



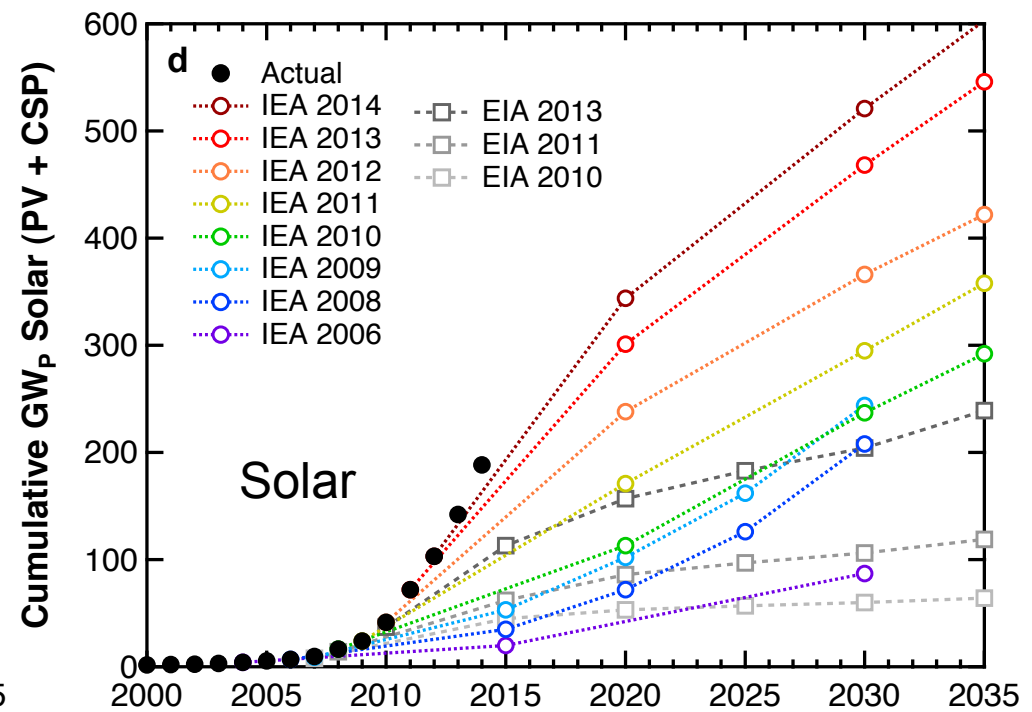
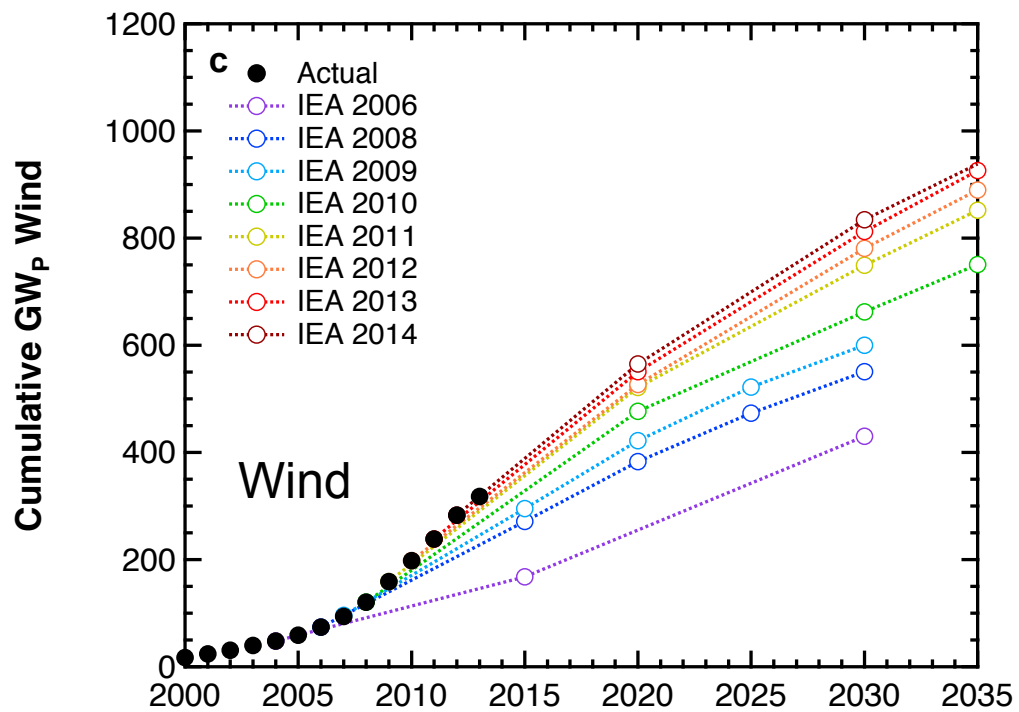
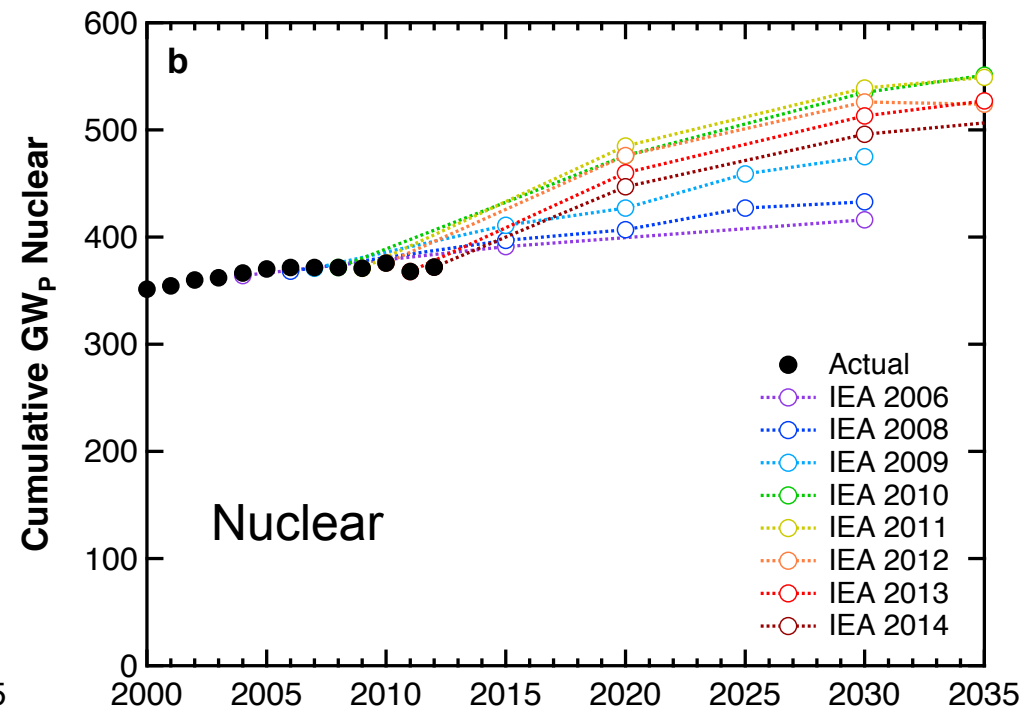
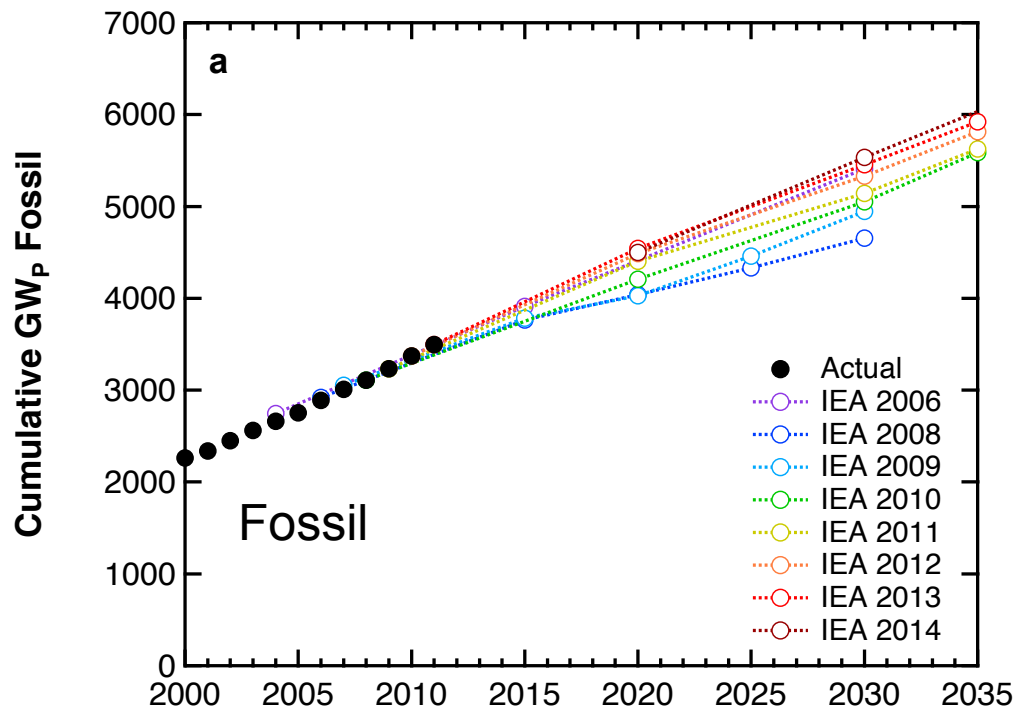
MIT INSTITUTE FOR DATA,  
SYSTEMS, AND SOCIETY

