

# Leveraging Renewable Energy in Data Centers: Present and Future

Ricardo Bianchini

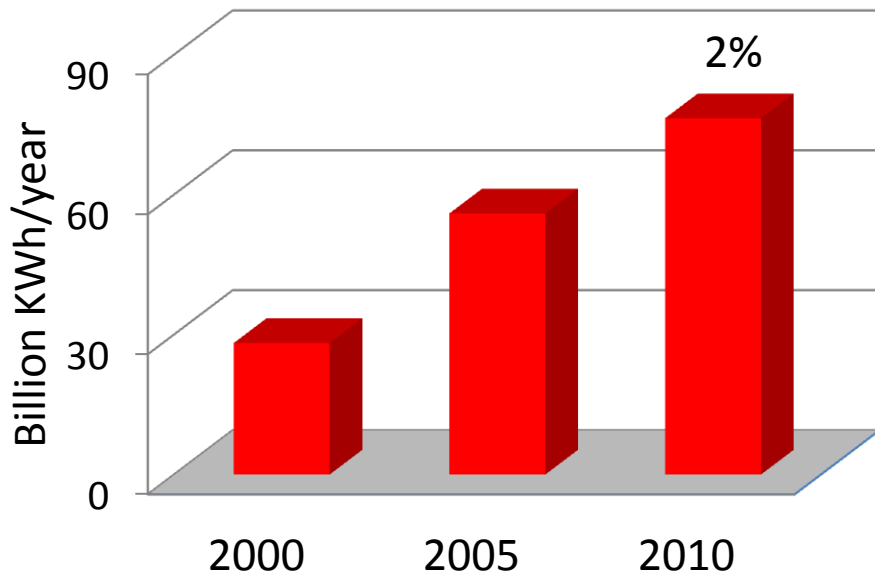
Department of Computer Science

Collaborators: Josep L. Berral, Inigo Goiri, Jordi Guitart, Md. Haque,  
William Katsak, Kien Le, Thu D. Nguyen, Jordi Torres

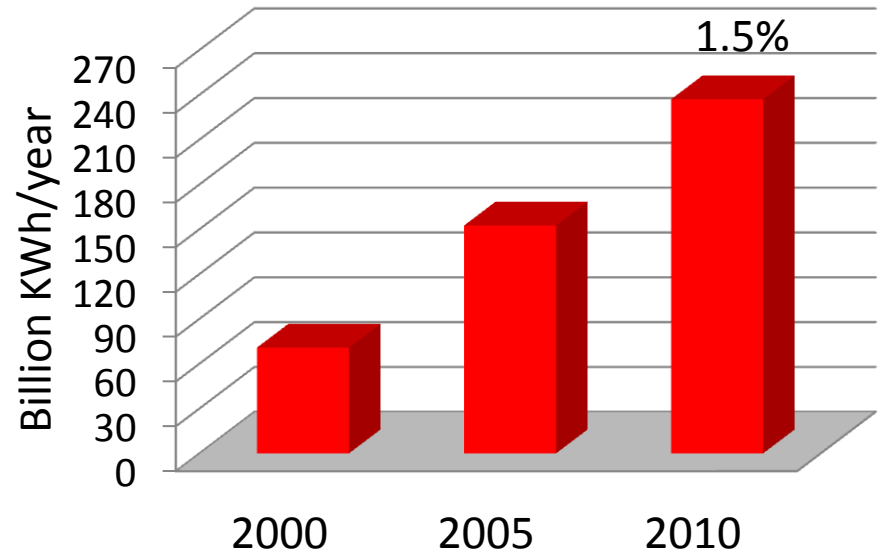
**RUTGERS**  
THE STATE UNIVERSITY  
OF NEW JERSEY

# Motivation

- Data centers = machine rooms to giant warehouses
- Consume massive amounts of energy (electricity)



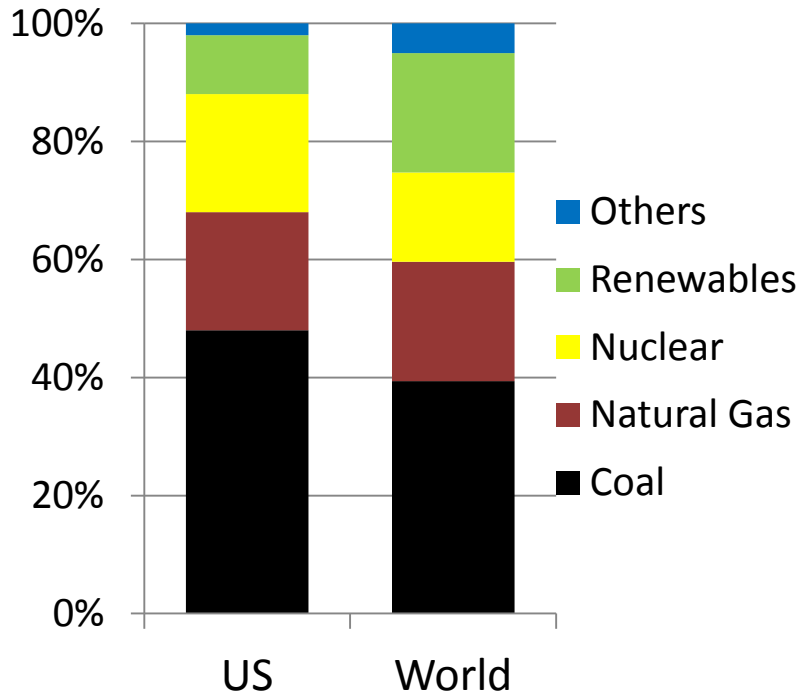
Electricity consumption of US DCs [JK'11]



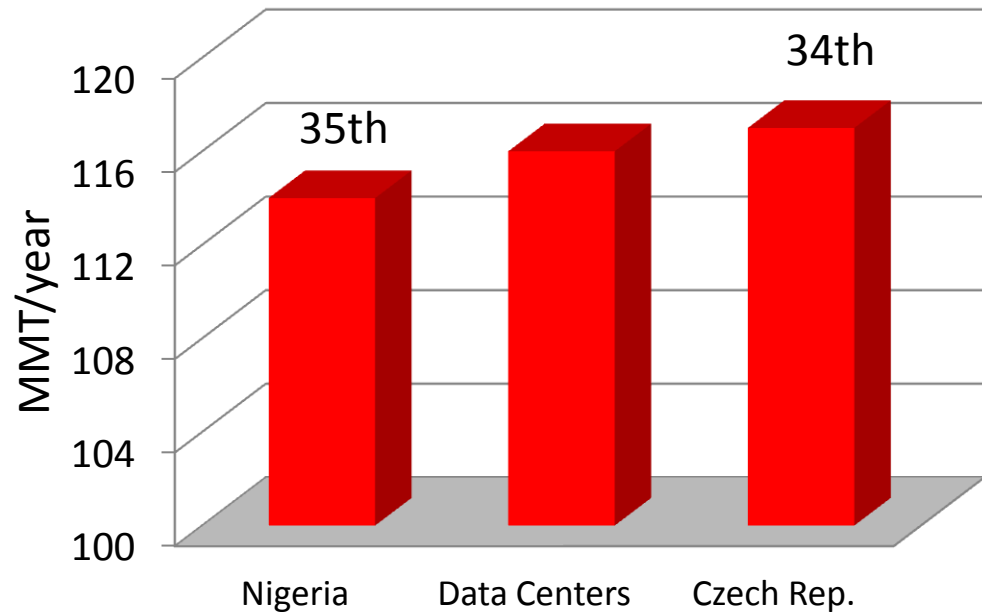
Electricity consumption of WW DCs [JK'11]

# Motivation

- Electricity comes mostly from burning fossil fuels



Electricity sources in US & WW [DOE'10]



CO<sub>2</sub> of world-wide DCs [Mankoff'08]

Can we use renewables to reduce this footprint?

# Outline

- DC energy usage and carbon footprint
- Reducing carbon with renewables: 2 approaches
- Our target and research challenges
- Software for leveraging solar energy
- Parasol: our solar micro-data center
- Current and future works
- Conclusions

# Greening DCs: Grid-centric approach

- Pump renewables into the grid
- Pros:
  - If the grid is available, power is available
  - DC operator need not worry about renewable plants
  - Plants can be placed at the best possible locations
- Cons:
  - Energy losses of ~15% [IEC'07]
  - Dependence on the power grid or diesel generators
- Example: Google buys wind power from NextEra

# Greening DCs: Co-location approaches

- (1) Build DC near a renewable plant or (2) self-generate
- Pros:
  - Reduced energy losses: ~5%
  - No dependence on the grid
  - Lower peak-power/energy costs, after amortization period (2)
- Cons:
  - Location may not be good for DC (1) or renewable plant (2)
  - Energy may have already been committed (1)
  - Need to install and maintain renewable plant (2)
- Examples: Microsoft built DC near hydro plant in OR (1)  
Apple is building 20MW solar array in NC (2)

