

The Mathematics Behind Energy and Earth Systems Modeling



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Lawrence Berkeley National Laboratory

3,800 employees, ~\$660 M / year budget

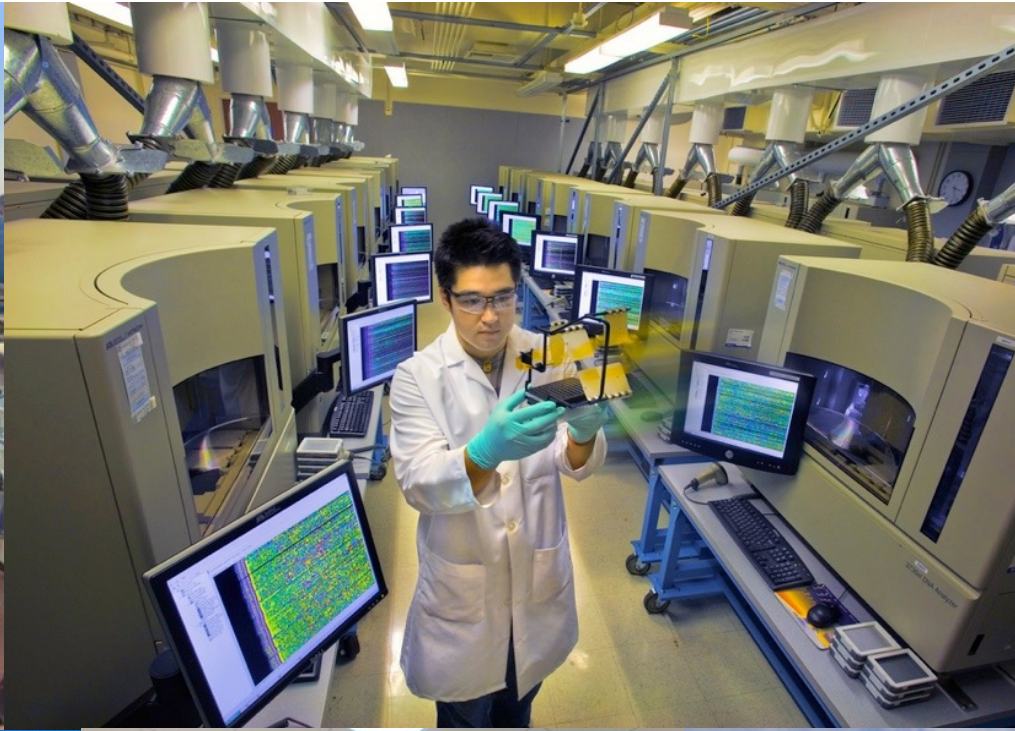
**11 employees were awarded the Nobel Prize,
(9 did their Nobel work at the Lab.)**

**(Over 55 Nobel Laureates either trained or had significant
collaborations at LBNL)**

Today:

**~ 3% of the members of National Academy of Sciences,
18 in the National Academy of Engineering,
2 in the Institute of Medicine**

World-Class User Facilities and Research Institutes underpin today's LBNL



WORLD-CLASS USER FACILITIES AND RESEARCH INSTITUTES UNDERPIN TODAY'S LBNL

National Energy Research Scientific Computing Center

Franklin: Cray XT4

38,128 processors

352 TFlops/sec

11th most powerful computer

2.2 MW

ESNet

NERSC 6

153,600 processors

1.17 Pflops/s

3.3 MW



CRAY XT-4 “FRANKLIN”



38,288 compute cores
356 Tflop/sec peak
76 TB memory
436 TB usable disk space
50 PB storage archive

14,000 x



10 x



Climate Modeling and Energy Technologies

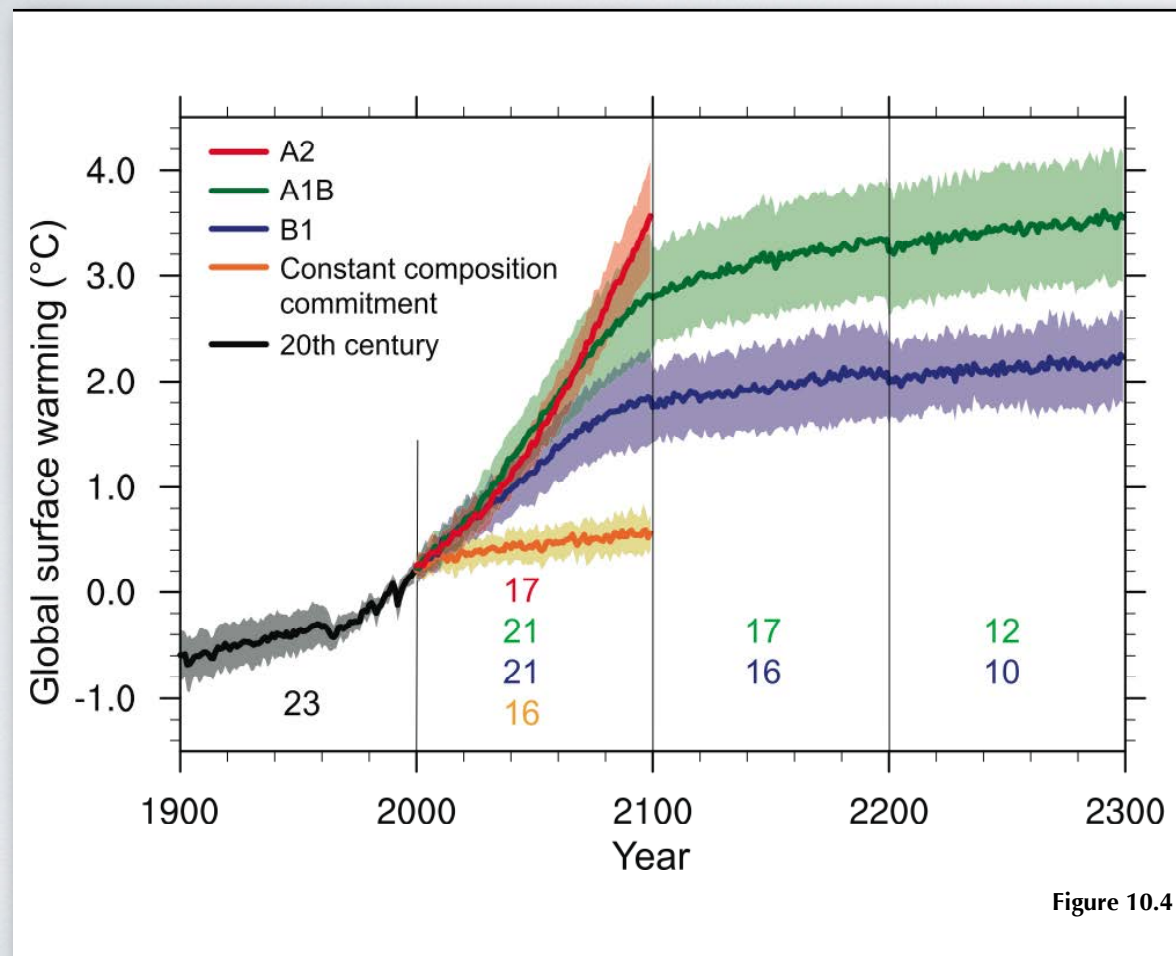


Solar Arrays at millions of acres?

Coal to Natural Gas?
What about aerosols?

