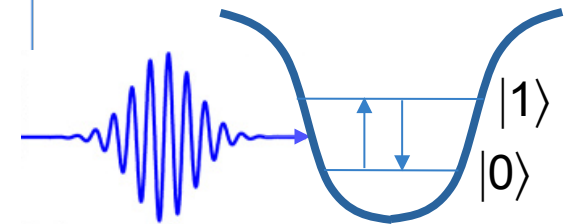
● 0 = off

Classical: definite



$|\Psi\rangle = a|0\rangle + b|1\rangle$   
 $|a|^2 + |b|^2 = 1$

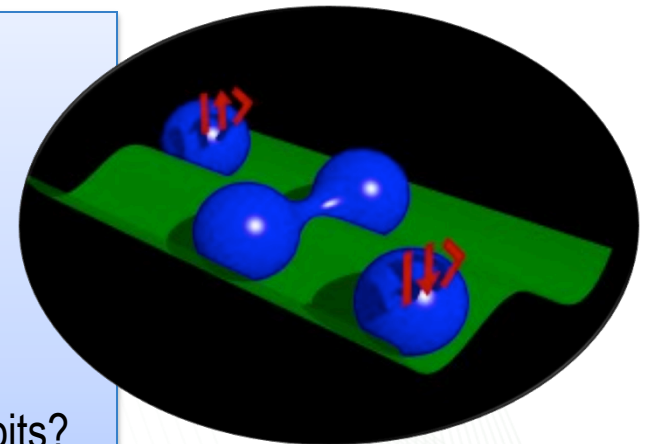
Quantum: state superposition



Must prepare and probe with external fields

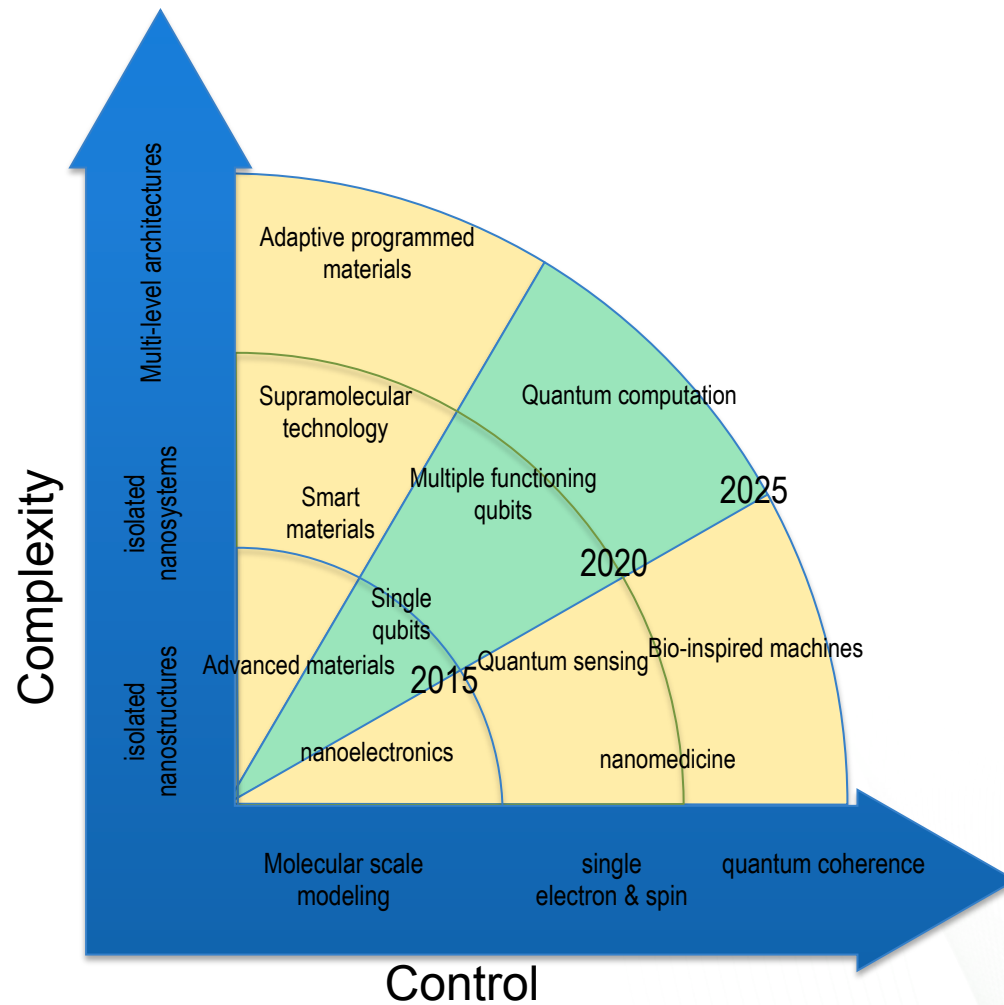
## Science questions:

- How does entanglement work across several qubits?
- How does one preserve entanglement for long times?
- How does the environment affect the entanglement?
- What quantum many-body phenomena emerge across many qubits?
- What can a set of qubits calculate (new algorithms)?





# Control-complexity phase space



# Classical Logic

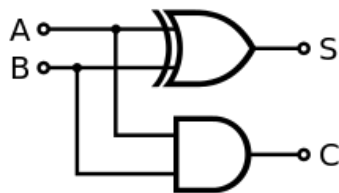
Basic gate: XOR

Input A	Input B	Output A XOR B
0	0	0
0	1	1
1	0	1
1	1	0

Basic gate: AND

Input A	Input B	Output A And B
0	0	0
0	1	0
1	0	0
1	1	1

Input		Output	
A	B	C	S
0	0	0	0
1	0	0	1
0	1	0	1
1	1	1	0



Half adder

# Quantum Logic

*If quantum mechanics hasn't profoundly shocked you, you haven't understood it yet.*  
 – Niels Bohr



Before		After	
Control	Target	Control	Target
0	0	0	0
0	1	0	1
1	0	1	1
1	1	1	0

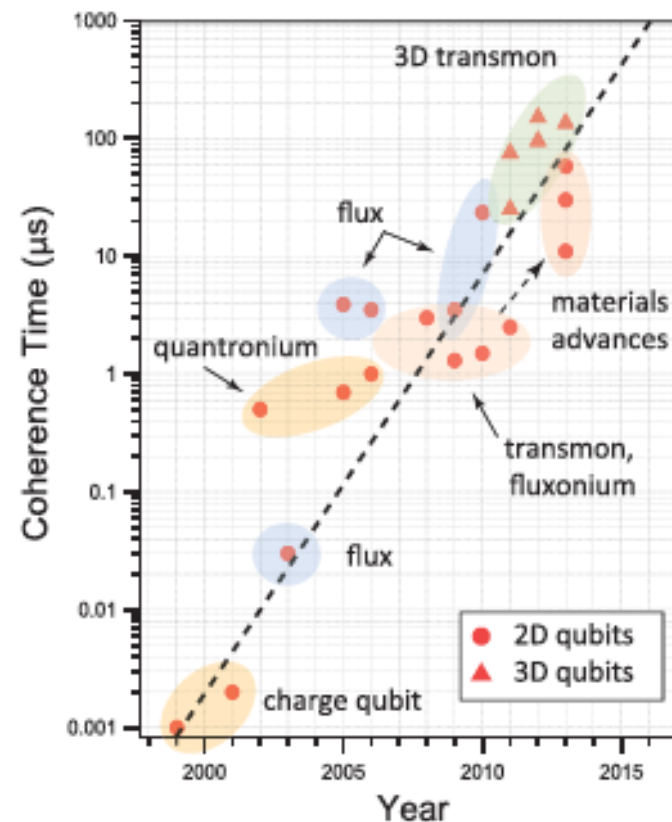
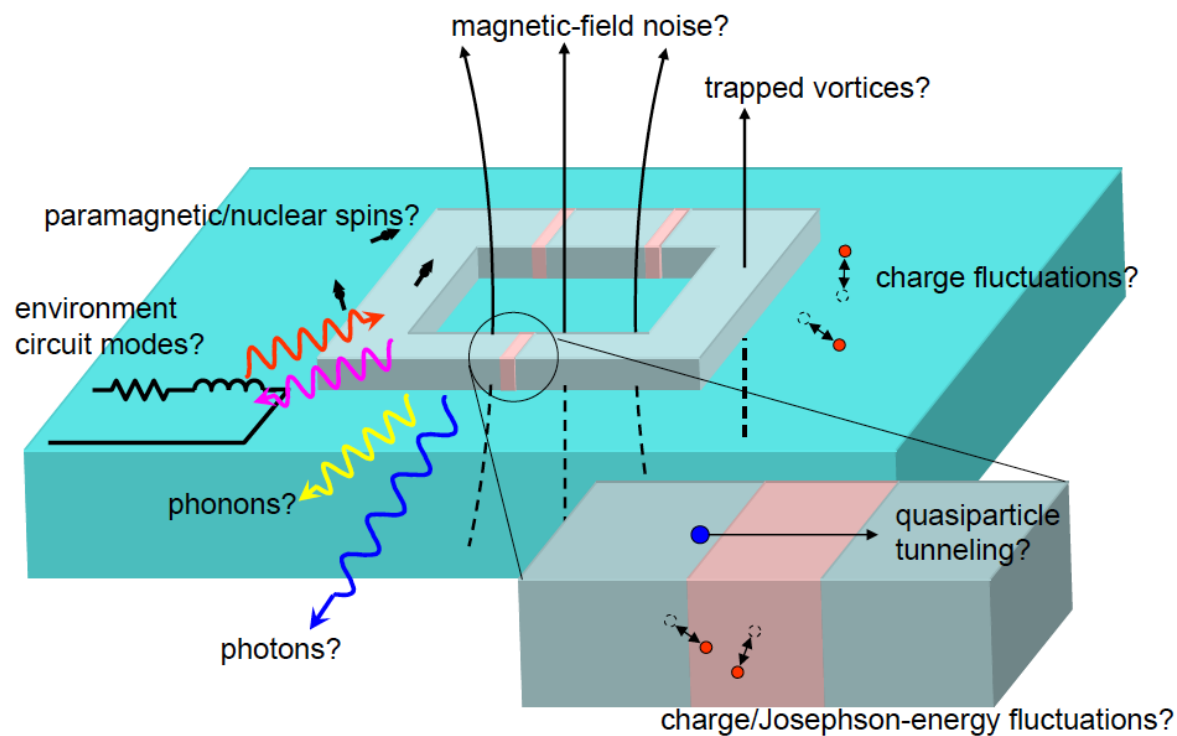
A CNOT gate flips the second bit if and only if the first bit is 1

$$|\psi\rangle = a|00\rangle + b|01\rangle + c|10\rangle + d|11\rangle$$

$$CNOT = \begin{bmatrix} 1 & 0 & 0 & 0 \\ 0 & 1 & 0 & 0 \\ 0 & 0 & 0 & 1 \\ 0 & 0 & 1 & 0 \end{bmatrix}$$



# Qubit challenge: coherence

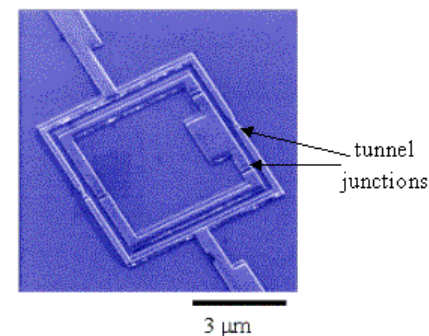


Oliver & Welander, MRS Bull. 38, 816 (2013)