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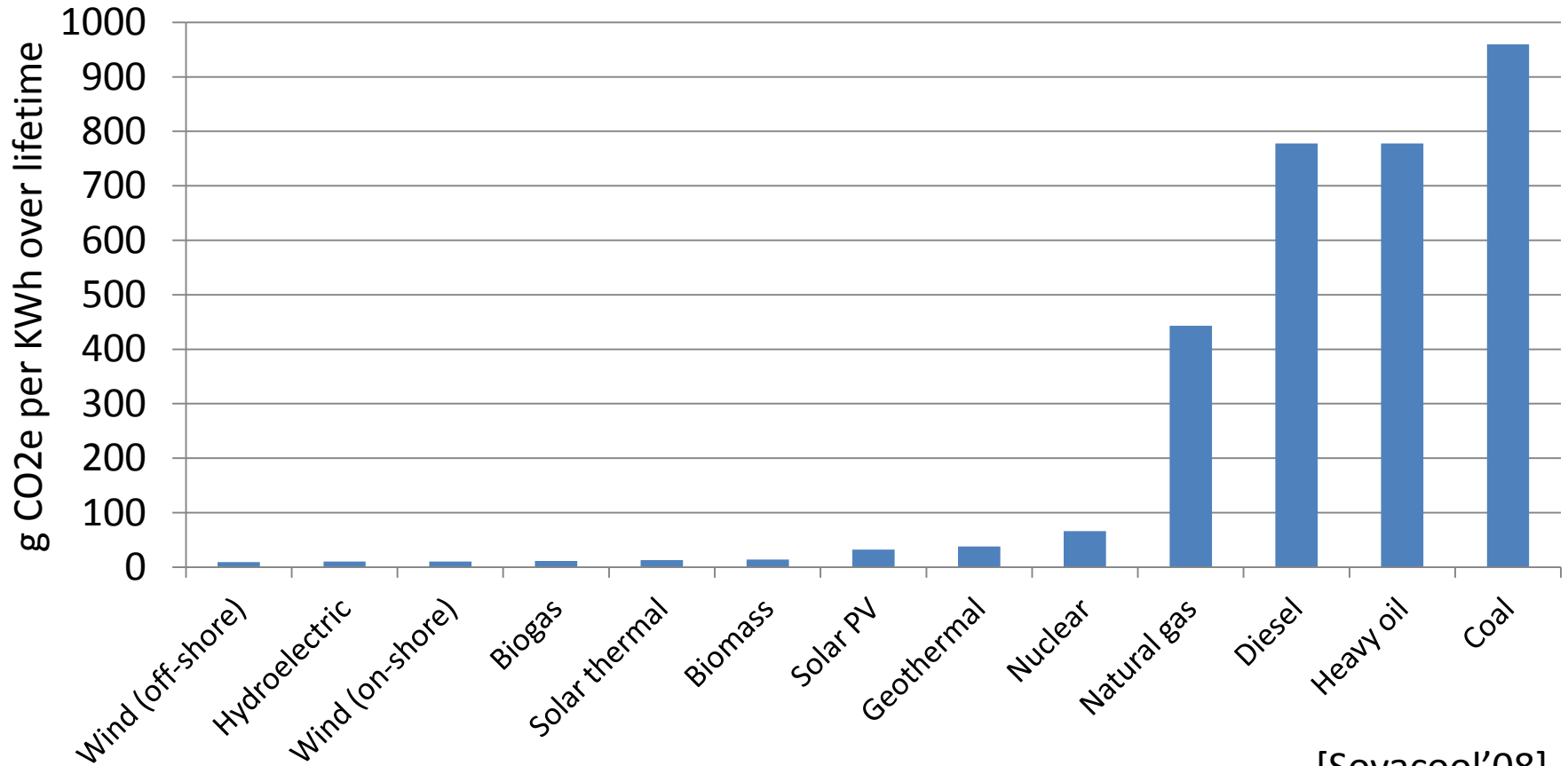
# Our target

- No approach is perfect
  - Different DC operators may take different approaches
- Co-location or self-generation with solar and/or wind
  - Pros: Clean and available
  - Cons: Space and cost



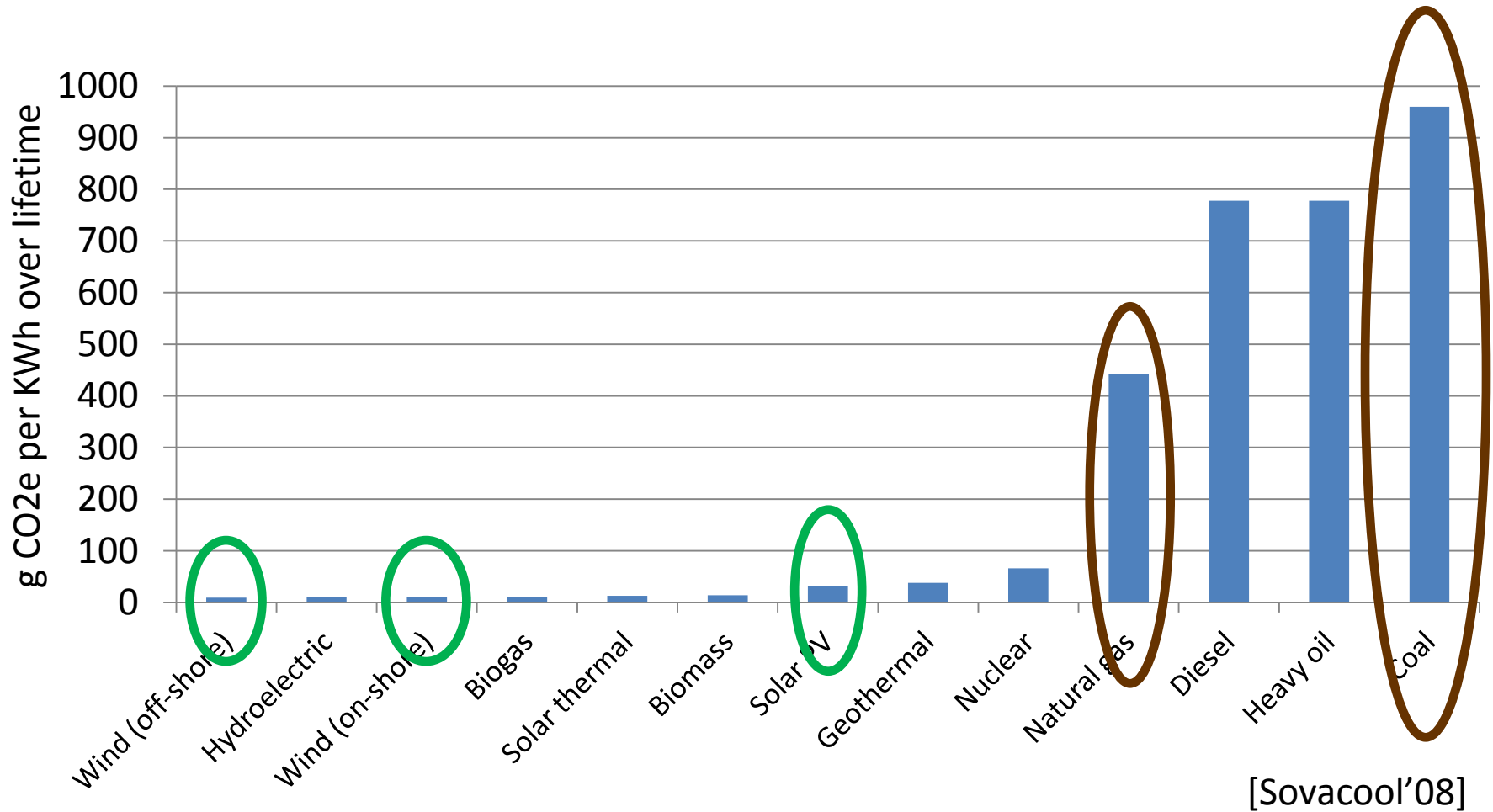


# Solar and wind are clean



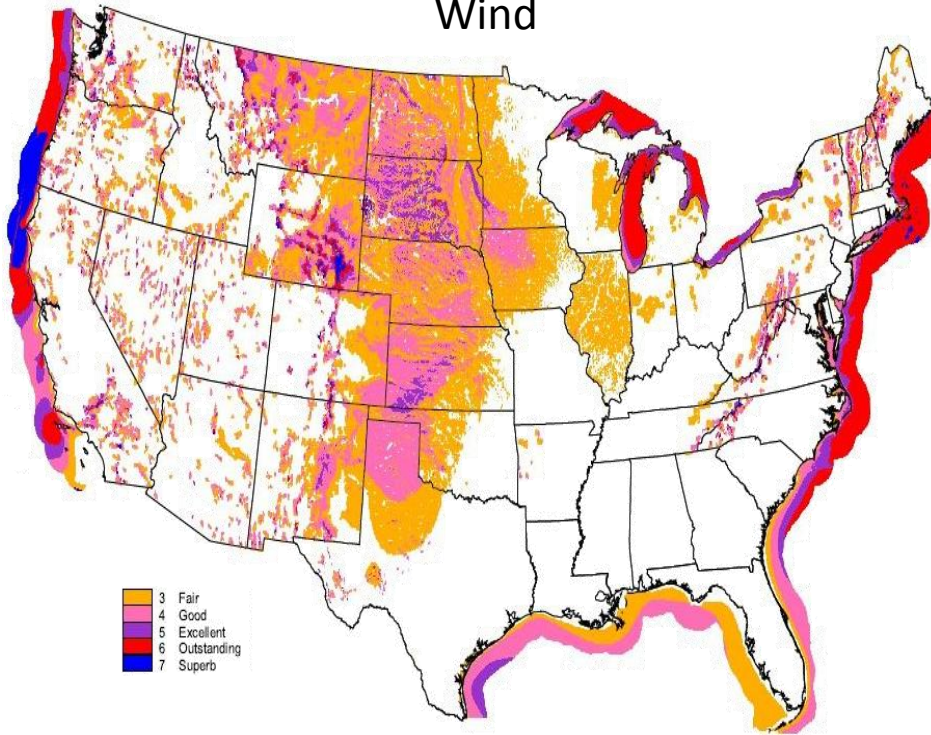
[Sovacool'08]