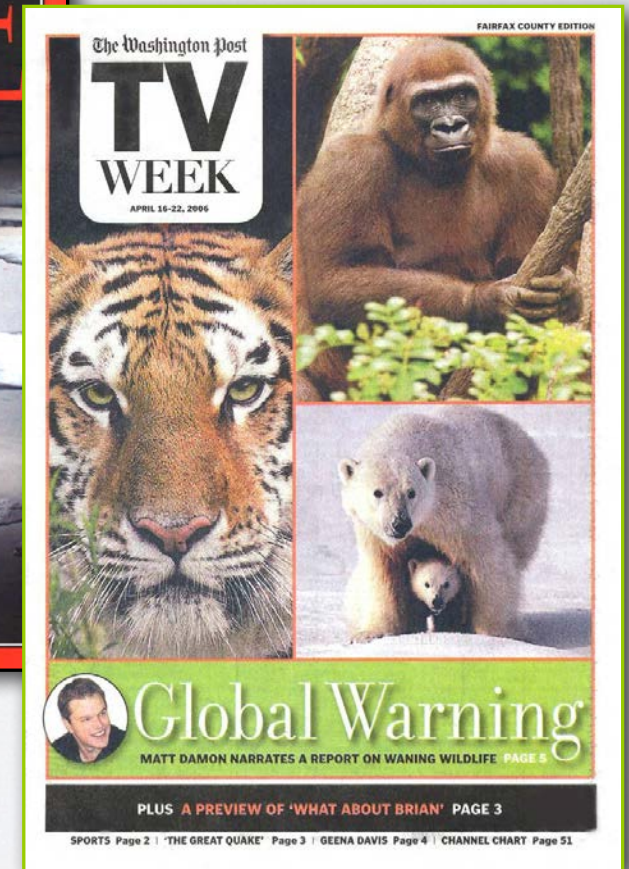
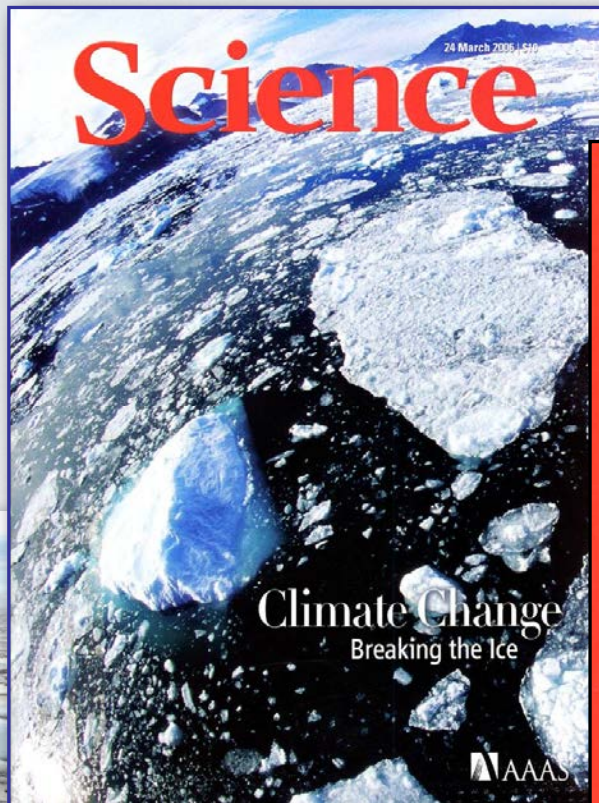


WE'LL CONSIDER THREE AREAS WHERE MATH, ENERGY, AND CLIMATE INTERSECT



- What can we say about our future climate and its effects on us?
- What are we doing today to improve our use of energy?
- What can we do to change how we use