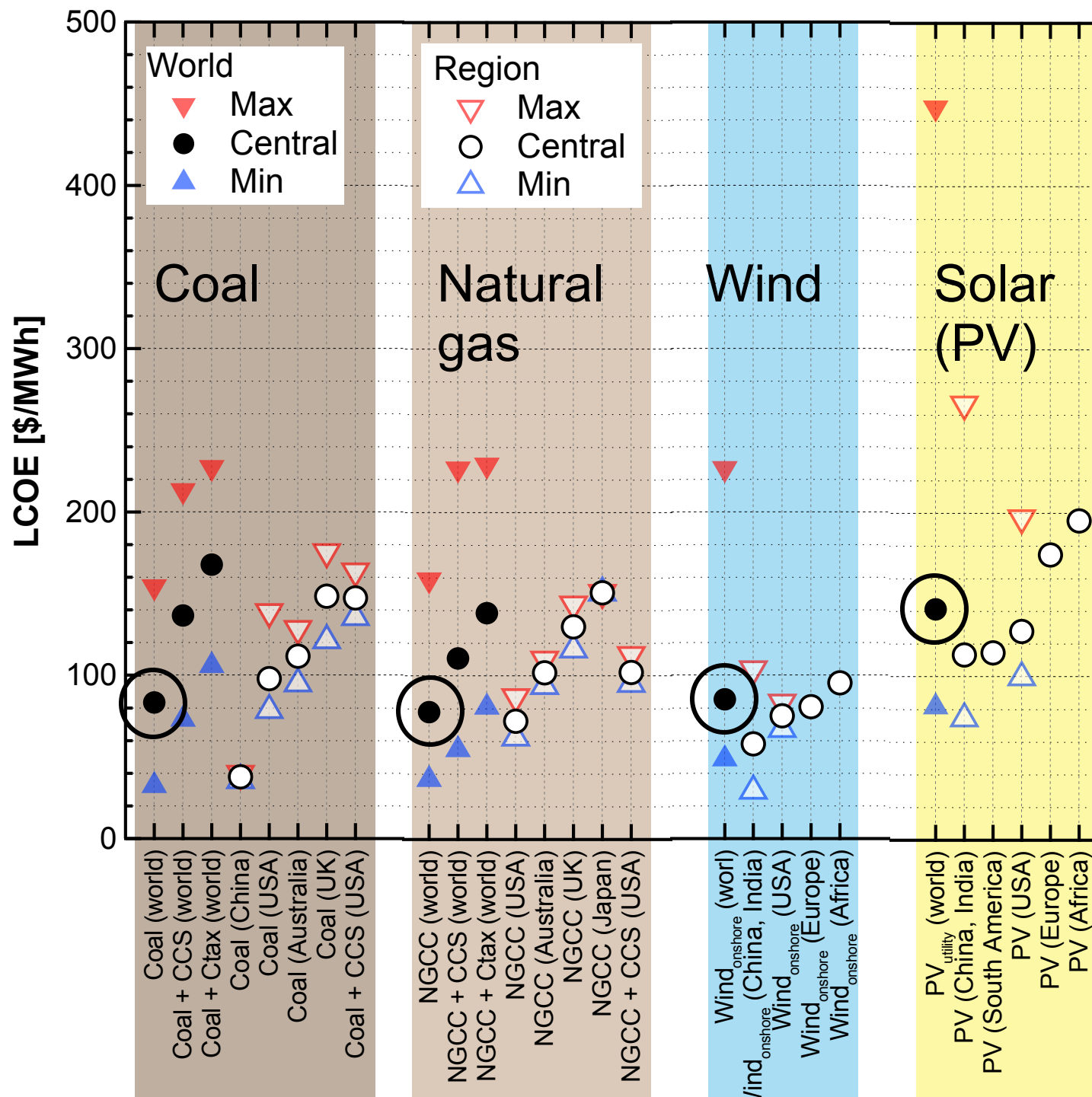
# Evaluating storage technologies for solar and wind energy

---

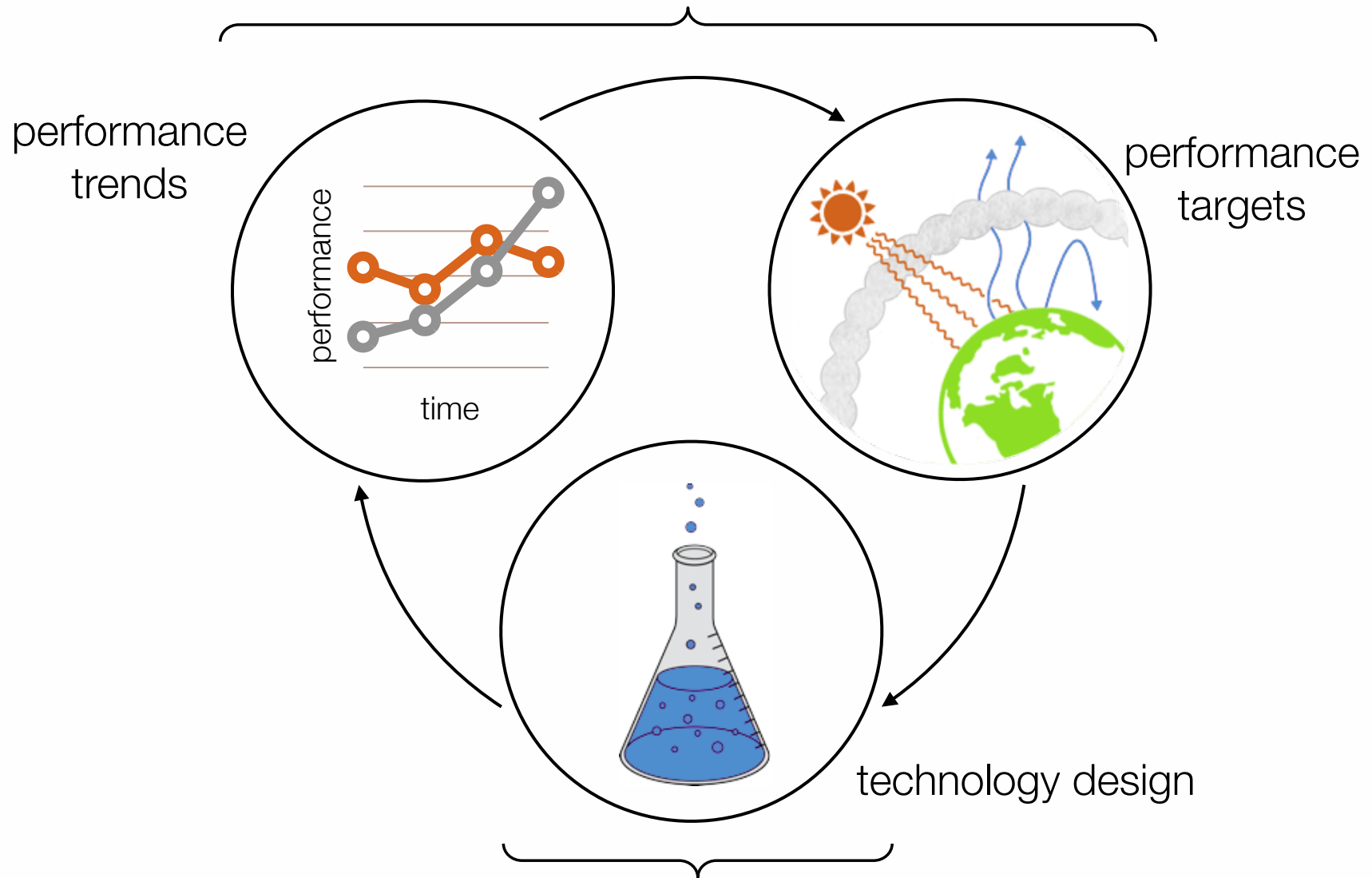
Jessika E. Trancik  
MIT Institute for Data, Systems, and Society