# Solar and wind are clean

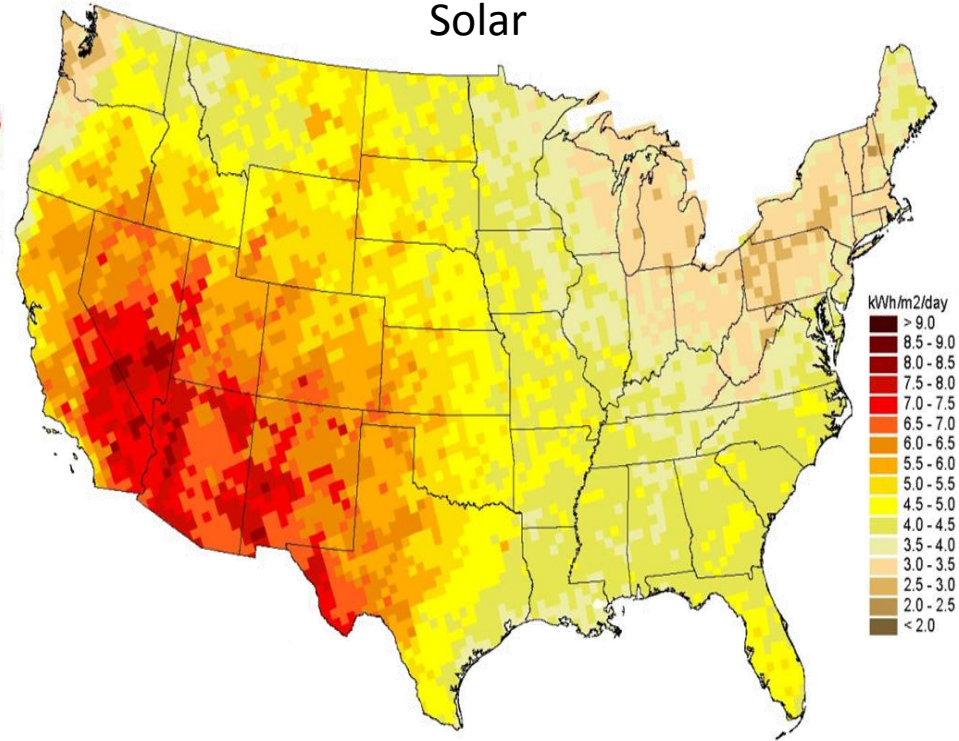


# Solar is more available in the US

Wind

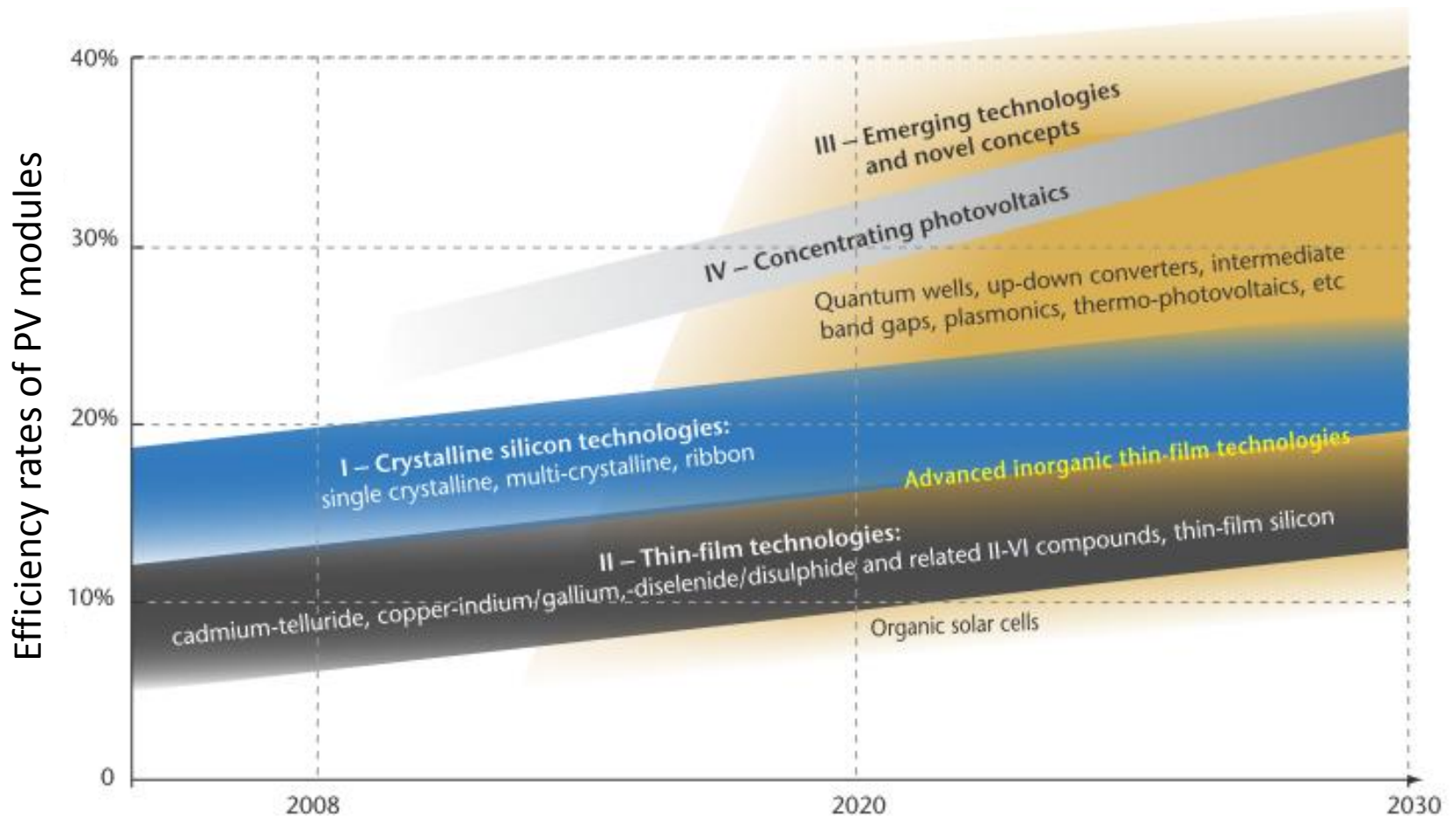


Solar



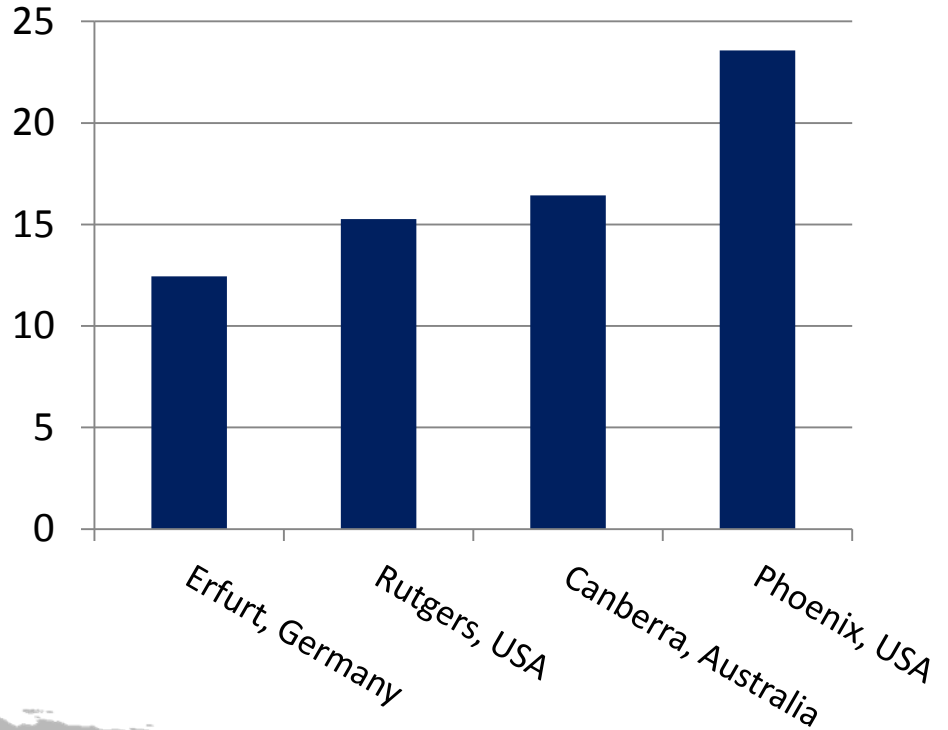
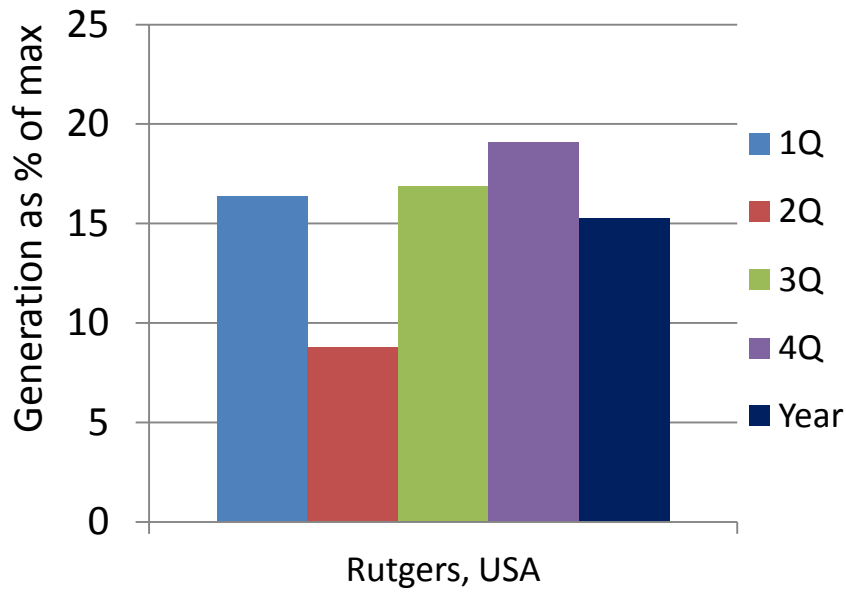
[NREL'12]