CLIMATE CHANGE IS BIG NEWS

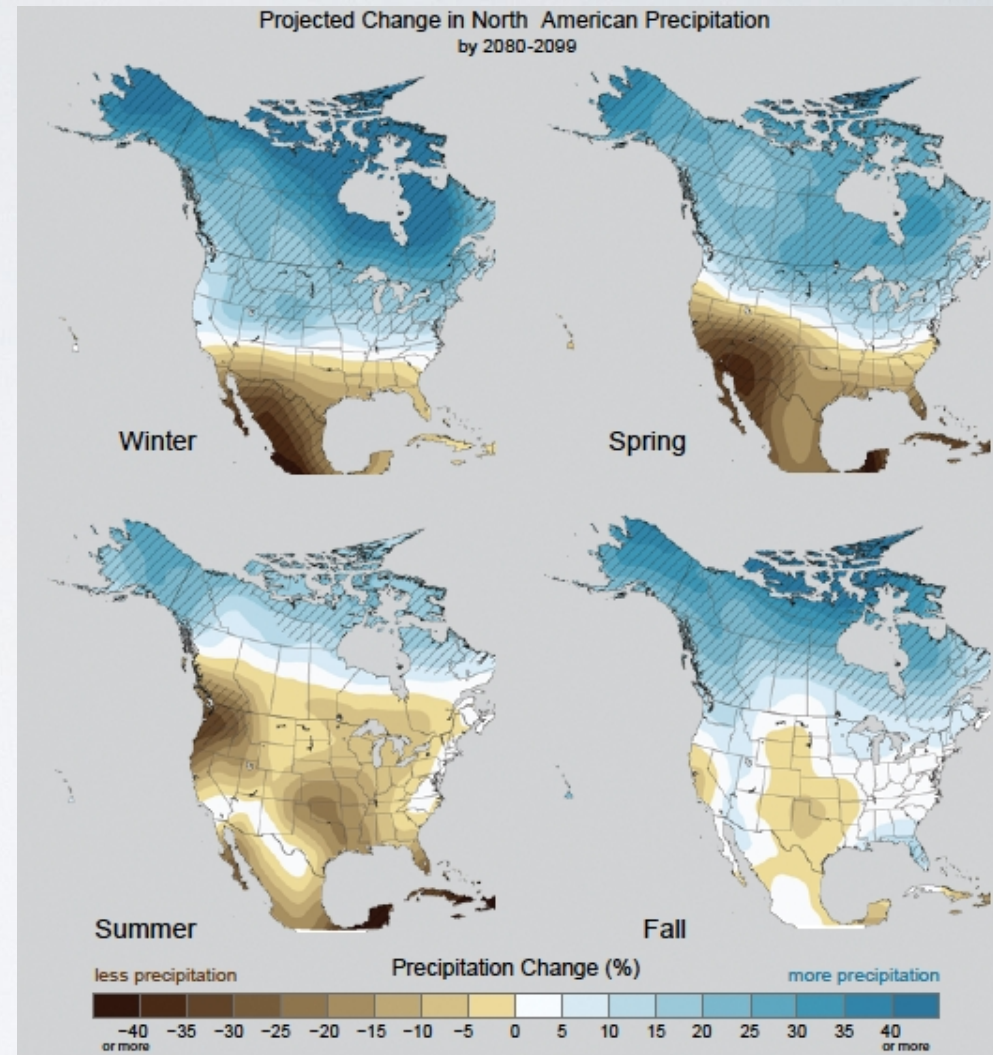


GLOBAL WARMING



KEY FINDINGS

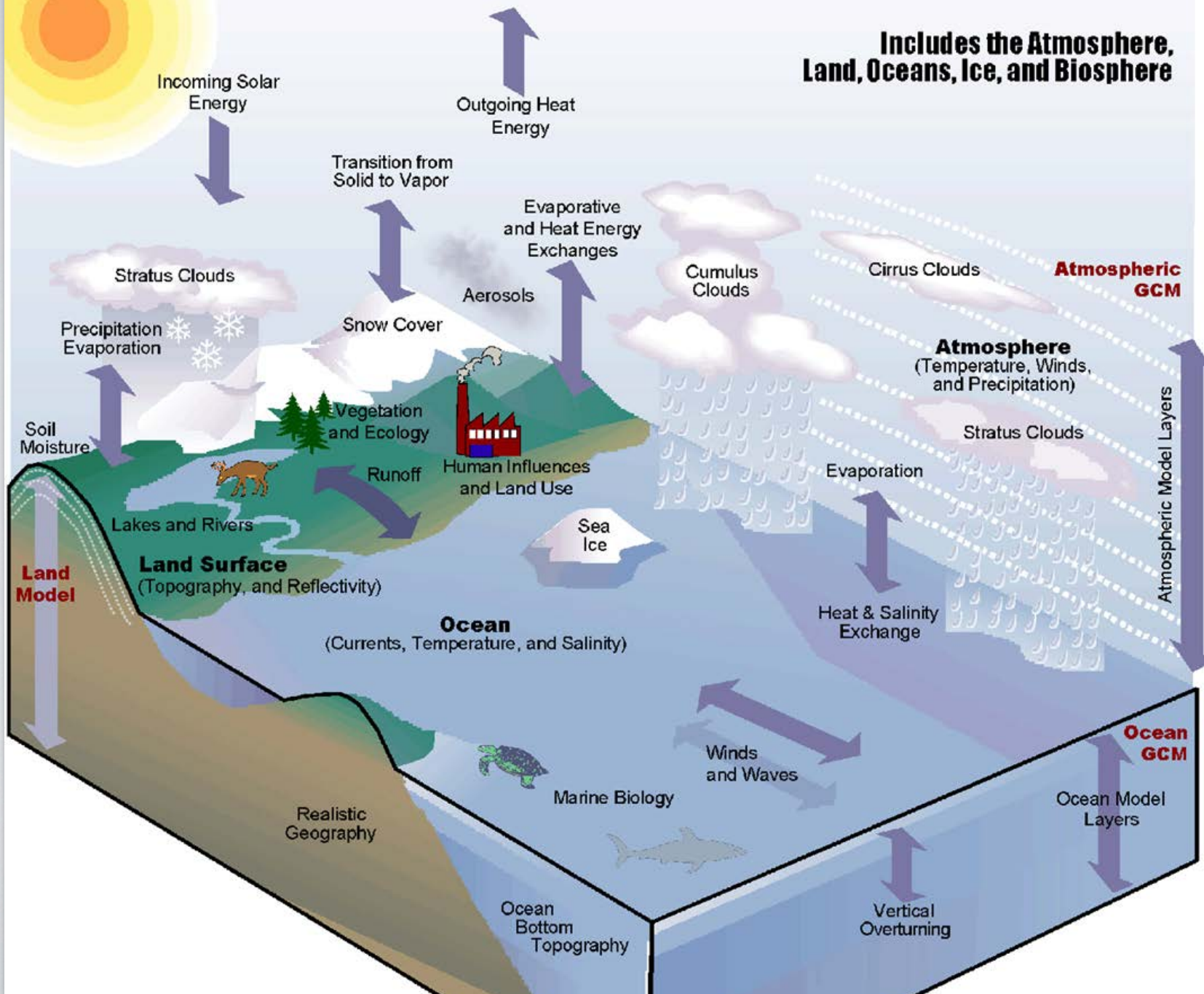
1. Global warming is unequivocal and primarily human-induced.
2. Climate changes are underway in the United States and are projected to grow.
3. Widespread climate-related impacts are occurring now and are expected to increase.
4. Climate change will stress water resources.
5. Crop and livestock production will be increasingly challenged.
6. Coastal areas are at increasing risk from sea-level rise and storm surge.
7. For more information see:
www.globalchange.gov



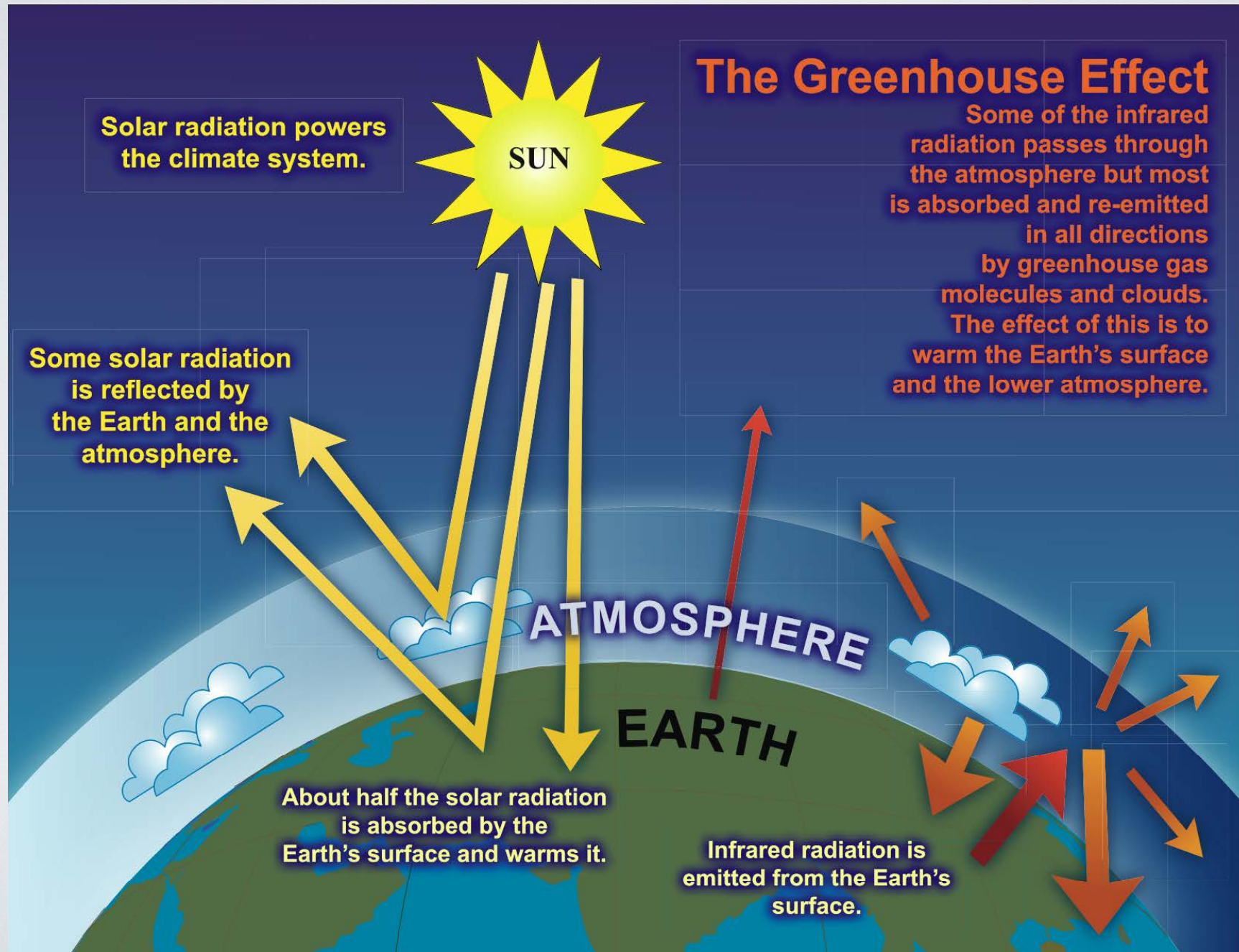
Global Climate Change Impacts in the United States, Thomas R. Karl, Jerry M. Melillo, and Thomas C. Peterson, (eds.). Cambridge University Press, 2009.