March 5, 2017  
Andlinger Center Highlight Seminar Series  
Princeton University



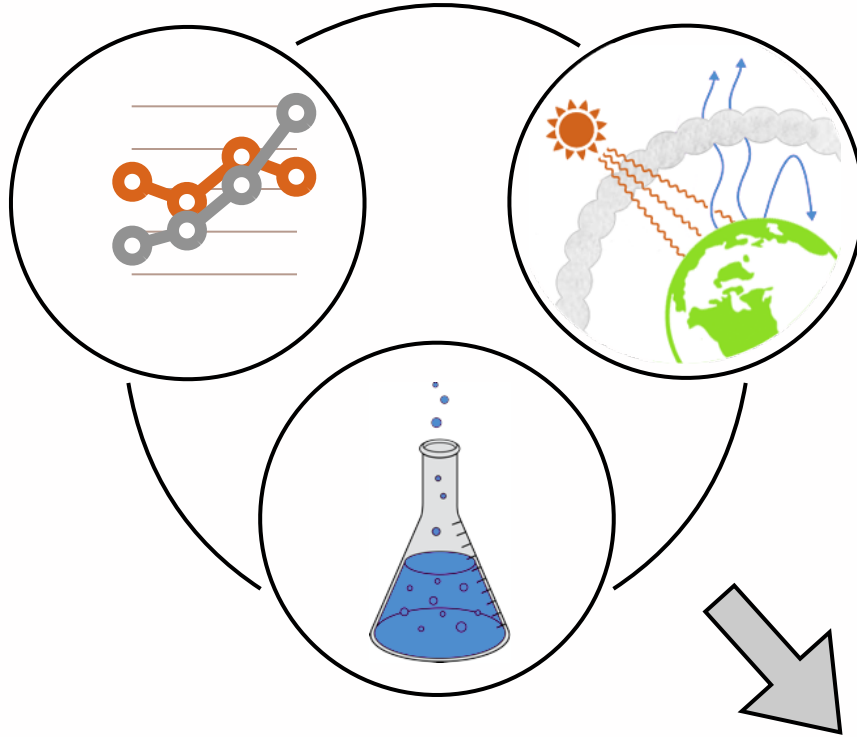


# Modeling energy systems



to accelerate low-carbon technology development





Fundamental insight + tools to inform decisions:

- engineers
- private investors
- policy makers (R&D, regulations)

# Research areas

---

- Determinants of the rate of technological improvement
- Adoption potential of technologies evaluated against energy demand dynamics
- Emissions impacts of energy technologies evaluated against climate targets

# Research areas

---

- Determinants of the rate of technological improvement
- Adoption potential of technologies evaluated against energy demand dynamics
- Emissions impacts of energy technologies evaluated against climate targets

# How much improvement needed in energy storage technologies?

---

- *Example 1:* Evaluate stationary storage cost structures against electricity demand, prices and resource availability
- *Example 2:* Evaluate mobile battery specific energy against personal vehicle travel patterns

# Role of storage technologies for renewable energy

---

- Wind, solar resources are intermittent
- Storage can be used to:
  - Match renewables supply to demand
  - Increase renewable plant revenue



For background see:

D. Rastler, EPRI, Dec. 2010;

E. Hittinger, J.F. Whitacre, J. Apt, *J. Power Sources*, 206, 2012

S. Sundararagavan, E. Baker, *Solar Energy*, 2012

Bob West

# Role of storage technologies for renewable energy

---

- Wind, solar resources are intermittent
- Storage can be used to:
  - Match renewables supply to demand
  - Increase renewable plant revenue



For background see:  
D. Rastler, EPRI, Dec. 2010;  
E. Hittinger, J.F. Whitacre, J. Apt, *J. Power Sources*, 206, 2012  
S. Sundararagavan, E. Baker, *Solar Energy*, 2012

Bob West

# Evaluating storage techs for solar and wind energy

---

- How to compare diverse storage technologies on a single scale?

# Moving beyond lists of attributes...

Storage technologies.

	L/A battery	Li-ion battery	NaS battery	VRB flow battery
Energy storage capacity (kW h)	≤100	≤10	≤100	20–50
Typical power output (MW)	1–100	0.1–5	5	0.01–10
Energy density (W h/L)	50–80	200–500	150–250	16–33
Power density (W/L)	10–400	0	0	0
Discharge duration	Hours	Minutes–hours	Hours	2–8 h
Charge duration	Hours	Minutes–hours	Hours	2–8 h
Response time	<Seconds	Seconds	Milliseconds	<Seconds
Lifetime (years)	3–10	10–15	15	5–20+
Lifetime (cycles)	500–800	2000–3000	4000–40,000	1500–15,000
Roundtrip efficiency (%)	70–90%	85–95%	80–90%	70–85%
Capital cost per discharge (\$/kW)	\$300–\$800	\$400–\$1000	\$1000–\$2000	\$1200–\$2000
Capital cost per capacity (\$/kW h)	\$150–\$500	\$500–\$1500	\$125–\$250	\$350–\$800
Power quality			✓	✓
Transient stability	✓			
<i>Ancillary services</i>				
Regulation		✓	✓	✓
Spinning reserves	✓	✓	✓	✓
Voltage control		✓	✓	✓



# Evaluating storage techs for solar and wind energy

---

- How to compare diverse storage technologies on a single scale?
- At what costs do storage technologies add value to renewables?
- How do current devices compare to these targets?
- How to optimally improve future storage technologies?

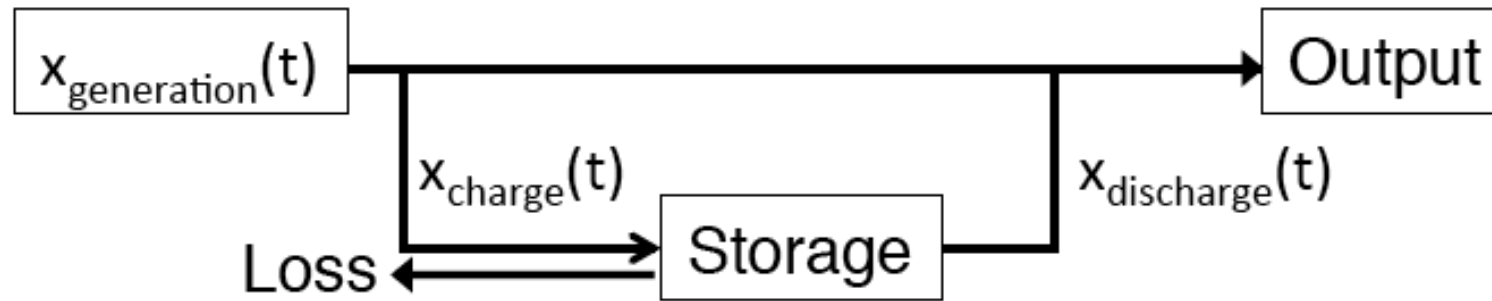
# Consider three locations, two energy resources

---

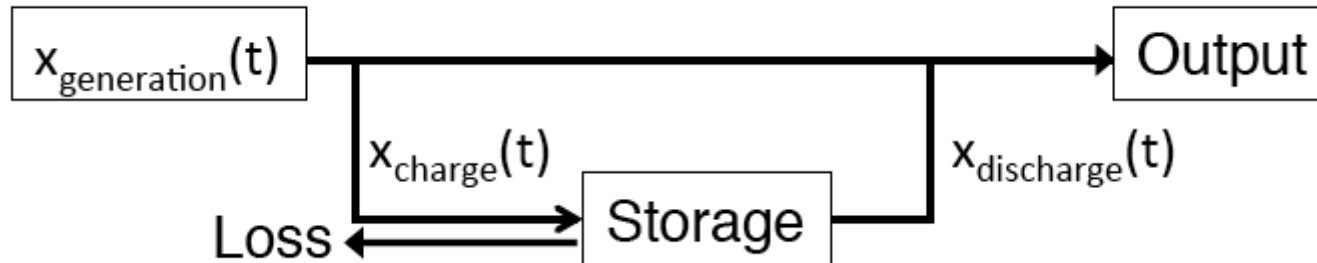
- Consider wind and solar at three sites:
  - Barnstable, MA
  - McCamey, TX
  - Palm Springs, CA
- Datasets:
  - Hourly real-time electricity pricing (ISONE, ERCOT, CAISO)
  - Hourly generation of solar and wind plants