# Space: Solar PV efficiencies are increasing



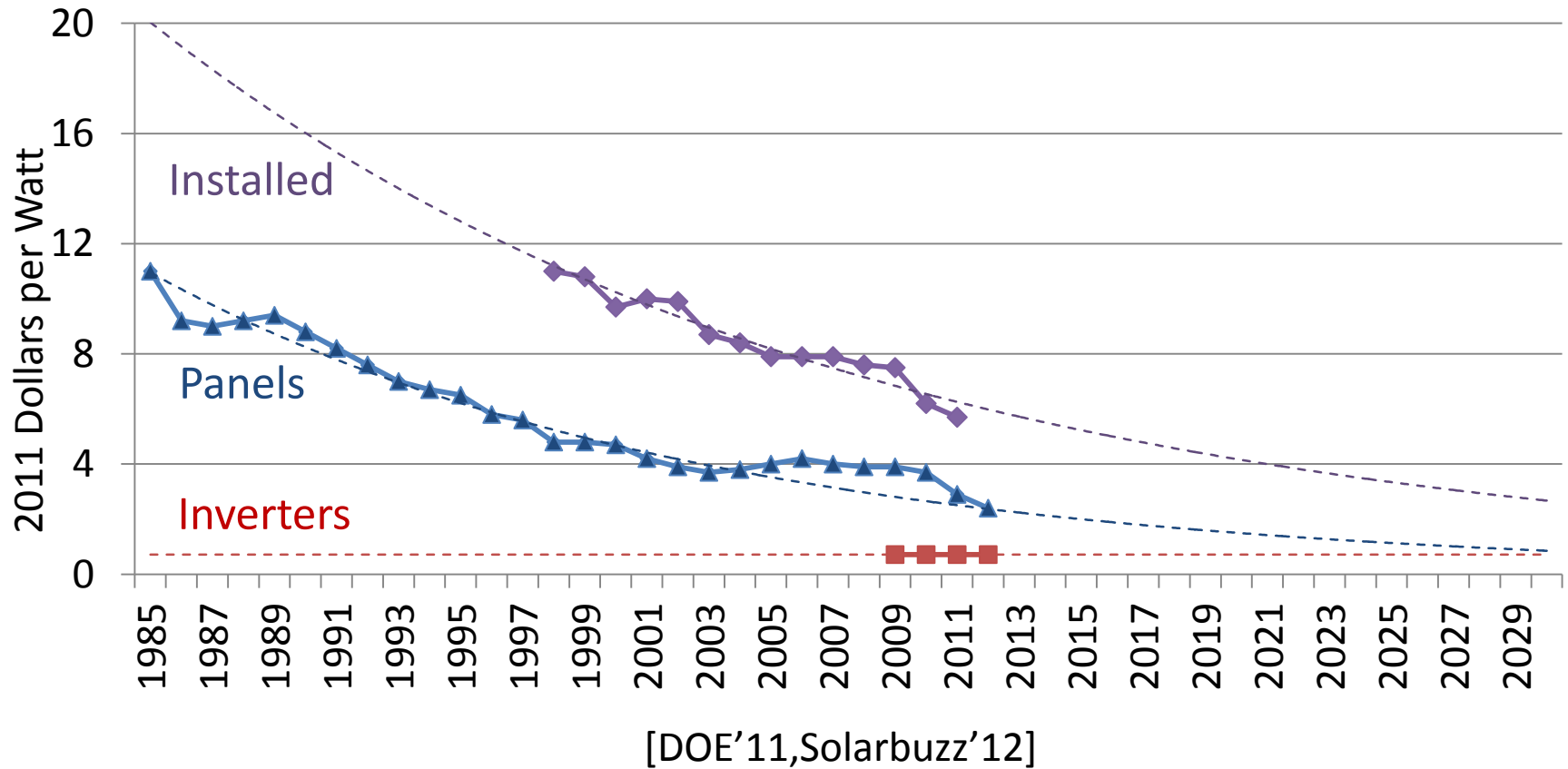
[IEA'10]

# Space: Solar PV capacity factors today



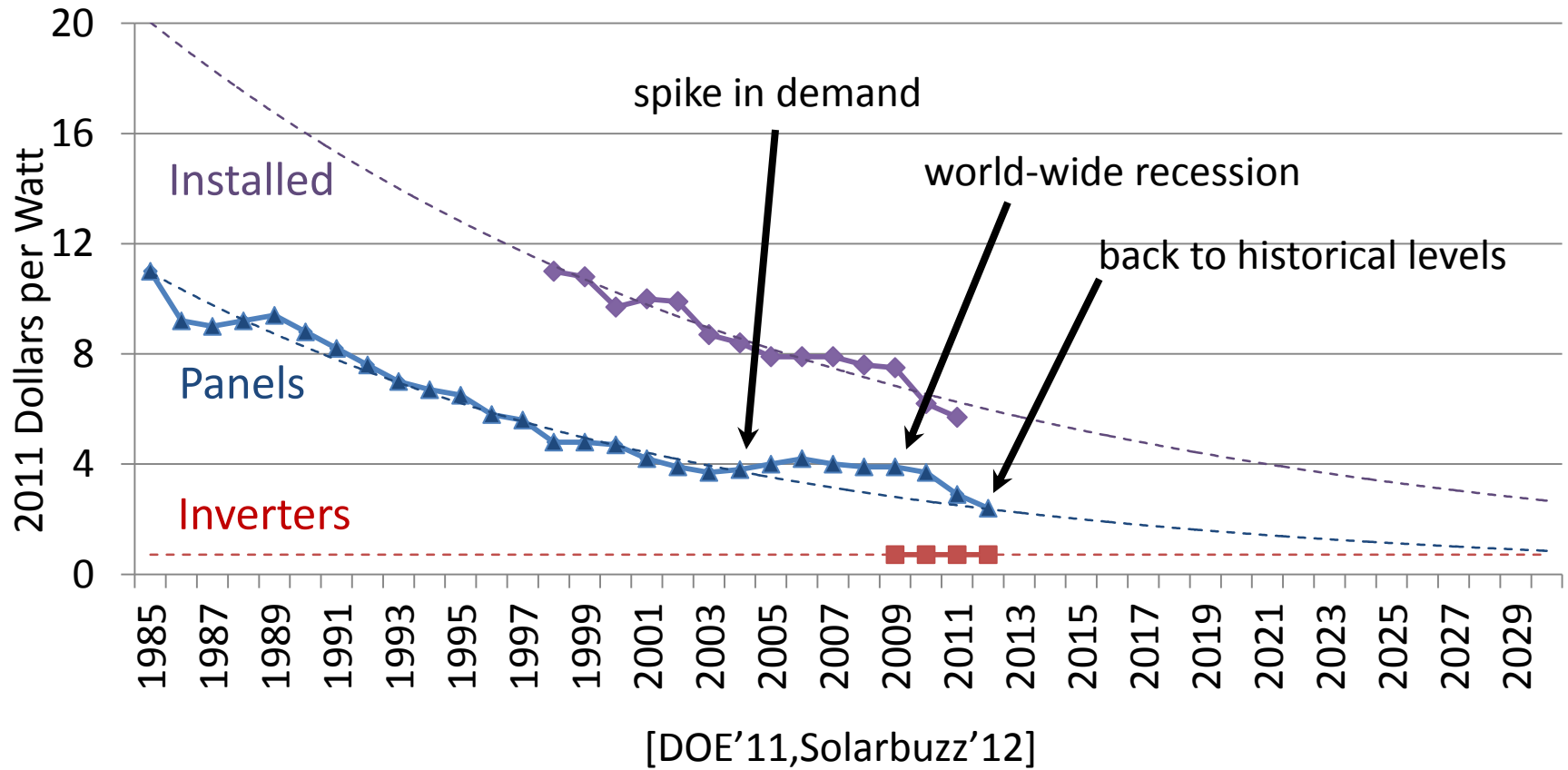
[PVOOutput'12]