Modeling the Climate System

**Includes the Atmosphere,
Land, Oceans, Ice, and Biosphere**

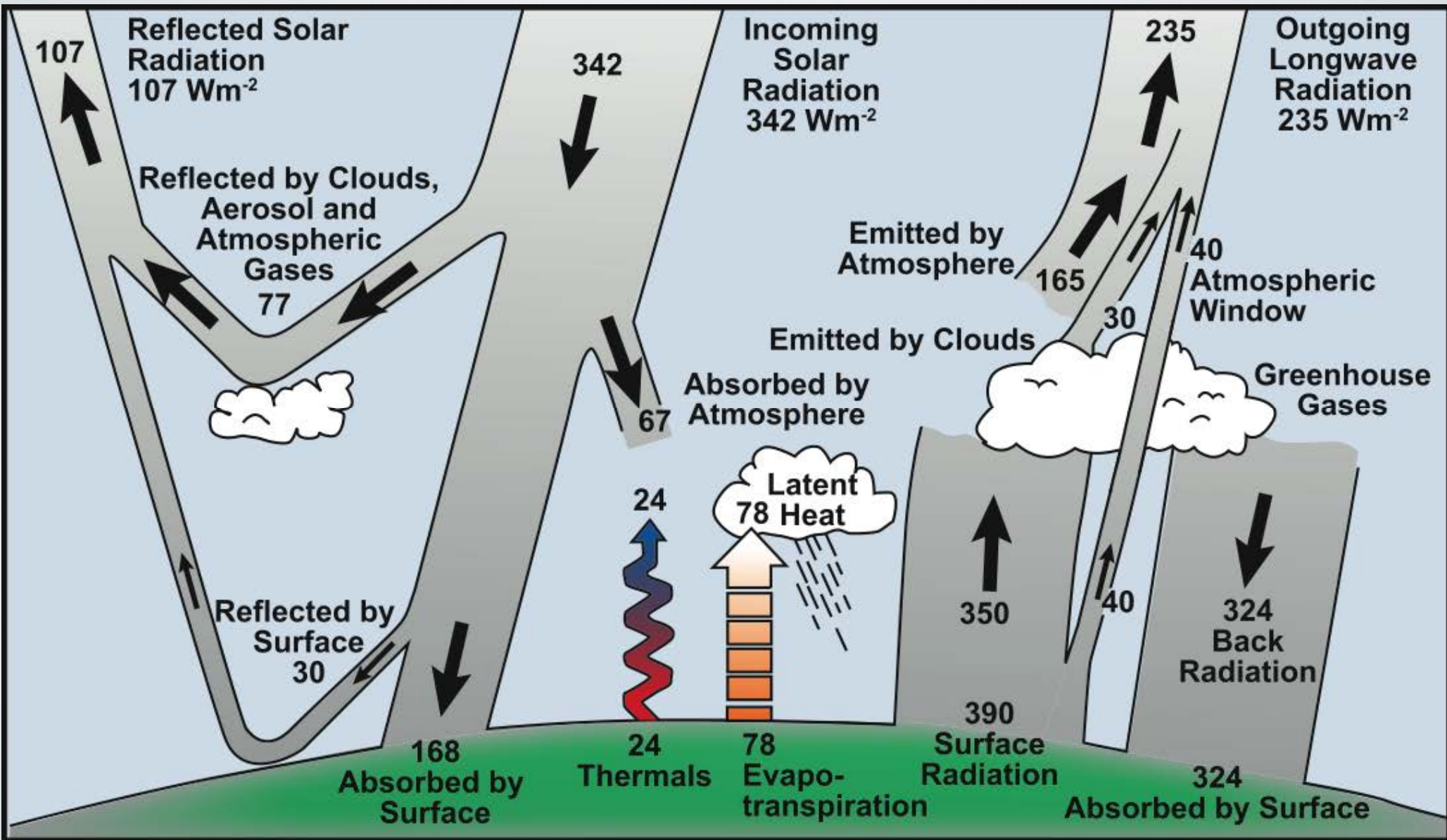


GREENHOUSE EFFECT



ATMOSPHERE ENERGY BALANCE

$$342 = 107 + 235$$



FIRST MENTION OF GREENHOUSE EFFECT

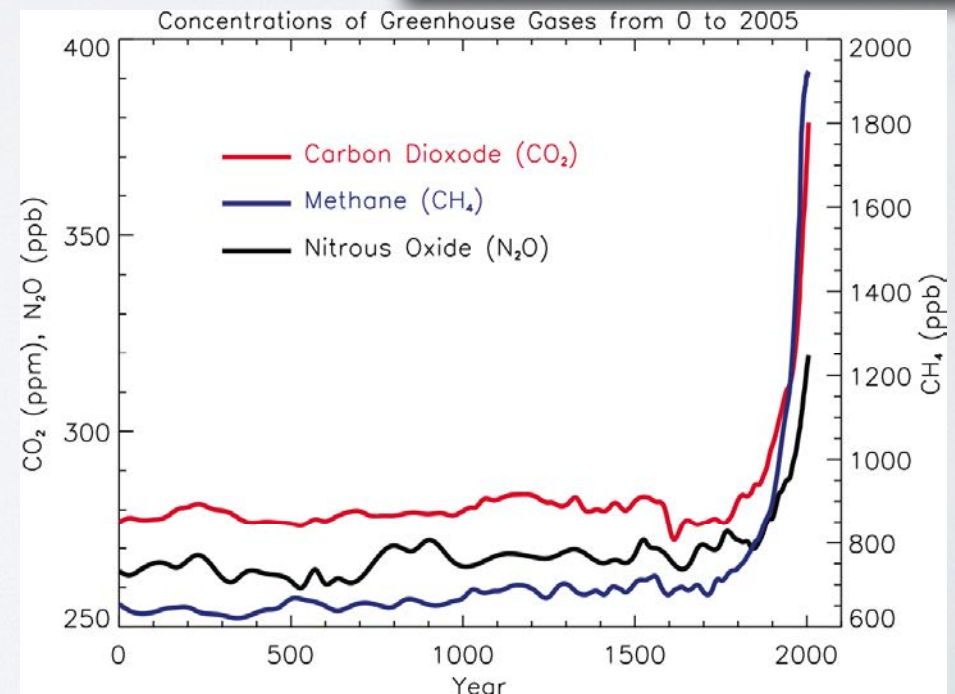
- Developed mathematical theory for the temperature of the terrestrial globe
- *“The temperature [of the Earth] can be augmented by the interposition of the atmosphere, because heat in the state of light finds less resistance in penetrating the air, than in repassing into the air when converted into non-luminous heat”*
- General Remarks on the Temperature of the Terrestrial Globe and the Planetary Spaces (1824)



JEAN BAPTISTE JOSEPH FOURIER

ANNUAL GLOBAL RELEASE OF CO₂ IS 27 BILLION TONS

- In US, combustion
 - Transportation
 - Power generation
- 40% coal, 40% oil, 20% natural gas
- US consumes (per day):
 - 20 million barrels of oil
 - 60 billion cubic feet natural gas
 - 3 million tons of coal



**WHAT CAN WE SAY ABOUT
OUR FUTURE CLIMATE AND
ITS EFFECTS ON US?**

PRIMITIVE EQUATIONS FOR ATMOSPHERE



LEWIS FRY RICHARDSON

$$\frac{du}{dt} - \left(f + u \frac{\tan \phi}{a} \right) v = -\frac{1}{a \cos \phi} \frac{1}{\rho} \frac{\partial p}{\partial \lambda} + F_\lambda$$

$$\frac{dv}{dt} + \left(f + u \frac{\tan \phi}{a} \right) u = -\frac{1}{\rho a} \frac{\partial p}{\partial \phi} + F_\phi$$

$$g = -\frac{1}{\rho} \frac{\partial p}{\partial z}$$

momentum

$$\frac{\partial \rho}{\partial t} = -\frac{1}{a \cos \phi} \left[\frac{\partial}{\partial \lambda} (\rho u) + \frac{\partial}{\partial \phi} (\rho v \cos \phi) \right] - \frac{\partial}{\partial z} (\rho w)$$