Material effects cause decoherence

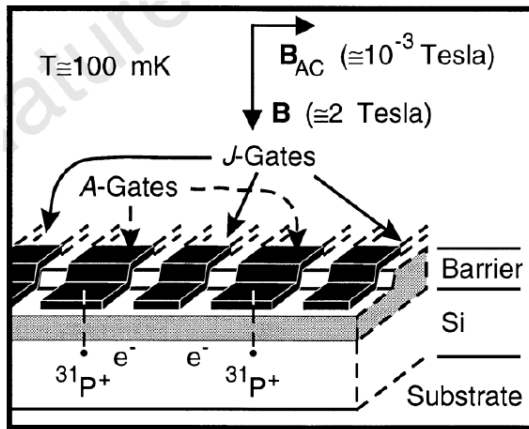
Solution:

- Reduce noise sensitivity through design, modeling and experiments
- Identify & reduce noise sources via materials and fabrication improvements

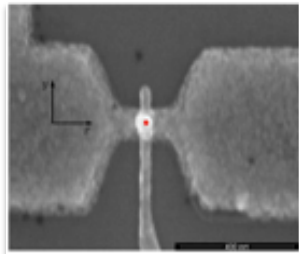


# Device implementation

## “Standard” Plan for Si:P-based Devices

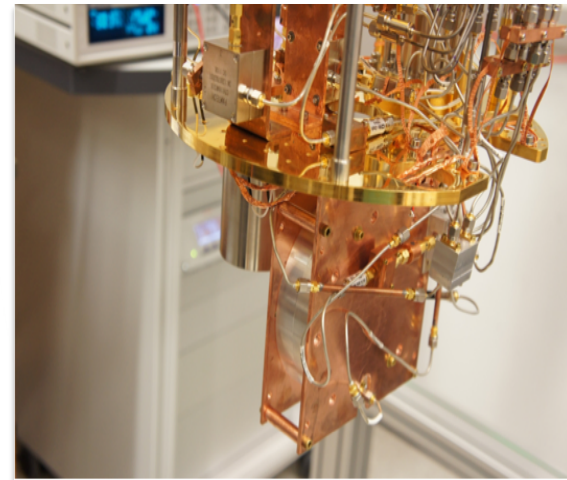
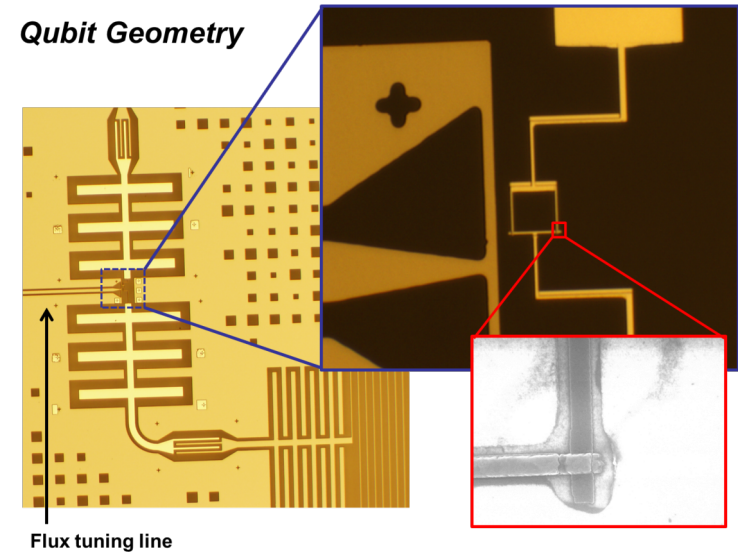


B.E. Kane, Nature **393**, 133 (1998).