# Cost of solar PV energy is decreasing

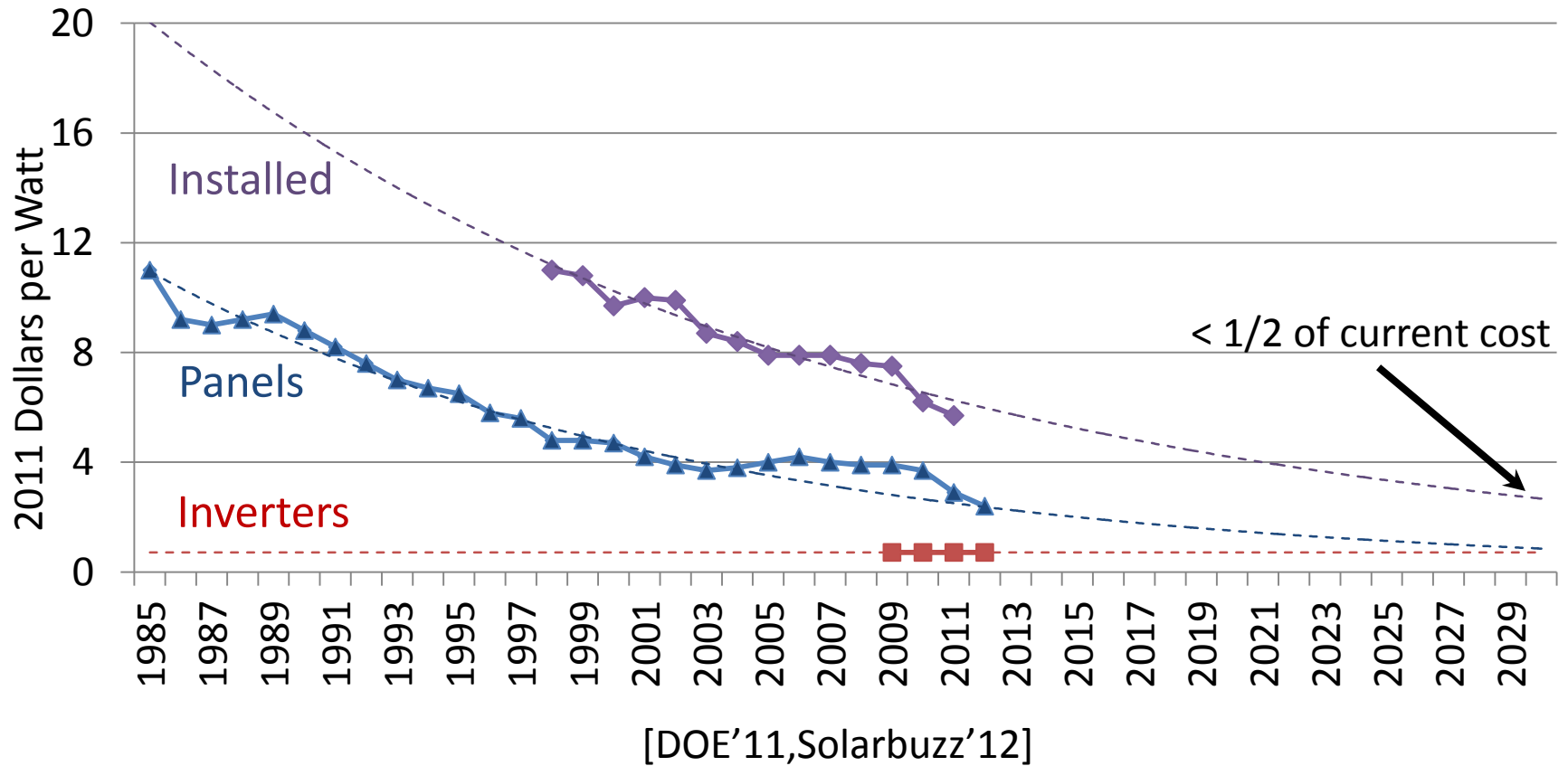


Grid electricity prices have been increasing: 30%+ since 1998 [EIA'12]

# Cost of solar PV energy is decreasing



# Cost of solar PV energy is decreasing



With incentives, the installed price can go down by another 50-60%



# Solar space and cost: Present and future

Space as a factor of rack area	Present	Future (2020-2030)
Density per rack		
8kW (200W 1U servers)	~47x	~24x
2kW (25W 0.5U servers)	~12x	~6x

Assuming 30% server utilization, 50% solar energy, NJ capacity factor, and 1 row of panels

Cost per Watt	Present	Future (2020-2030)
	~\$2.30	< \$1.20

Assuming self-generation and federal + NJ incentives

Time to amortize cost	Present	Future (2020-2030)
	~12 years	< 6 years

Assuming above costs, NJ capacity factor, and NJ grid energy prices

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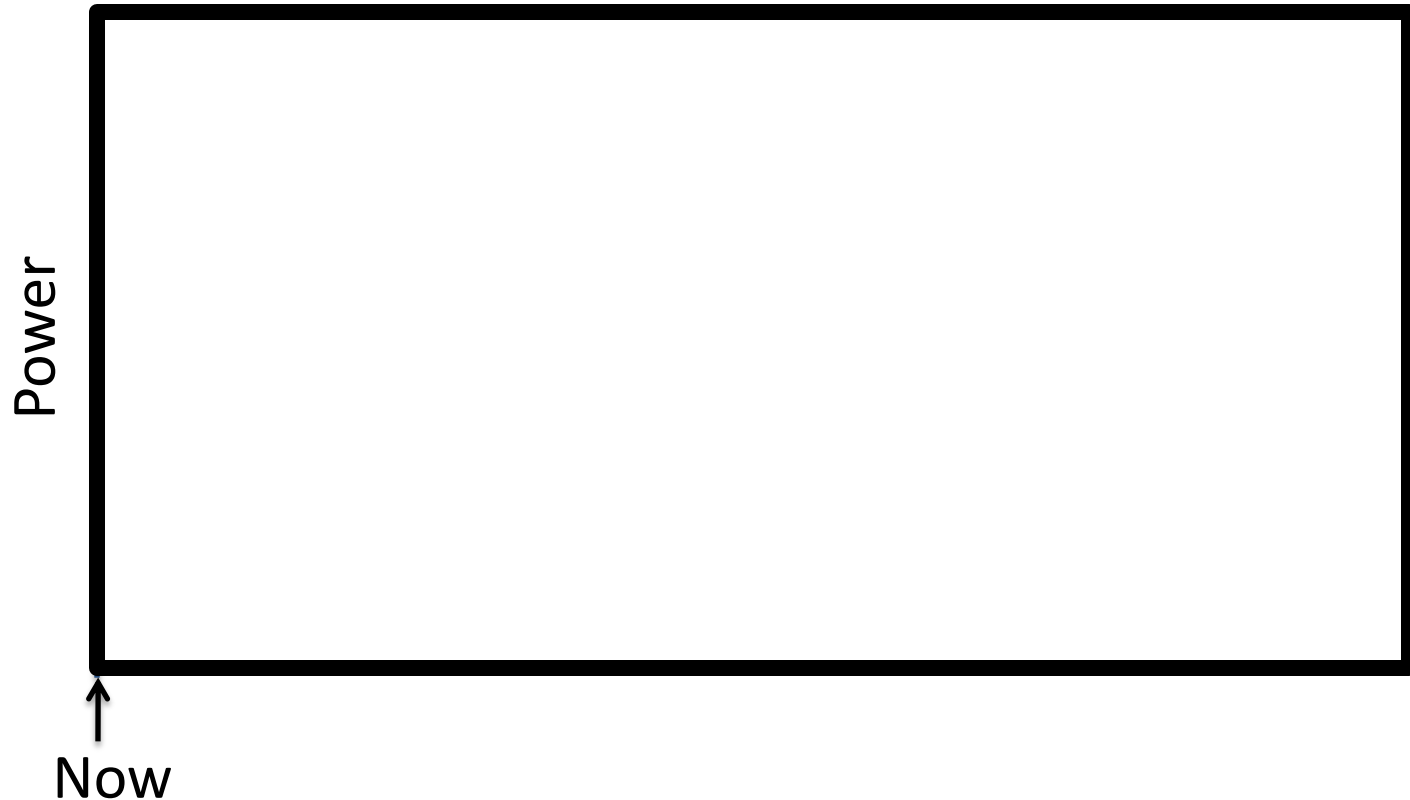
Assuming self-generation and federal + NJ incentives

Time to amortize cost	Present	Future (2020-2030)
	~12 years	< 6 years

Assuming above costs, NJ capacity factor, and NJ grid energy prices

Wind takes ~12x less space and is ~3x cheaper

# Main challenge: Supply of power is variable!



- Batteries and net metering are not ideal
- We need to match the energy demand to the supply

# Main challenge: Supply of power is variable!

- Many research questions:
  - What kinds of DC workloads are amenable?
  - What kinds of techniques can we apply?
  - Should we allow programmers to specify what can be done?
  - How well can we predict solar availability?
  - If batteries are available, how should we manage them?
  - Can we leverage geographical distribution?
- Building hardware & software to answer questions

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# Green DC software

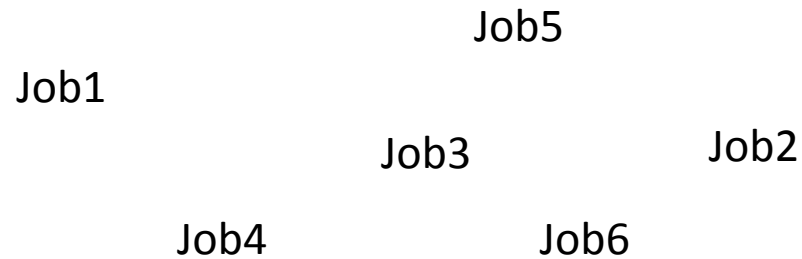
- Follow the renewables [HotPower'09, SIGMETRICS'11]
- Duty cycle modulation with sleep states [ASPLOS'11]
- Quality degradation for interactive loads [UCB-TR'12]
- Adapt the amount of batch processing [HotPower'11]
- Delay jobs while respecting deadlines
  - GreenSlot [SC'11], GreenHadoop [Eurosys'12]

# Overall “delay-until-green” approach

- Predict green energy availability
  - Weather forecasts
- Schedule jobs
  - Maximize green energy use
  - If green not available, consume **cheap** brown electricity
- **May delay jobs but must meet deadlines**
- Send idle servers to sleep to save energy
- Manage data availability if necessary