mass

$$C_p \frac{dT}{dt} - \frac{1}{\rho} \frac{dp}{dt} = Q$$

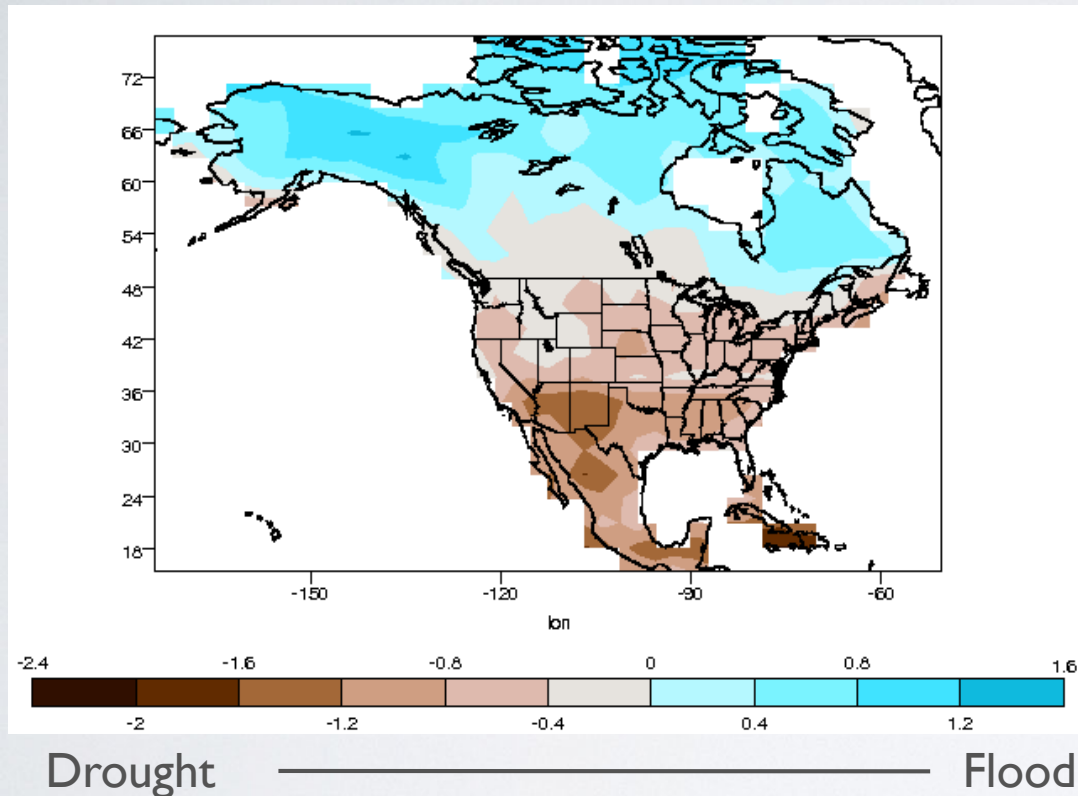
energy

$$p = \rho R T$$

equation of state

DROUGHT CONDITIONS INCREASE IN SW US AND MEXICO

- Most of SW US and Mexico would be in drought, while most of Canada would be in flood conditions
- Precipitation decreases in the Southwest and increases substantially in the Northern latitudes
- This assumes that the CO₂ content of the atmosphere stabilizes to 720ppm in the



The predicted average value of PDSI in 2090 using the 1950-1999 period as a reference. Analysis of 22 models contributed to IPCC AR4 database

M.F.Wehner (LBNL) et al. work in progress

THE GENERALIZED EXTREME VALUE (GEV) DISTRIBUTION CAN BE USED TO STUDY CLIMATE

$$F(x) = \begin{cases} e^{-[1+\xi(x-\mu)/\sigma]^{-1/\xi}} & , \quad \xi \neq 0 \\ e^{-e^{-(x-\mu)/\sigma}} & , \quad \xi = 0 \end{cases}$$

where μ = location, σ = scale, ξ = shape

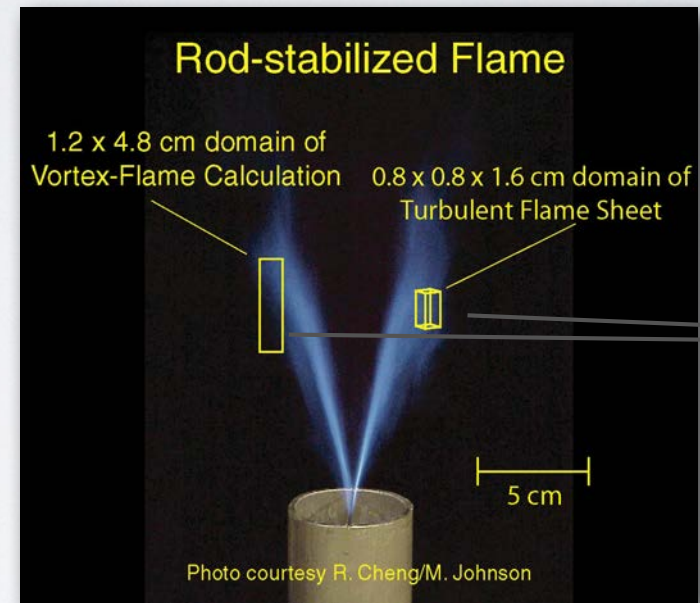
The return value of a random variable, X_T is that value that is exceeded, on average, once in a period of time, T

$$X_T = \begin{cases} \mu + \sigma[1 - \{-\ln(1 - 1/T)\}]^{-\xi}/\xi & , \quad \xi \neq 0 \\ \mu - \sigma[\ln(-\ln(1 - 1/T))] & , \quad \xi = 0 \end{cases}$$

**WHAT ARE WE DOING
TODAY TO IMPROVE OUR
USE OF ENERGY?**

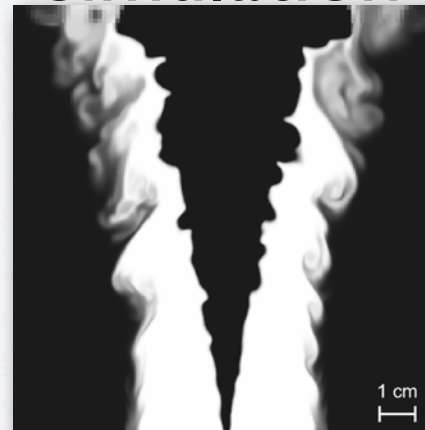
INCREASING COMBUSTION EFFICIENCY IS IMPORTANT IN REDUCING GREENHOUSE GASES

- Most new systems are based on lean premixed turbulent combustion because they have potentially high-efficiency and low emissions
- Challenges to system design
 - Natural flame instabilities
 - Sensitivity to fuel
- Advances in applied mathematics have dramatically increased our simulation capability

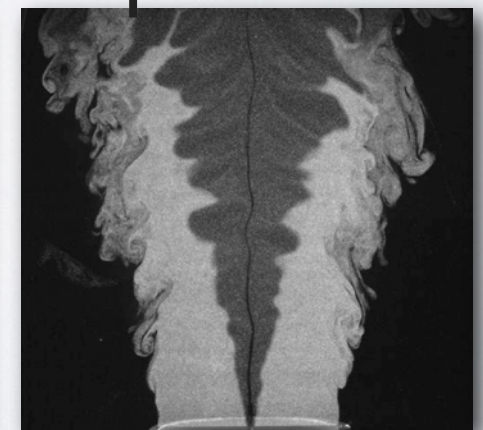


Before

Simulation



Experiment



LOW MACH NUMBER EQUATIONS

$$\rho \frac{DU}{Dt} = -\nabla \pi + \nabla \cdot \tau \quad \text{momentum}$$

$$\frac{\partial \rho Y_m}{\partial t} + \nabla \cdot (\rho U Y_m) = \nabla \cdot (\rho D_m \nabla Y_m) + \dot{\omega}_m \quad \text{species}$$

$$\frac{\partial \rho}{\partial t} + \nabla \cdot (\rho U) = 0 \quad \text{mass}$$

$$\frac{\partial \rho h}{\partial t} + \nabla \cdot (\rho h U) = \nabla \cdot (\lambda \nabla T) + \sum_m \nabla \cdot (\rho h_m D_m \nabla Y_m) \quad \text{energy}$$