Phosphorous donor from Sydney

## Schuster experiment (U Chicago)





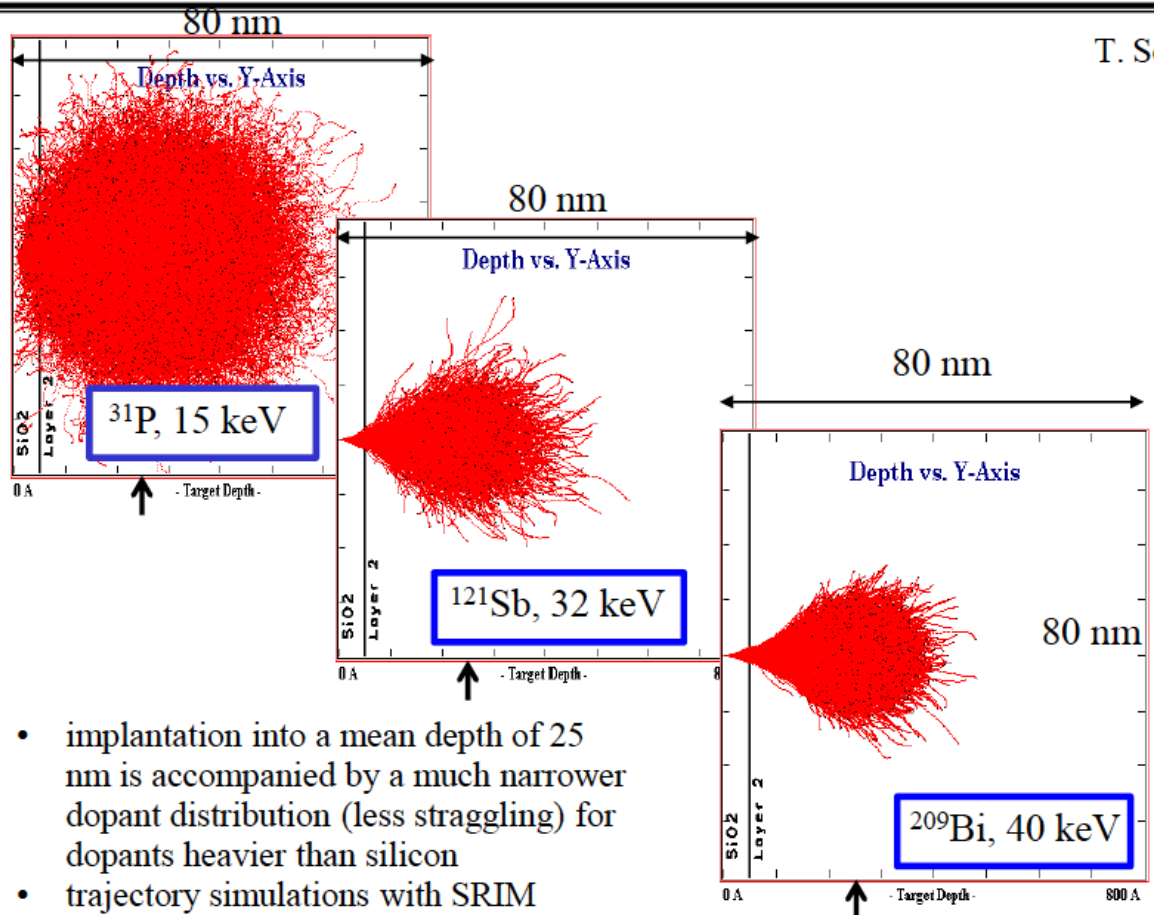
# Precision placement?