# GreenHadoop scheduling

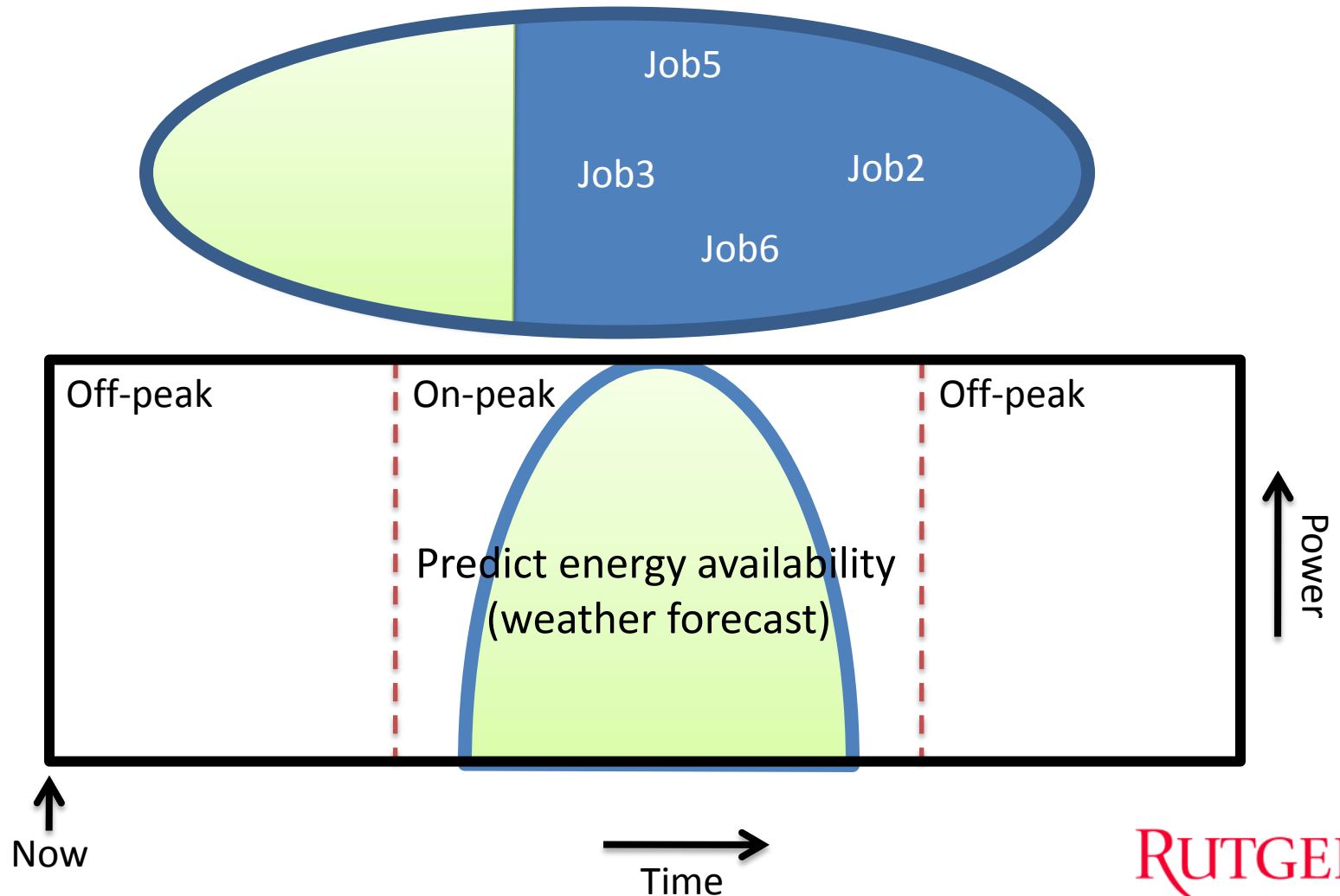
Estimate the energy required by jobs (EWMA)





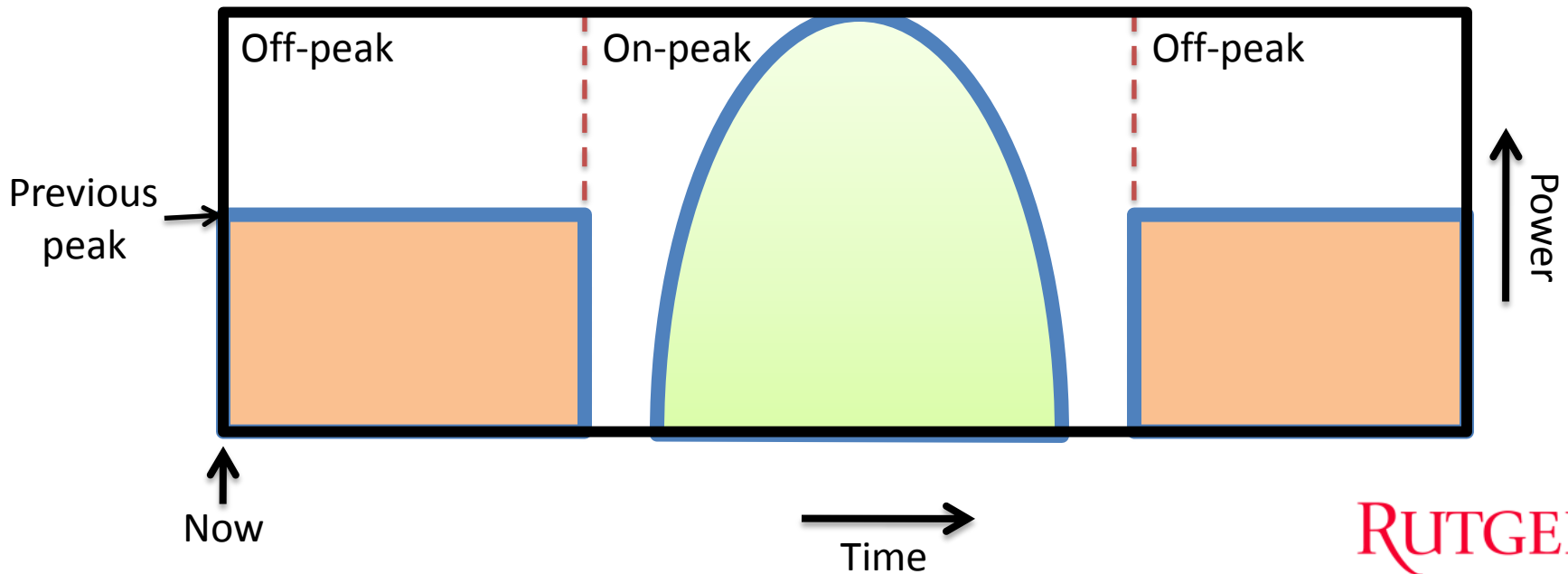
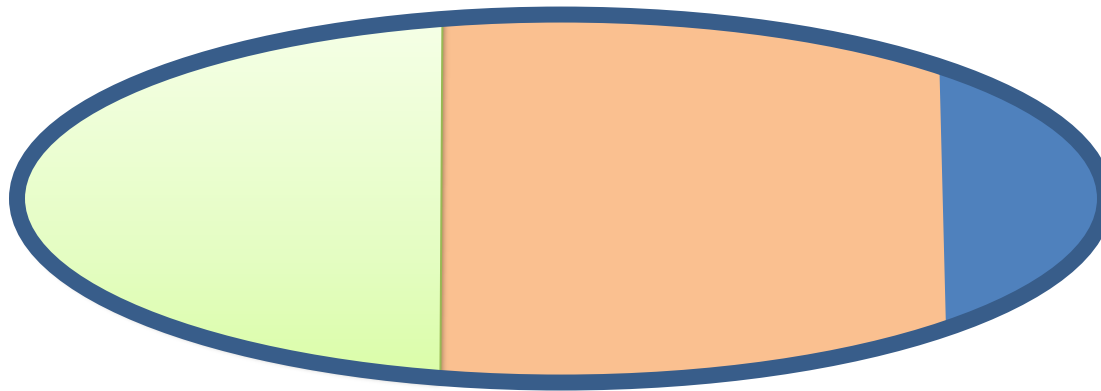
# GreenHadoop scheduling

Assign green energy first



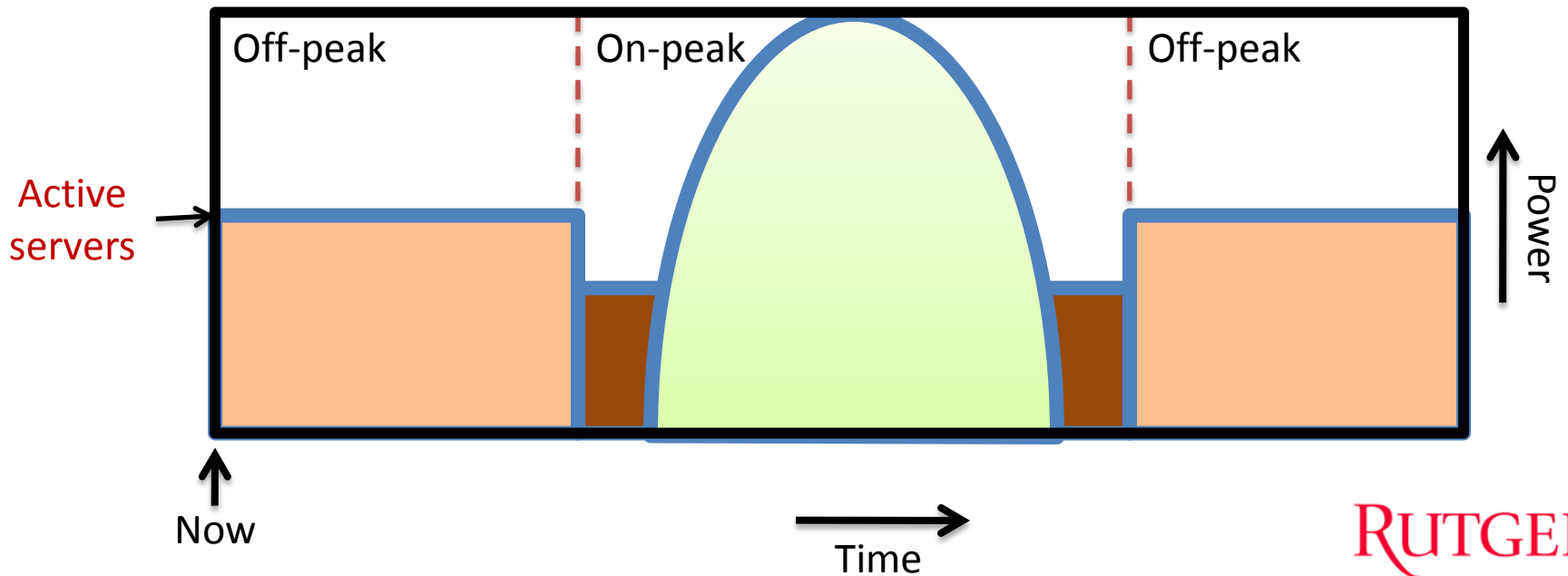
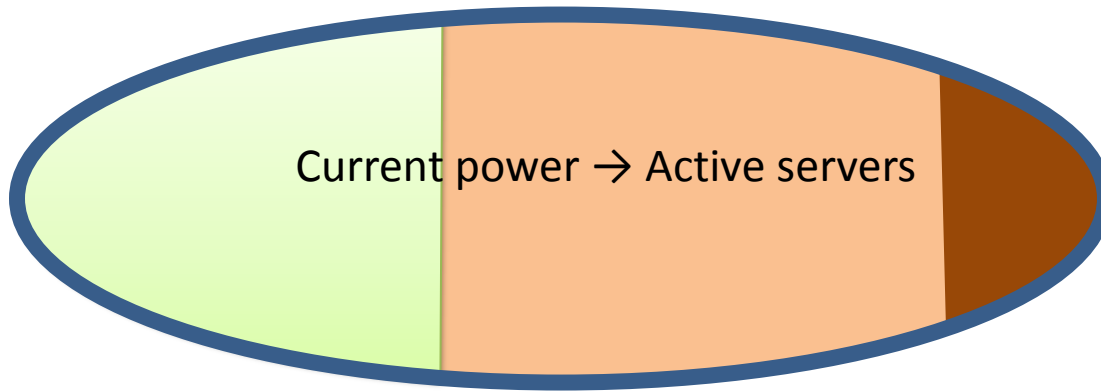
# GreenHadoop scheduling