Y_m mass fraction

$\dot{\omega}_m$ species production, $\sum \dot{\omega}_m = 0$

h enthalpy, $h = \sum Y_m h_m(T)$

Equation of State $p_0 = \rho R T \sum Y_m / W_m$ equation of state

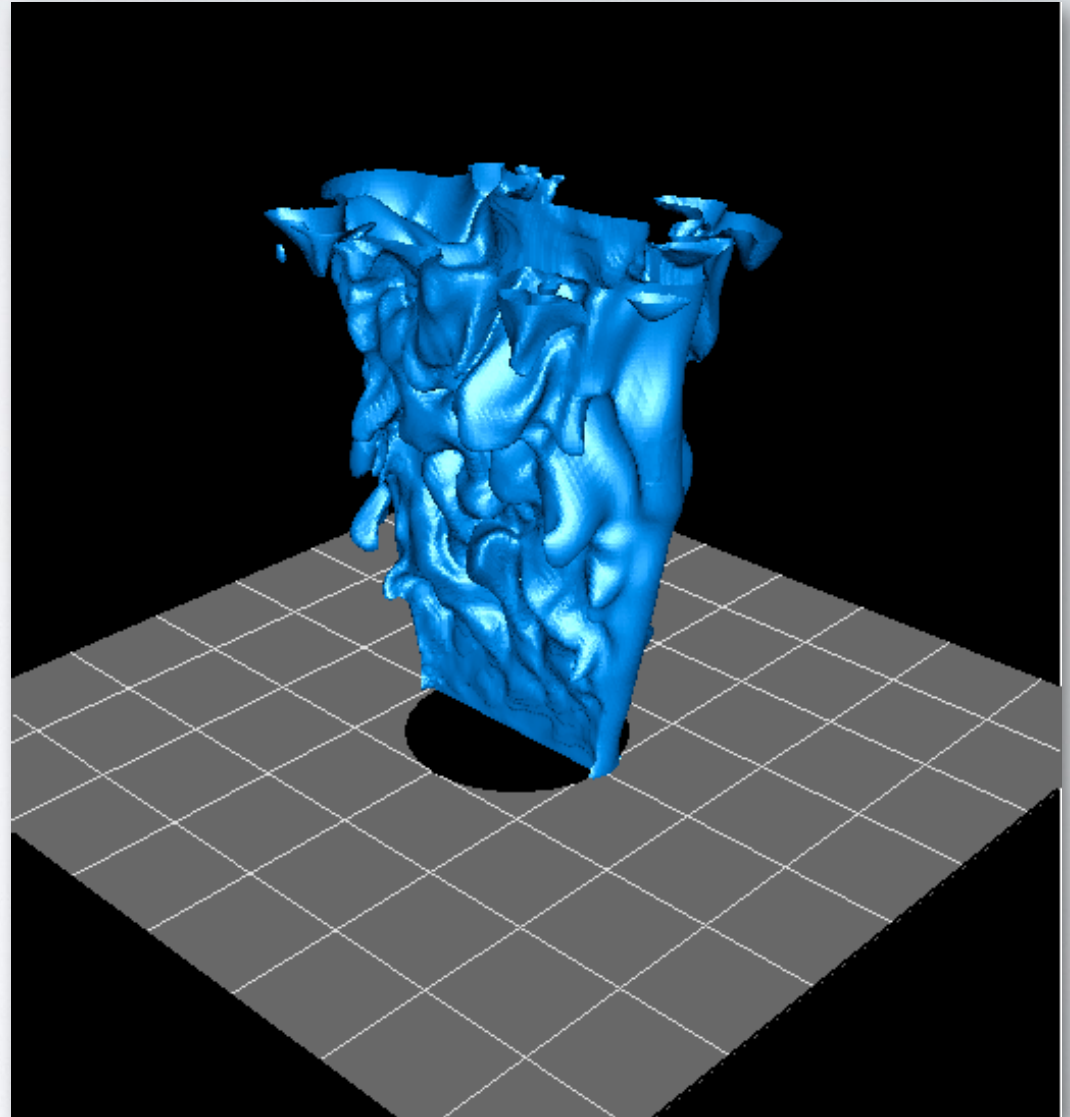
MATHEMATICS GROUP INCREASED SIMULATION CAPABILITY BY A FACTOR OF 10,000

Experimental Turbulent V-Flame

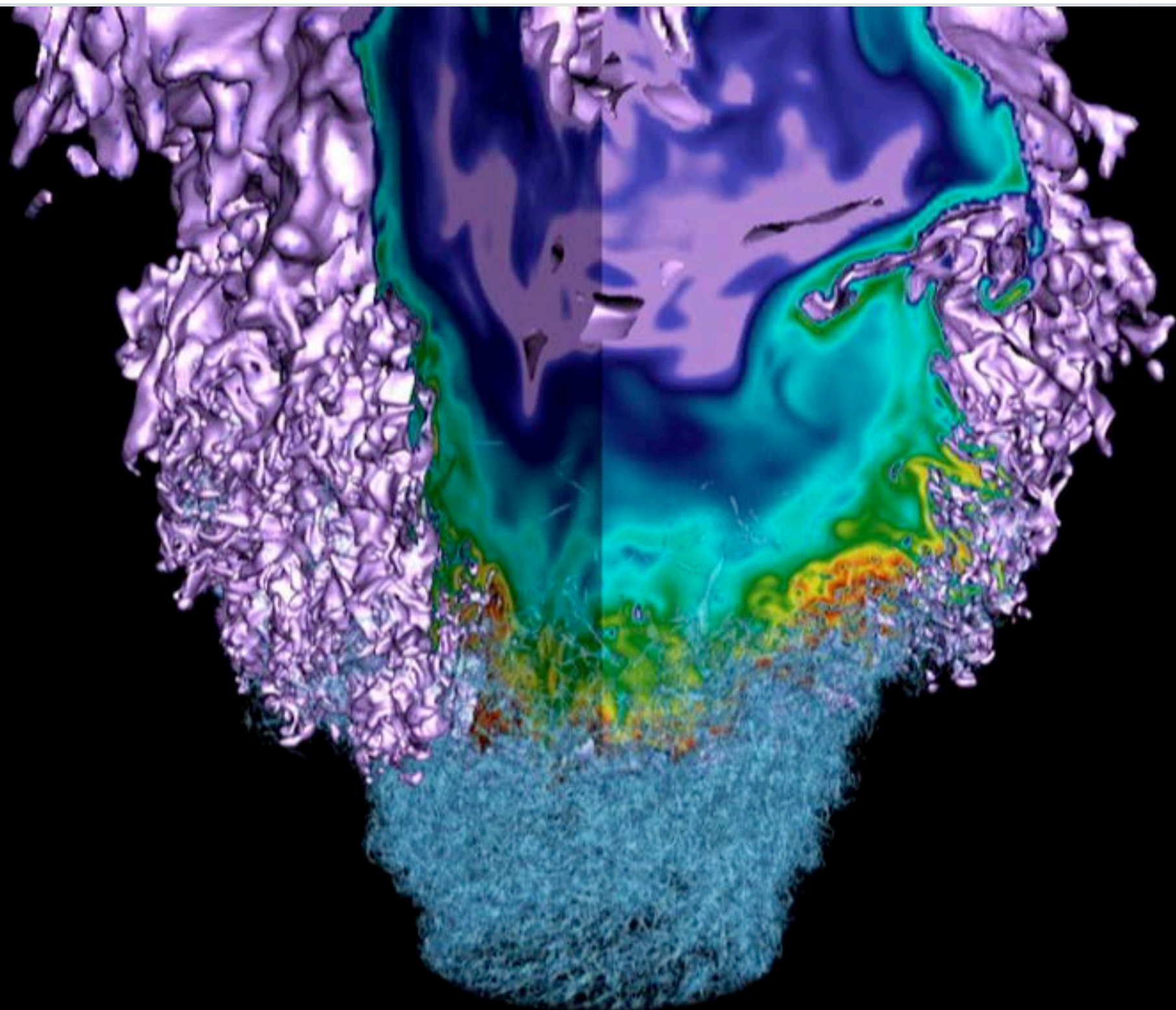


(photo courtesy R. K. Cheng, LBNL)