# Manage storage to maximize revenue

---



# Manage storage to maximize revenue

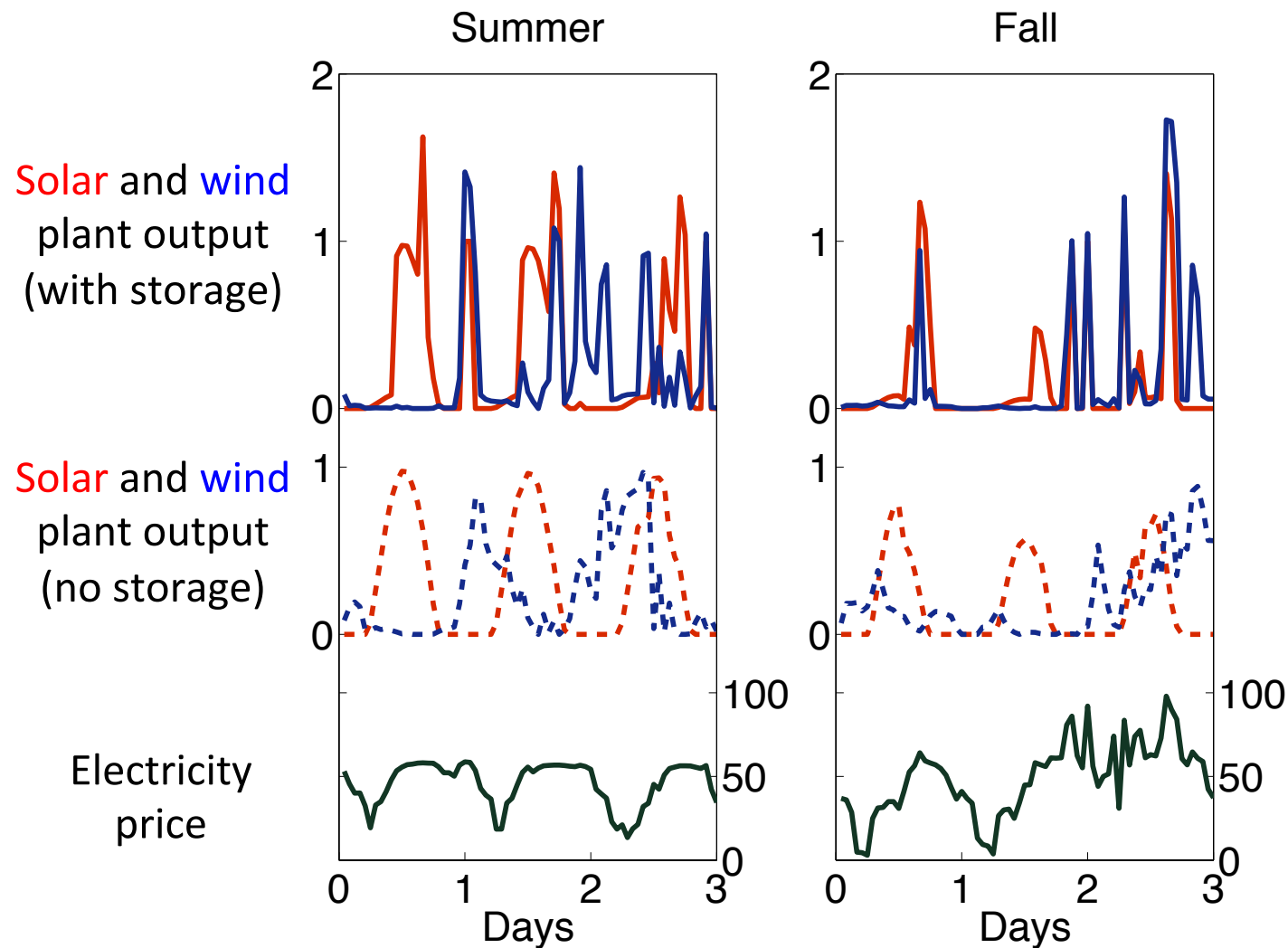


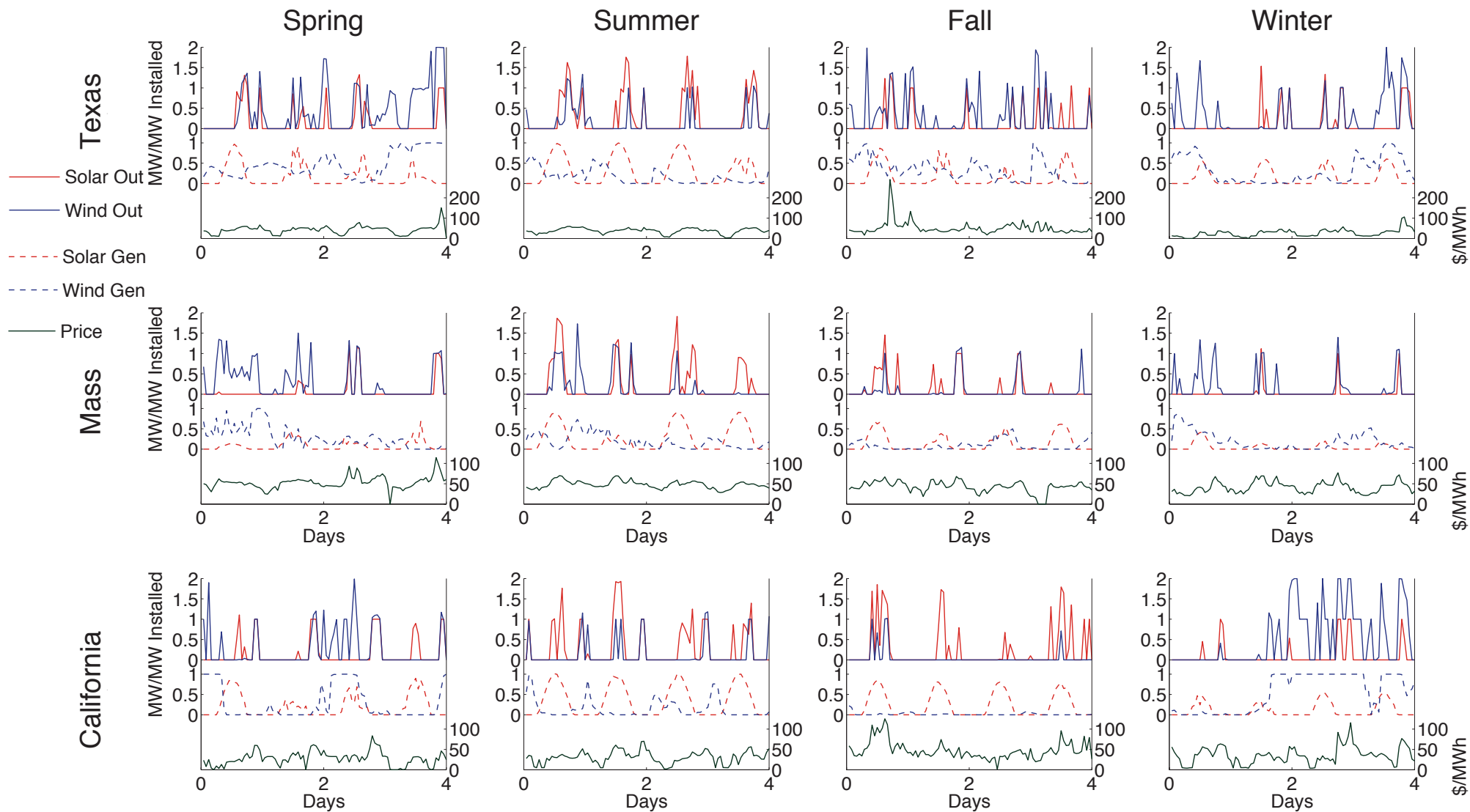
$$\begin{array}{c}
 \text{revenue} \\
 \searrow \\
 R_{\text{total}} = \max \left( \sum_{t=0}^N P(t) (x_{\text{generation}}(t) + x_{\text{discharge}}(t) - x_{\text{charge}}(t)/\eta) \right) \\
 \begin{array}{c}
 \uparrow \\
 \text{electricity price}
 \end{array}
 \end{array}
 \quad
 \begin{array}{c}
 \text{wind, solar resource} \\
 \swarrow
 \end{array}$$