Assign cheap brown energy



# GreenHadoop scheduling

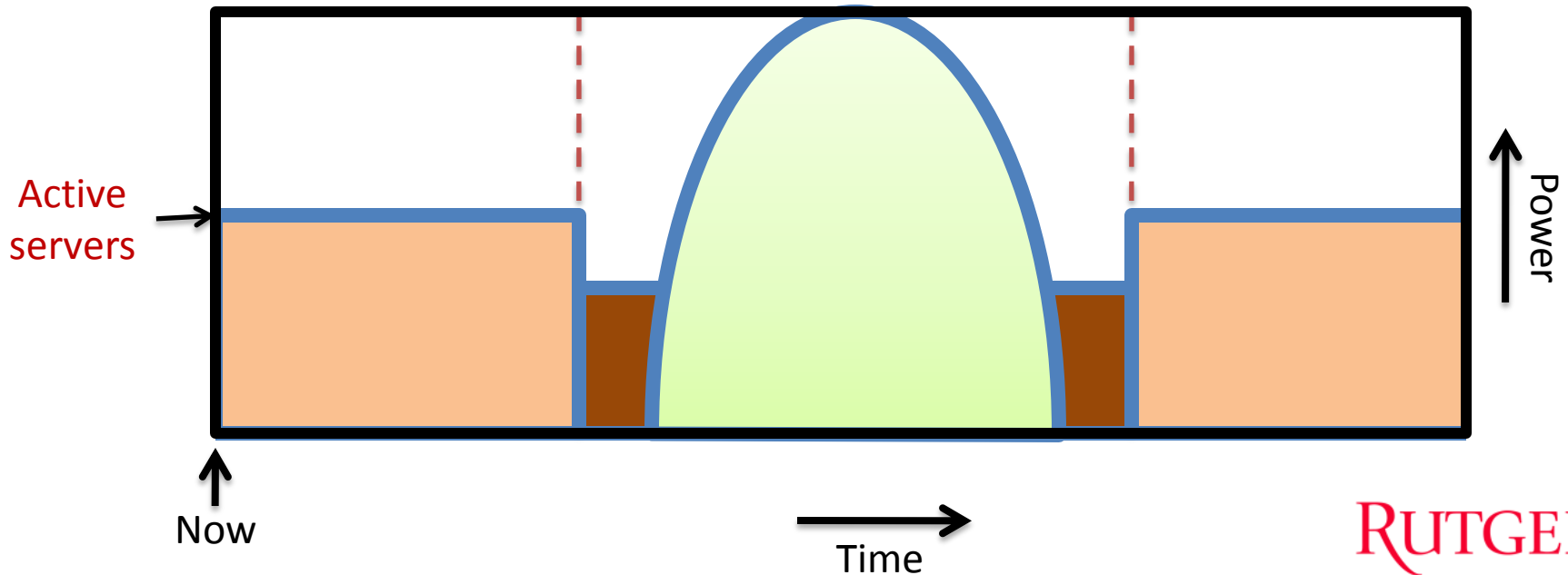
Assign expensive energy



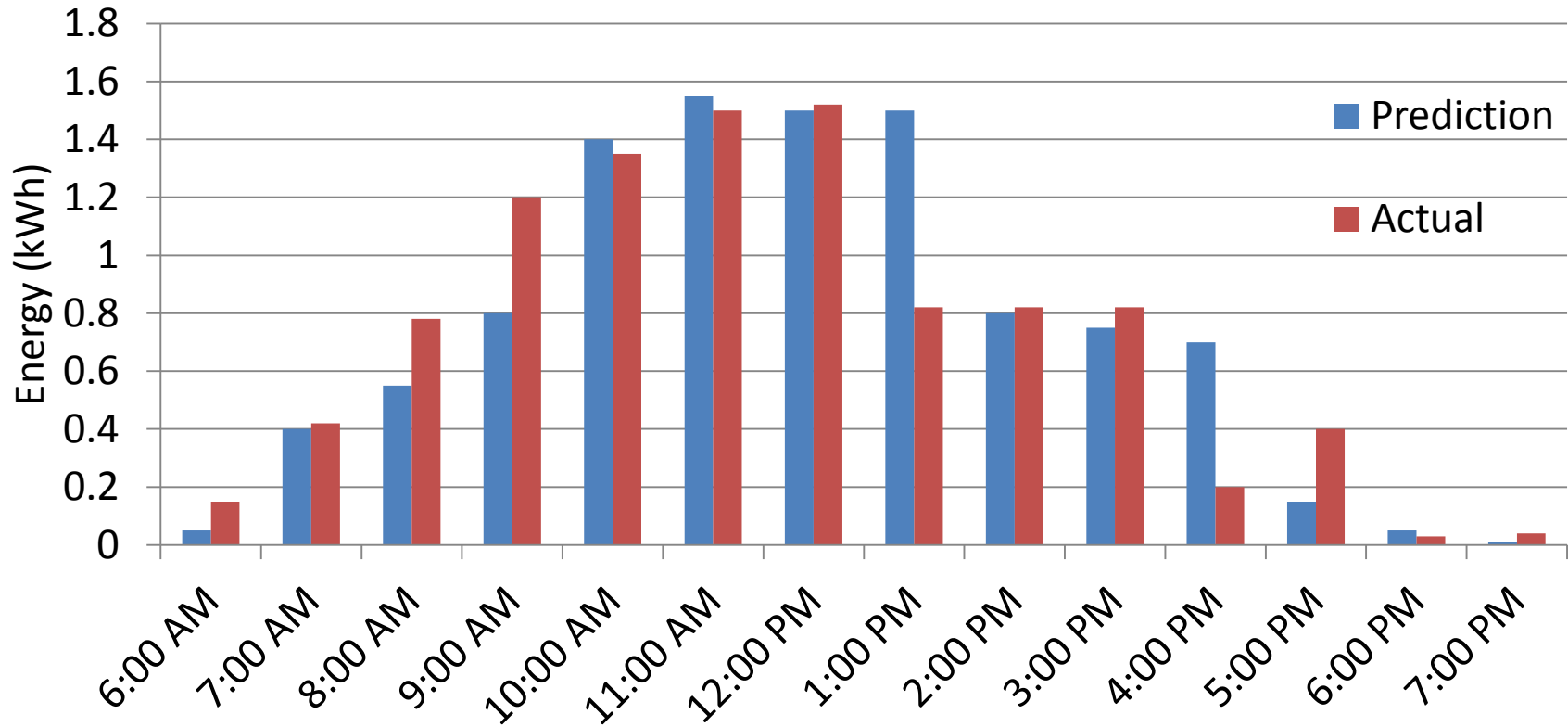
# GreenHadoop scheduling

As time goes by...