Calculations

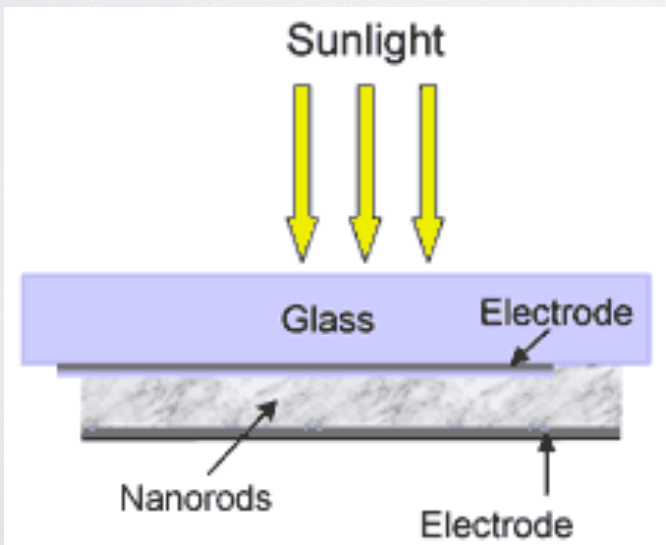
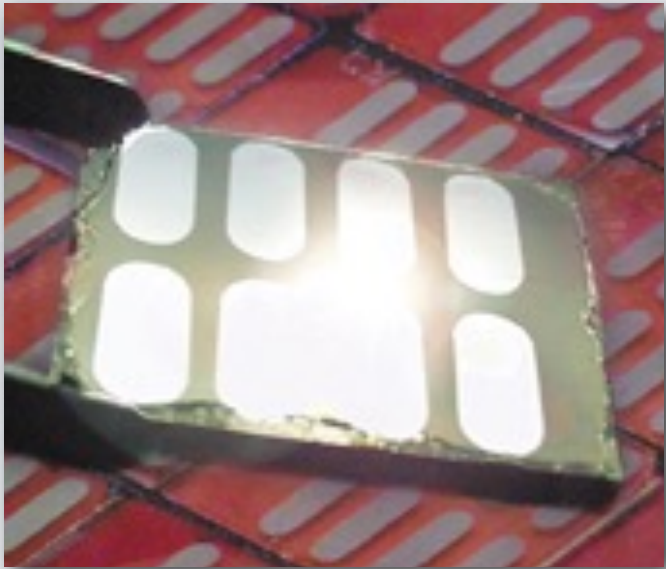


(J.B. Bell, CCSE, LBNL)



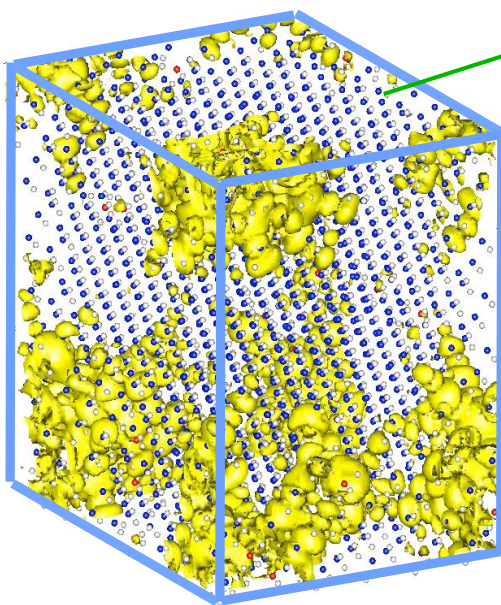
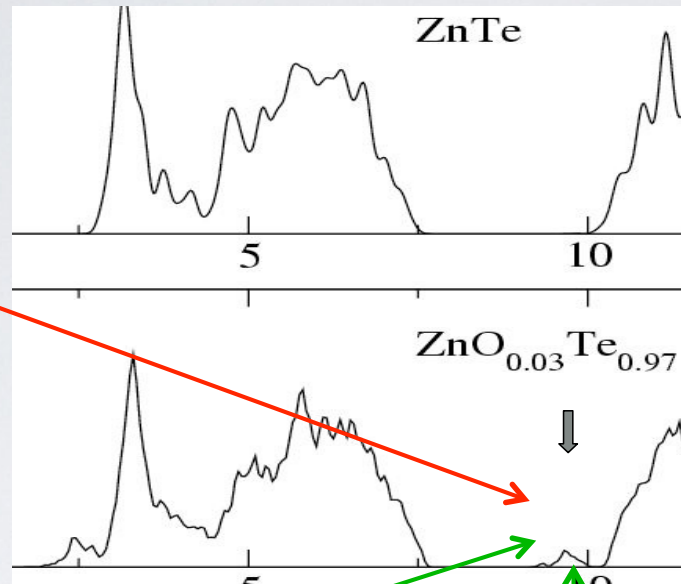
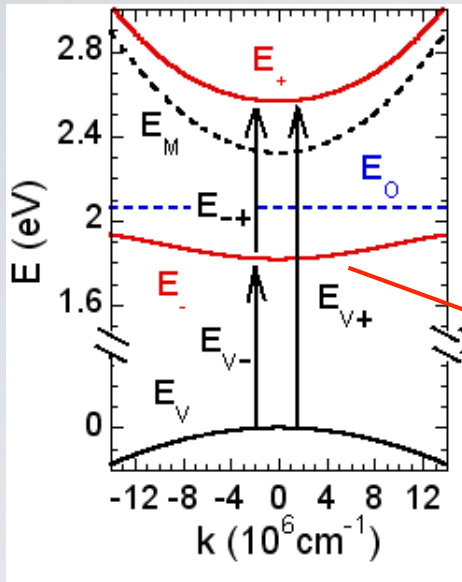
**WHAT CAN WE DO TO
CHANGE HOW WE USE
ENERGY IN THE FUTURE?**

PHOTOVOLTAIC SOLAR CELLS

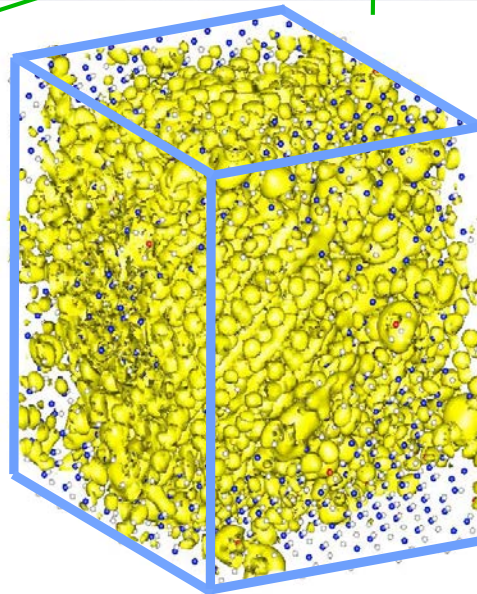


- Solar cells based on inorganic nanorods and semiconducting polymers
- Nanorods can be made of CdSe, a semiconducting material
- Nanorods act like wires, absorbing light and generating hole-electron pairs
- Biggest challenge is cost, ~30 cents/kWh

CAN ONE USE AN INTERMEDIATE STATE TO IMPROVE SOLAR CELL EFFICIENCY?



Highest O induced state

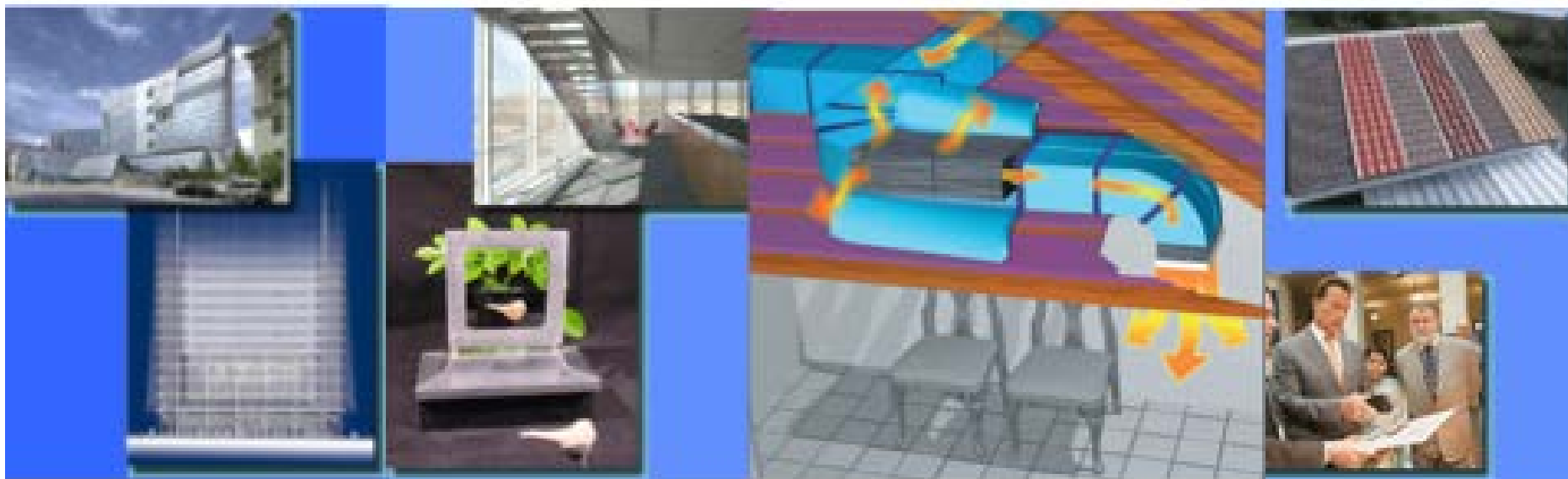


ZnTe bottom of cond. band state

- Single band material theoretical PV efficiency is 30%
- With an intermediate state, the PV efficiency could be 60%
- One proposed material ZnTe:O – Is there really a gap?
- LS3DF calculation for 3500 atom 3% O alloy [one hour on 17,000 cores of Franklin]
- Yes, there is a gap, and O induced states are very localized.