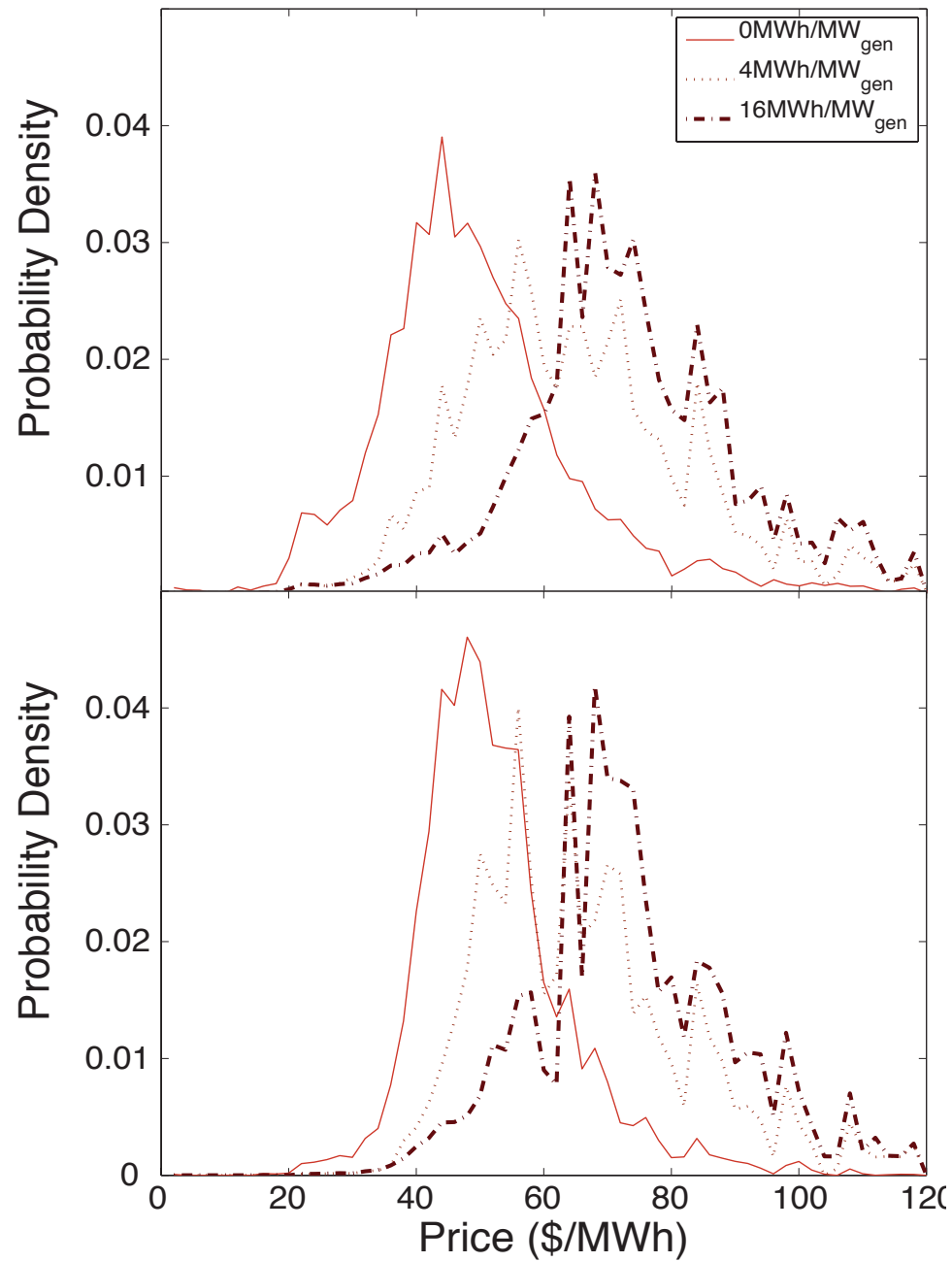
subject to:

$$\begin{array}{ll}
 \text{power capacity} & \left\{ \begin{array}{l} 0 \leq x_{\text{discharge}} \leq \dot{E}_{\text{max}} \\ \text{constraint} \quad 0 \leq x_{\text{charge}} \leq \min(\eta x_{\text{generation}}(t), \eta \dot{E}_{\text{max}}) \end{array} \right. \\
 \text{energy capacity} & \left\{ \begin{array}{l} 0 \leq \sum_{t=0}^N (x_{\text{charge}}(t) - x_{\text{discharge}}(t)) \leq h \dot{E}_{\text{max}}. \\ \text{constraint} \end{array} \right.
 \end{array}$$

# Managing storage to maximize revenue







MA solar

MA wind

# Balancing the cost and benefit of storage

---

- Value of energy storage

$$\chi = \frac{R_{\text{total}}}{CRF(C_{\text{gen}} + \dot{E}_{\text{max}}(C_{\text{storage}}^{\text{power}} + hC_{\text{storage}}^{\text{energy}}))}$$

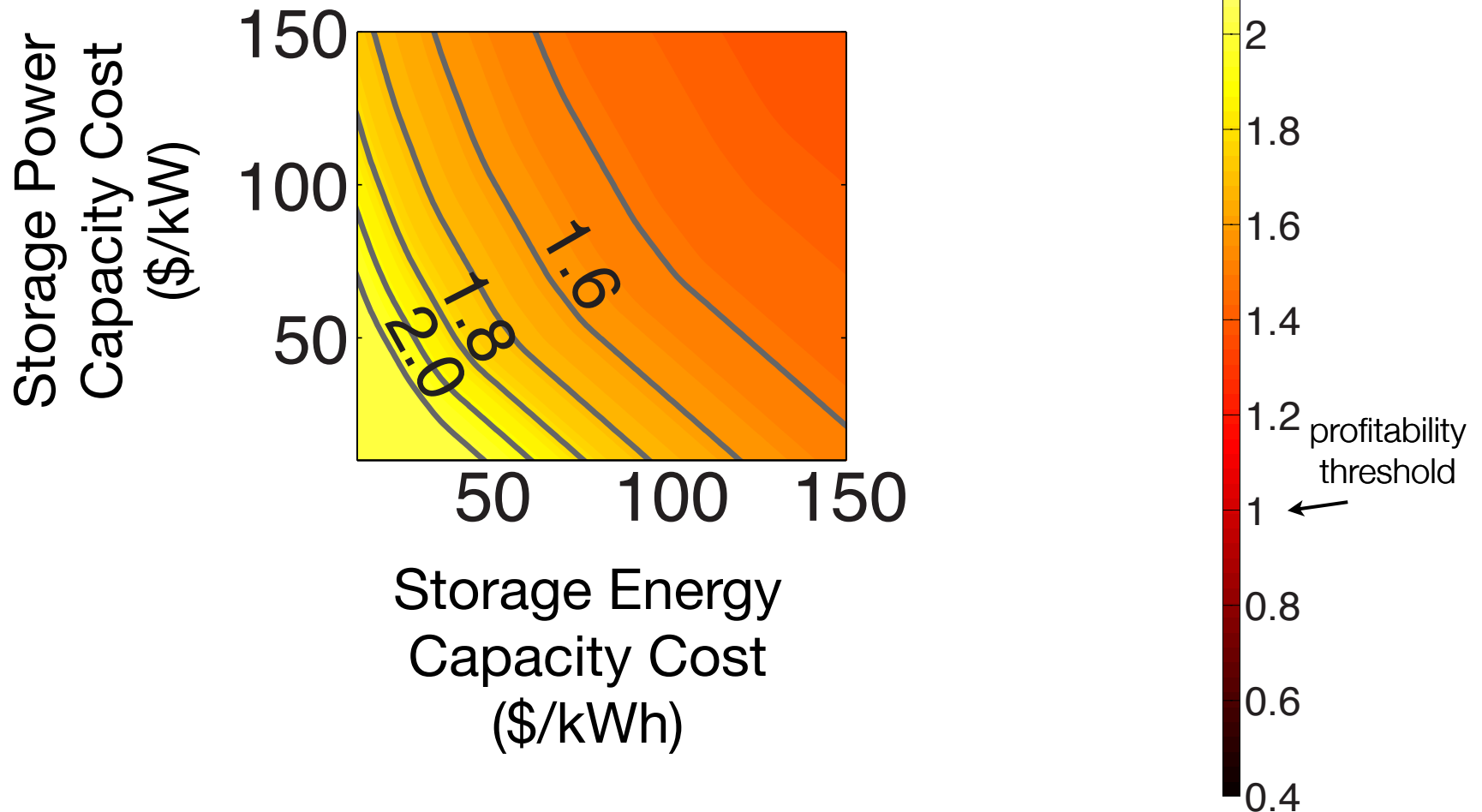
Diagram illustrating the components of the value of energy storage equation:

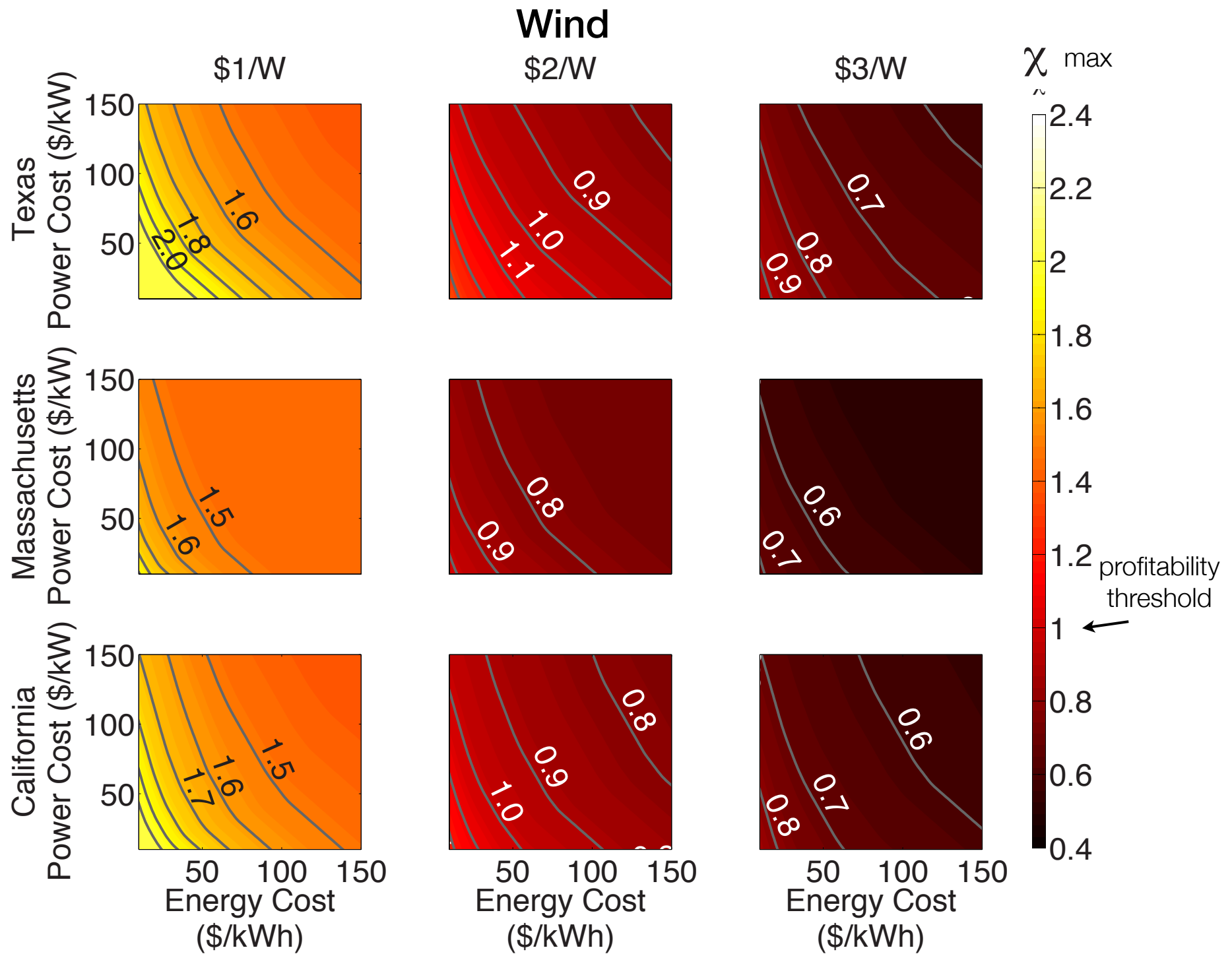
- $R_{\text{total}}$ : annual revenue
- $CRF$ : annualization factor
- $C_{\text{gen}}$ : wind, solar cost
- $\dot{E}_{\text{max}}$ : storage power
- $C_{\text{storage}}^{\text{power}}$ : storage cost
- $h$ : hours
- $C_{\text{storage}}^{\text{energy}}$ : storage cost