Straggling effect: scattering kinematics favours implantation of heavy donors into Si

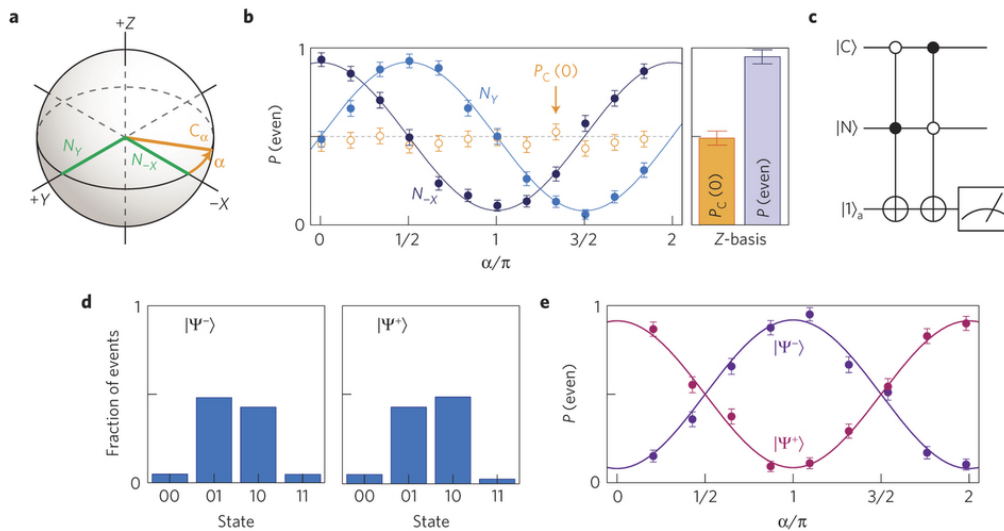
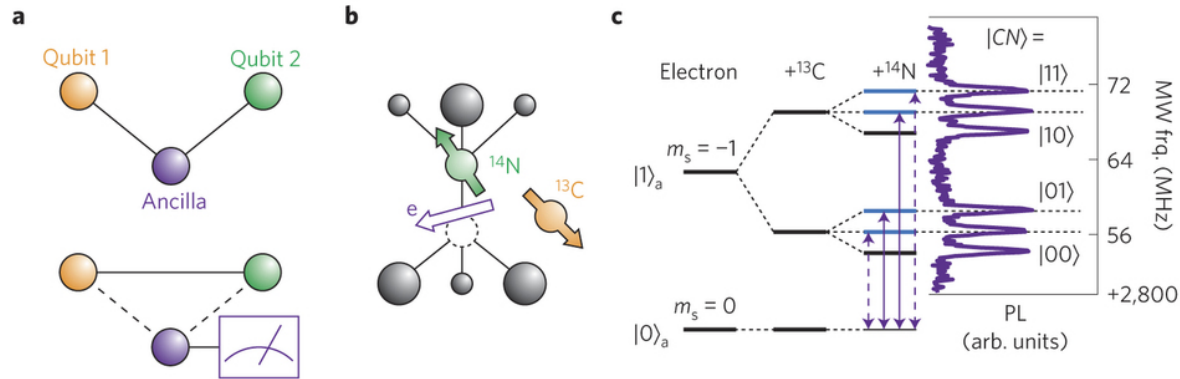
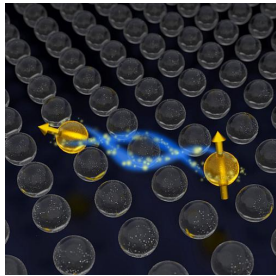


T. Schenkel, LBNL



- implantation into a mean depth of 25 nm is accompanied by a much narrower dopant distribution (less straggling) for dopants heavier than silicon
- trajectory simulations with SRIM

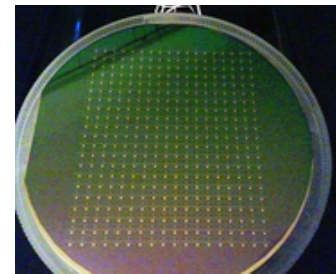
# Quantum measurement in diamond



- State preparation
- State manipulation (rf-field)
- Setting up a Toffoli gate
- Measurement of the entangled state