INCITE project, NERSC, NCCS.

Building Efficiency- Scale of the opportunity

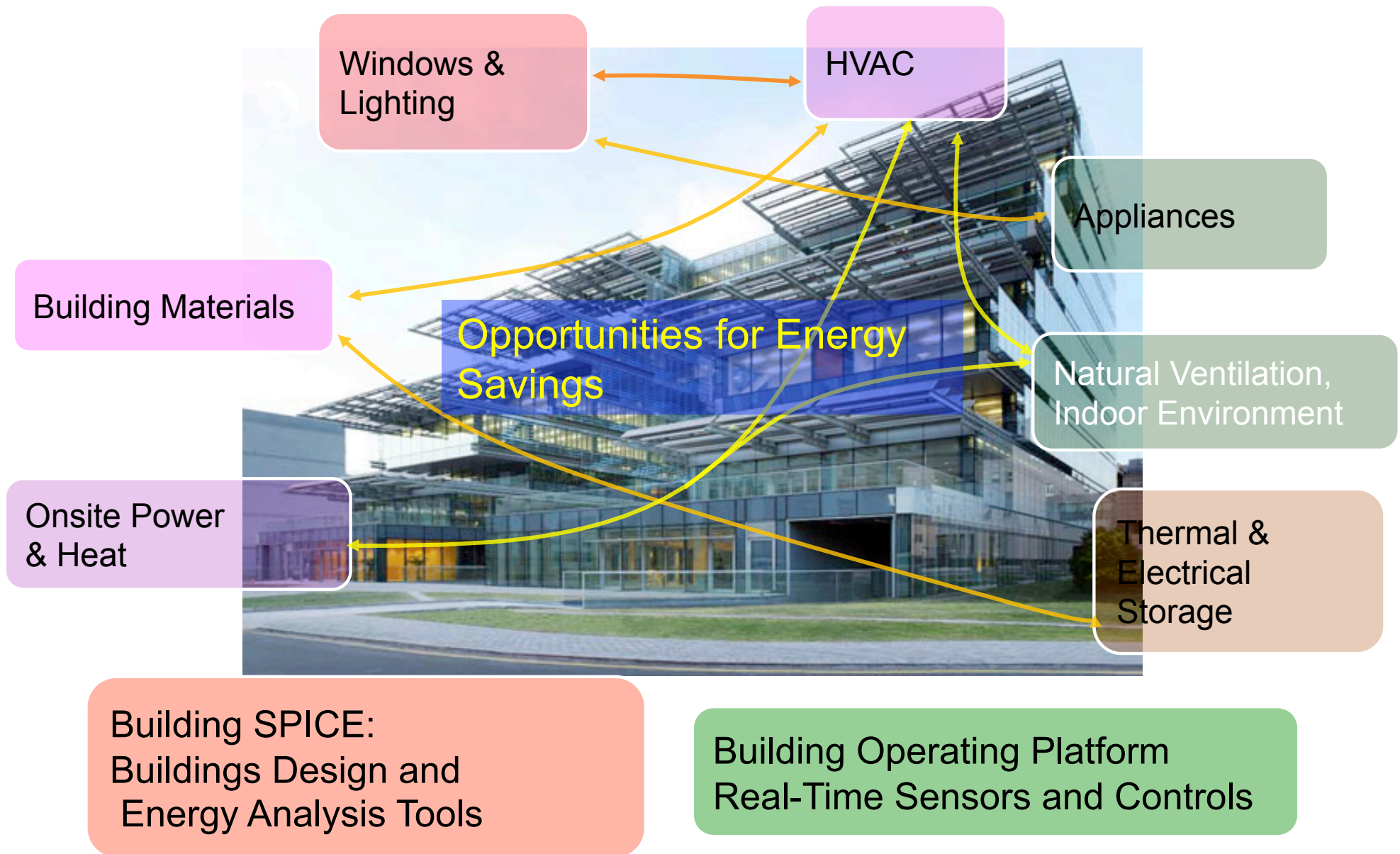


Buildings use 72% of nation's electricity and 55% of its natural gas.

Our team estimates that nearly 80% of that energy could be saved

Tremendous history and capability in this field at LBNL

Building Efficiency- science and engineering drivers

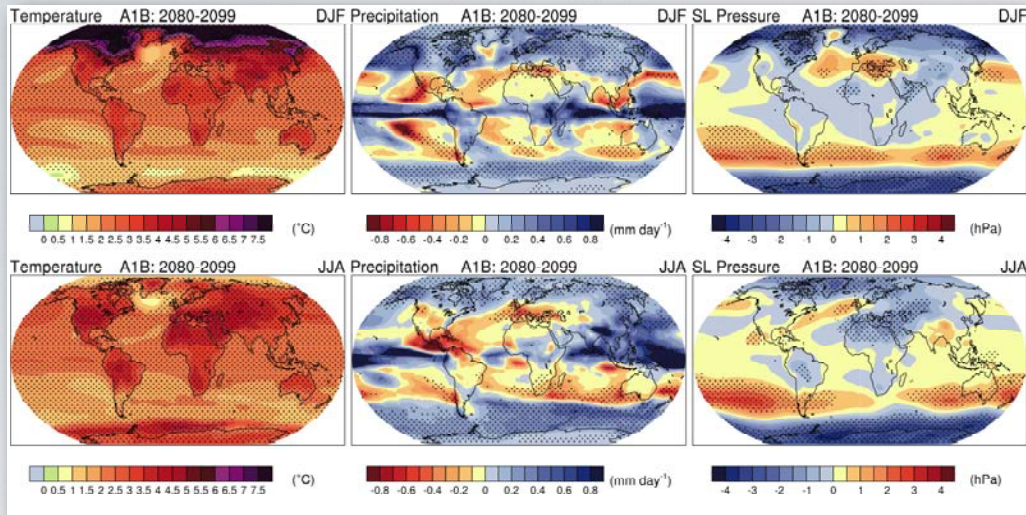


SUMMARY

- Climate change and energy will become increasingly important areas for study
- Modeling and simulation can be used to understand and predict climate change and energy alternatives
- Mathematics is the foundation for climate and energy models.

Many challenges remaining that will require new mathematical and computational advances

FUTURE WORK



- Predict future climate scenarios
- Develop more efficient, environmentally friendly combustion processes
- Investigate other sources of renewable energy



THANK YOU !



EXTRA SLIDES

DENSITY FUNCTIONAL THEORY AND THE KOHN-SHAM EQUATIONS

$$E_{total}[\{\psi_i\}] = \frac{1}{2} \sum_{i=1}^{n_e} \int_{\Omega} |\nabla \psi_i|^2 + \int_{\Omega} V_{ext} \rho + \frac{1}{2} \int_{\Omega} \frac{\rho(r) \rho(r')}{|r - r'|} dr dr' + E_{xc}(\rho),$$

$$\rho = \sum_{i=1}^{n_e} |\psi_i(r)|^2, \quad \int_{\Omega} \psi_i \psi_j = \delta_{i,j}$$

$$\left[-\frac{1}{2} \nabla^2 + V_{ext}(r) + \int \frac{\rho}{|r - r'|} + V_{xc}(\rho) \right] \psi_i = \epsilon_i \psi_i$$