- Storage system sized to maximize chi

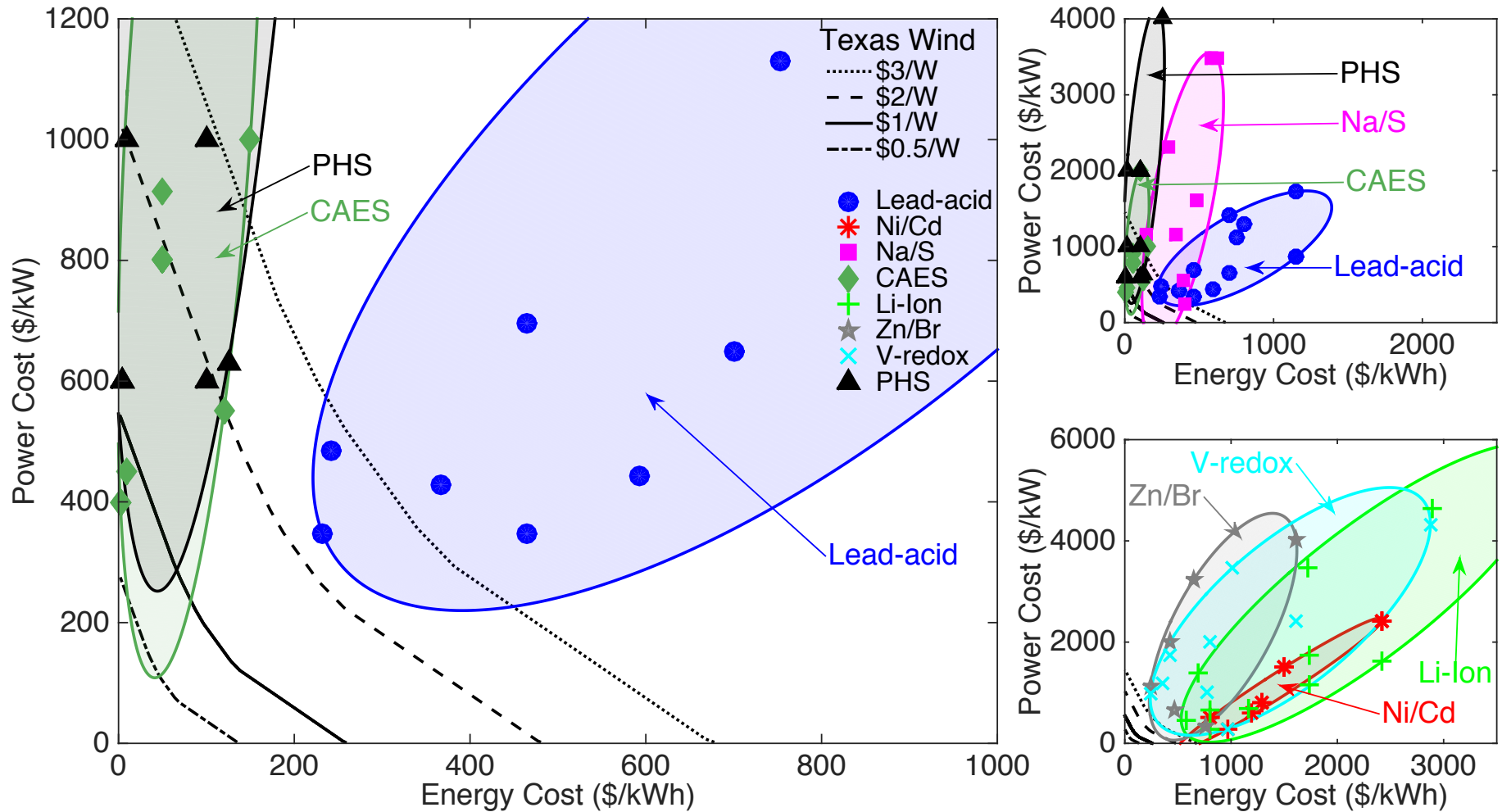


Wind Capacity Cost: \$1/W  
Location: McCamey, Texas





# Storage technologies compared to value-adding cost thresholds



PHS: pumped hydro storage  
CAES: compressed air energy storage

# Evaluating storage techs for solar and wind energy

---

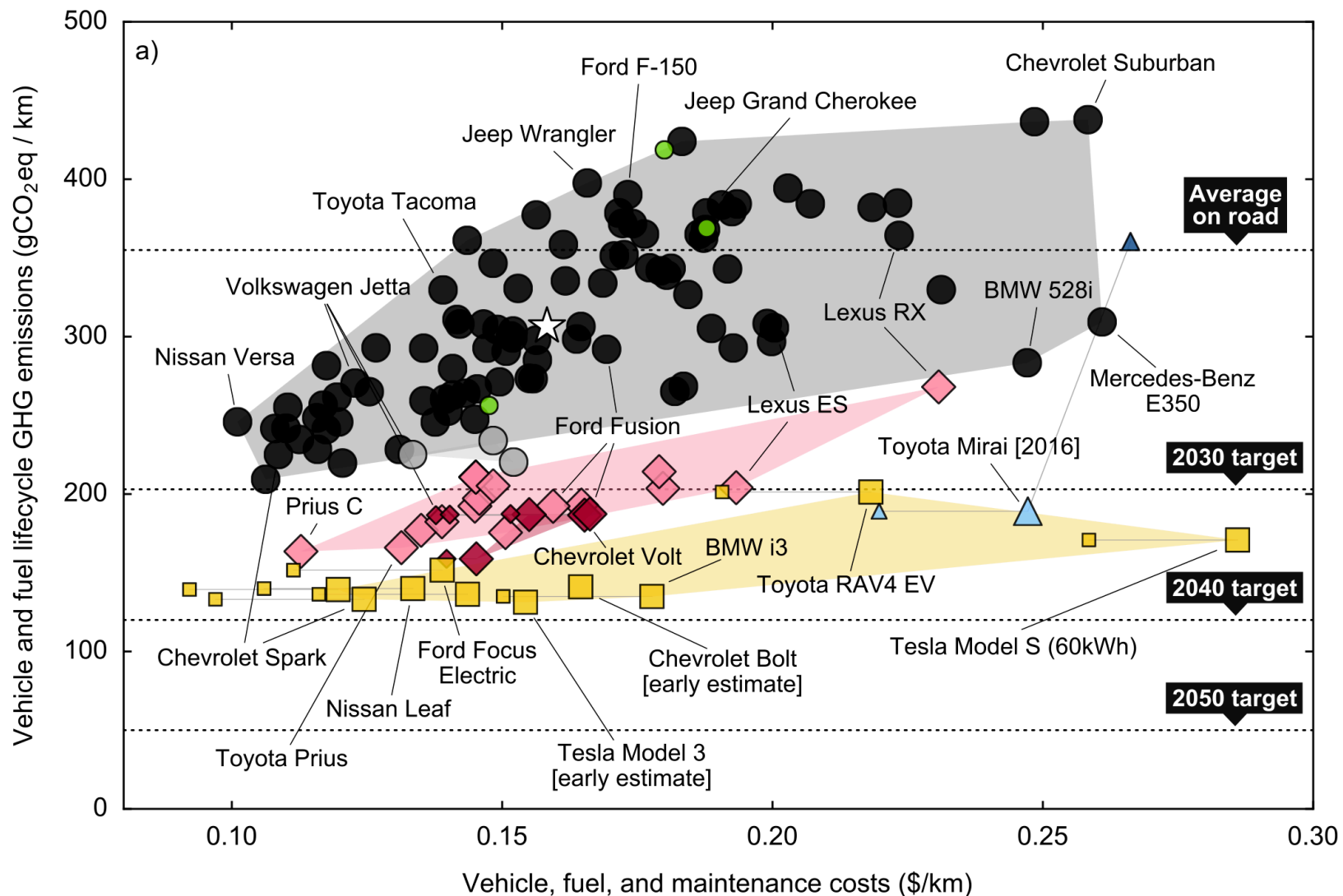
- Storage today can add value to wind and solar in some locations
- Cost improvement needed for wide-spread profitability
- Optimal cost improvement trajectories relatively location invariant
- Cost targets can inform industry and government tech strategies

# How much improvement needed in energy storage technologies?

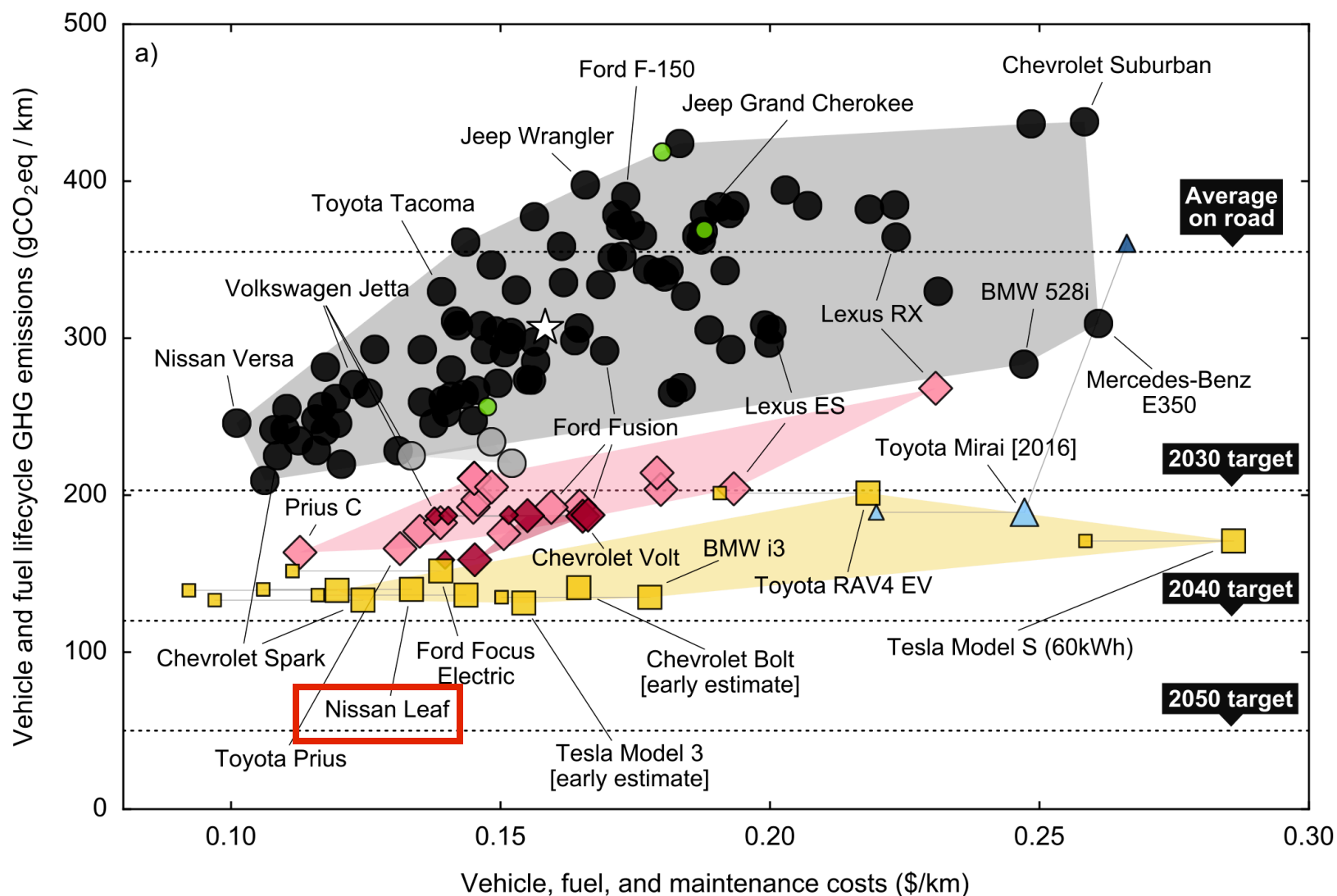
---

- *Example 1:* Evaluate stationary storage cost structures against electricity demand, prices and resource availability
- *Example 2:* Evaluate mobile batteries against personal vehicle travel patterns