the number of active servers changes

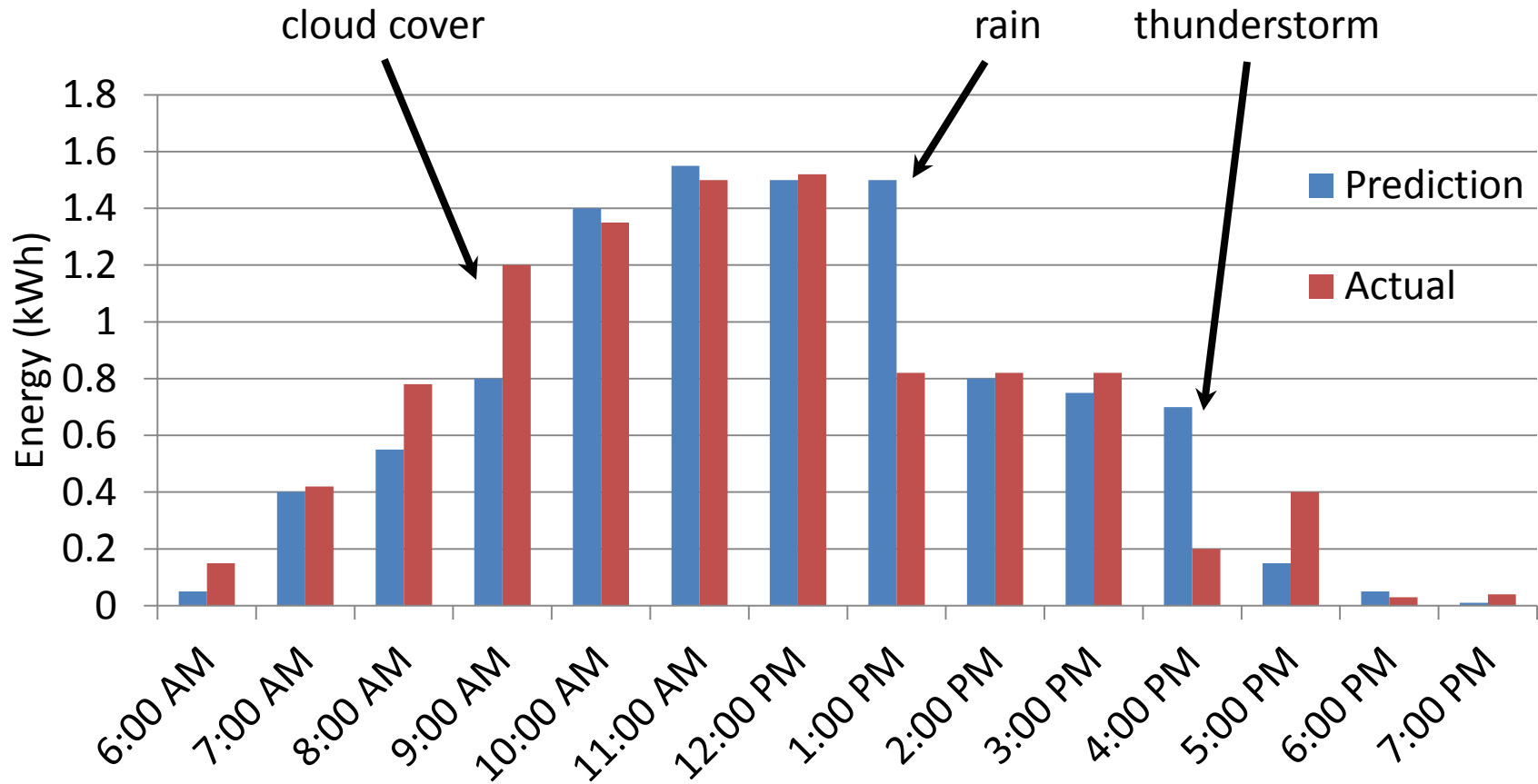


# Energy prediction vs actual



Actual data from the Rutgers solar farm (scaled down to our 16-node cluster)

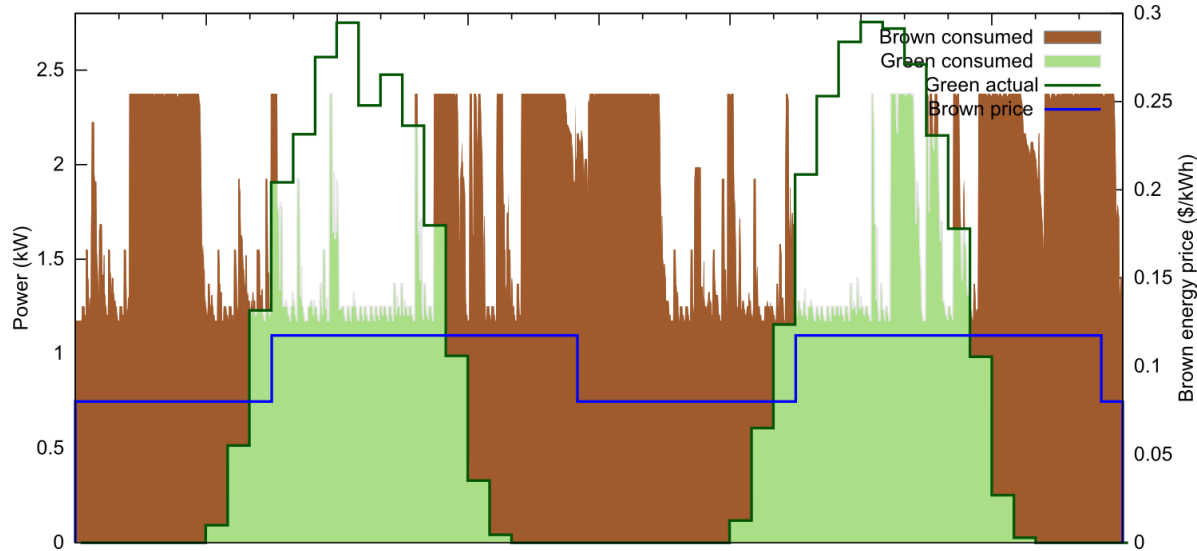
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# GreenHadoop for Facebook workload

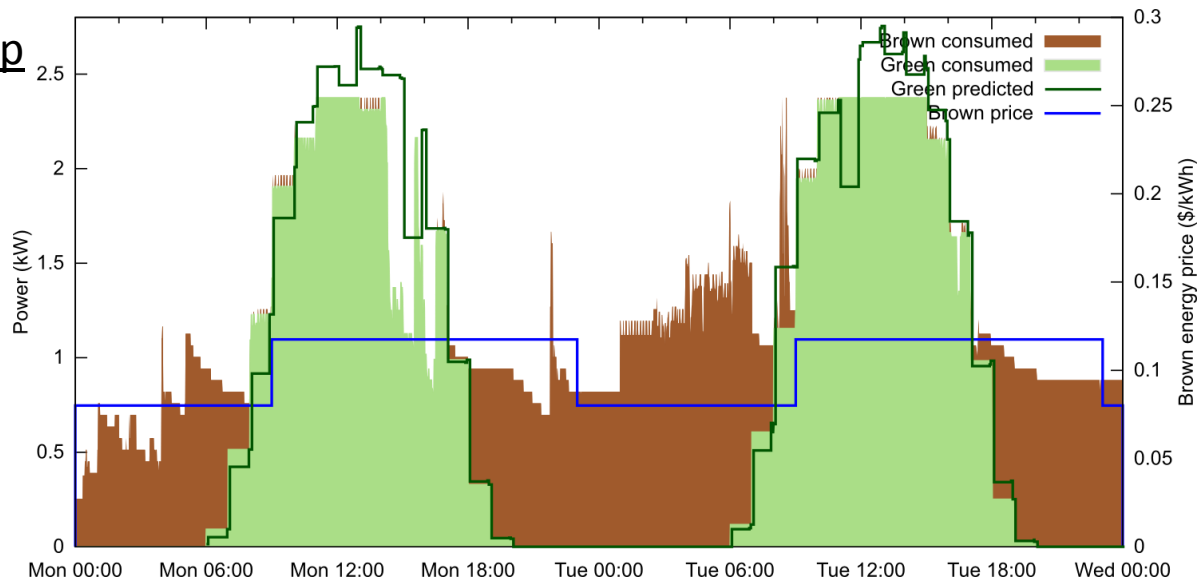
## Hadoop



- Brown consumed
- Green consumed
- Green produced
- Brown price

31% more green  
39% cost savings

## GHadoop



- Brown consumed
- Green consumed
- Green predicted
- Brown price

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# The Rutgers Parasol Project



# Parasol: Our hardware prototype



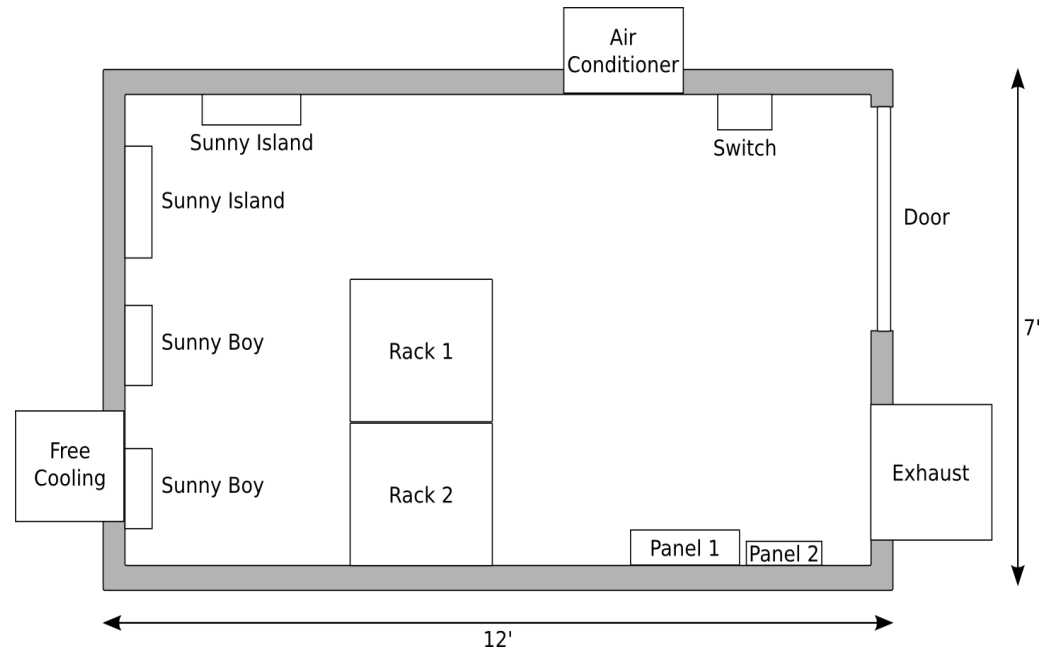
- Unique research platform
  - Solar-powered computing
  - Remote DC deployments
  - Software to exploit renewables within and across DCs
  - Tradeoff between renewables, batteries, and grid energy
  - Free cooling, wimpy servers, solid-state drives
  - Full monitoring: resources, power, temperature, air

# Parasol details

- Installed on the roof
- Steel structure
  - Container to host the IT
  - 16 solar panels: 3.2 kW peak
- Backup power
  - Batteries: 32 kWh
  - Power grid
- IT equipment
  - 2 racks
  - 64 Atom servers (so far): 1.7 kW
  - 2 switches and 3 PDUs
- Cooling
  - Free cooling: 110 W or 400 W
  - Air conditioning: 2 kW
  - Heating: 3 kW



# Outside and inside Parasol



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# Current and future works

- DC placement with probabilistic guarantees
- GreenNebula
- Smart management of energy sources
- Green SLAs
- Tradeoff between performance and green energy use
- Collect and make sense of the monitoring data

# Conclusions

- Reduce the carbon footprint of ICT, data centers
- Topic is interesting and has societal impact
- Lots left to do...

More info -- <http://parasol.cs.rutgers.edu>