Everything about 'quantum computing' is time dependent

Demonstration of entanglement by measurement of solid state qubits, Pfaff, Nature Physics 9, 29 (2013)



ANL public-private partnership with AKHAN Semiconductor



# Science and engineering questions

- **Materials**

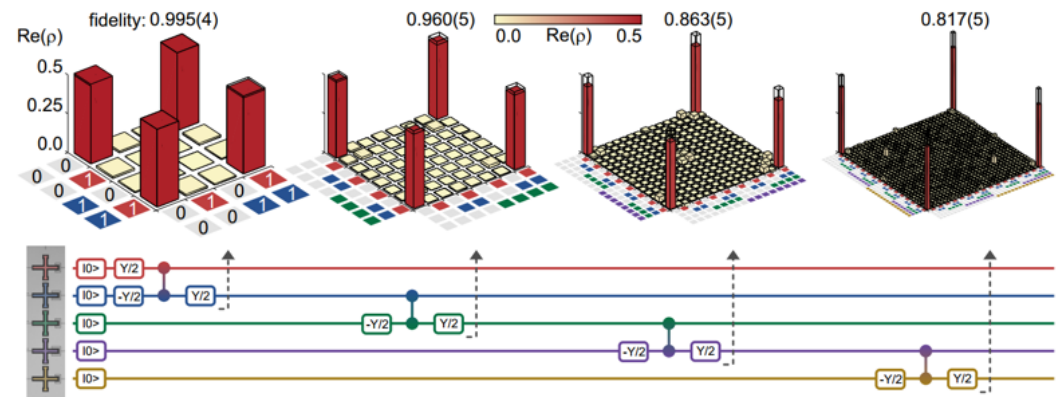
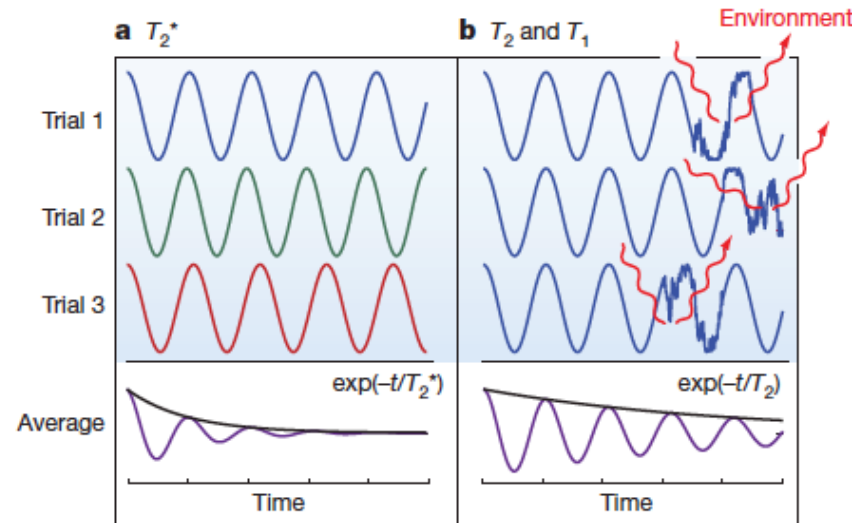
What are the materials properties that must be controlled in order to increase coherence (in time and space)?

- **Qubits**

How do we *reliably* make a few entangled qubits?

- **Computing models**

What is the computing model for coupling quantum and classical computing?



5 qubit reliability in ion traps = 82%  
Nature 508, 500 (2014)



# Discussion and conclusion

- **We have great tools for scientific discovery**
  - Experimental facilities: RHIC, TJLab, FRIB, ANL, LHC, SNS,...
  - Computational (theoretical) facilities: Leadership computing, NERSC
- **We have great problems to solve**
  - QCD, quantum many-body problems, astrophysics, beyond SM
  - Significant discovery potential
- **You can and do make a difference**