# Cost and emissions of vehicle powertrains (see [carboncounter.com](http://carboncounter.com))



# Cost and emissions of vehicle powertrains (see [carboncounter.com](http://carboncounter.com))



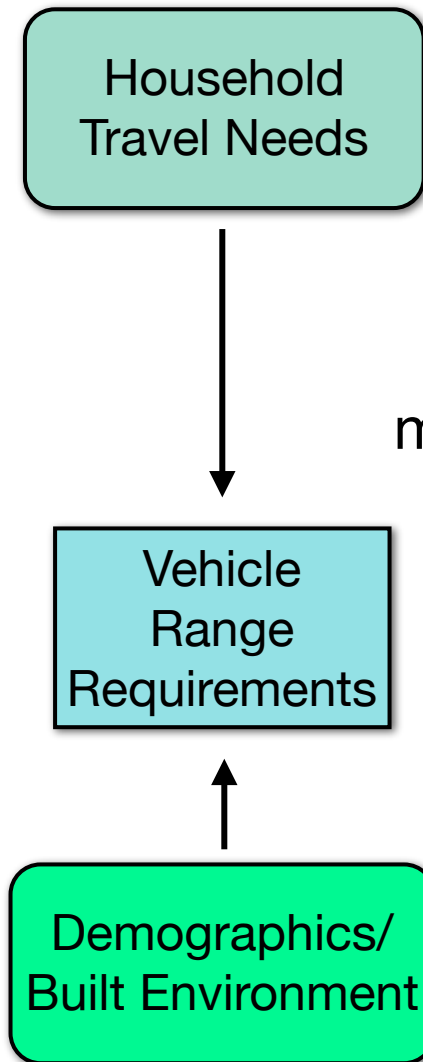




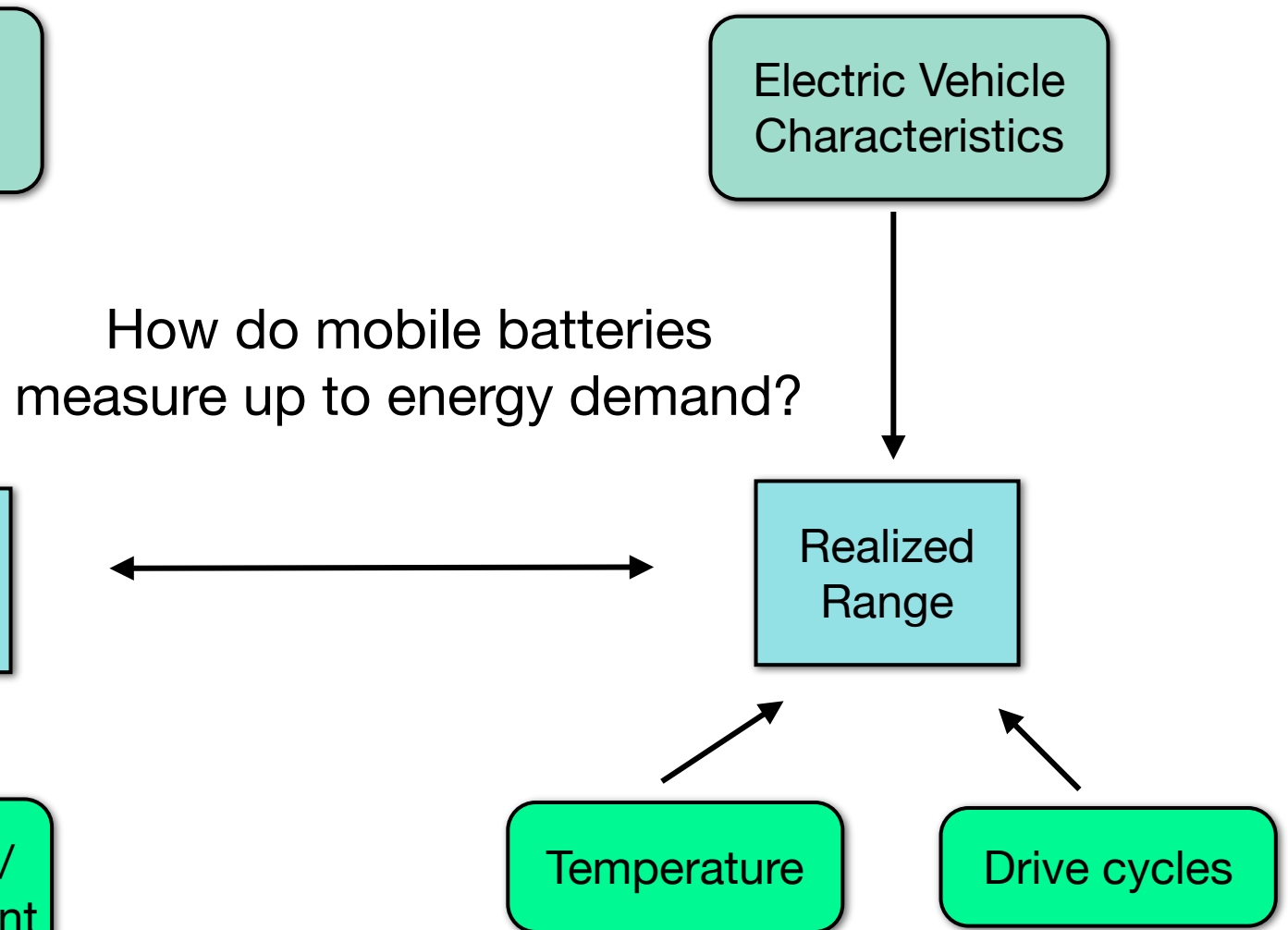




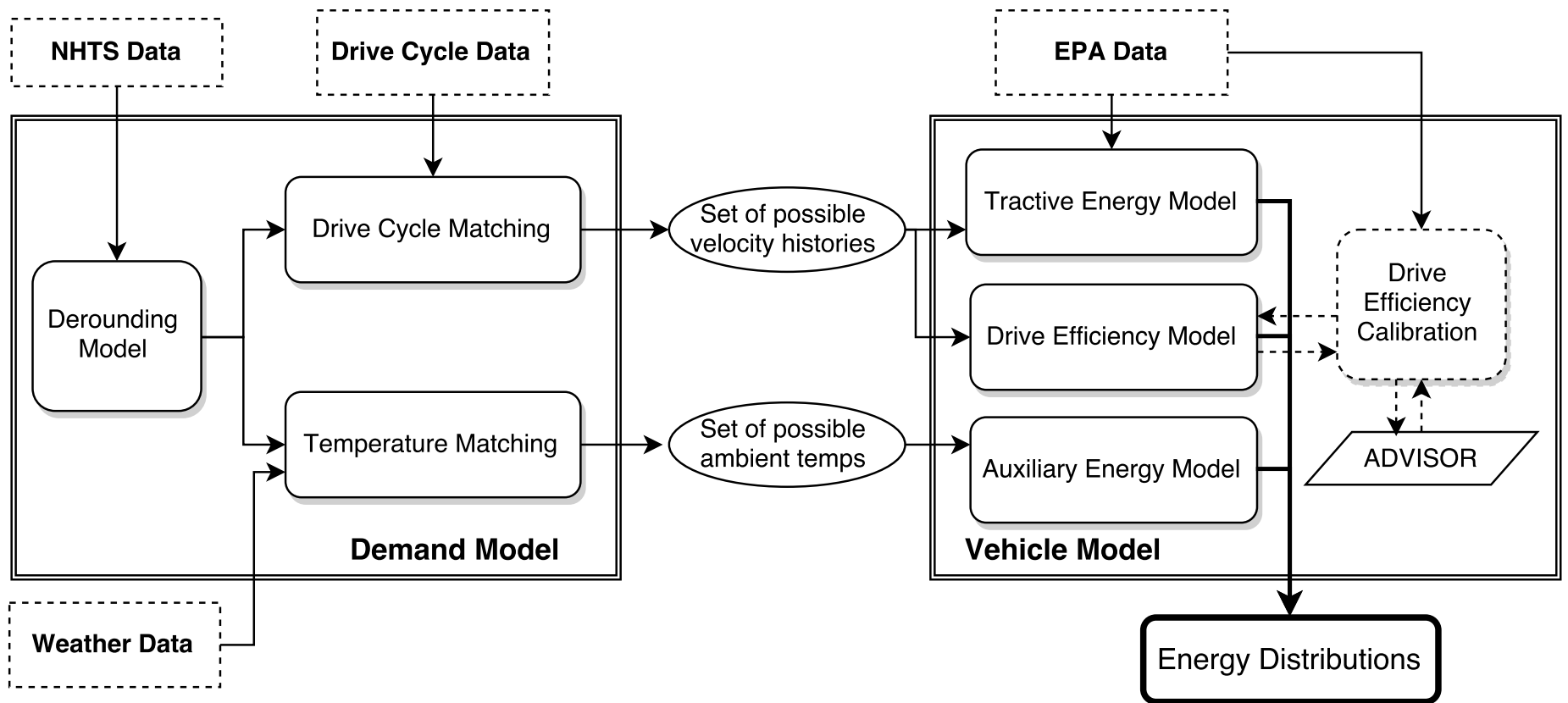
## Demand model



## Vehicle model



# TripEnergy Model



# Demand Model

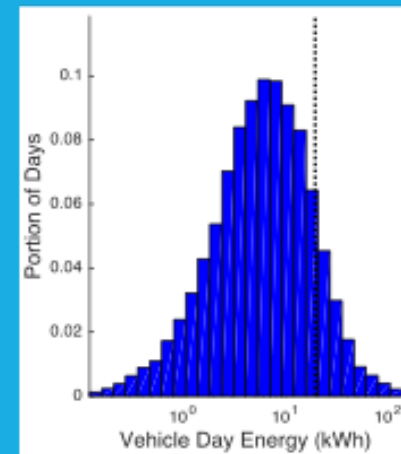
---

NHTS:

Limited information  
on a specific trip

TripEnergy  
Matching

Trips with known energy  
requirements

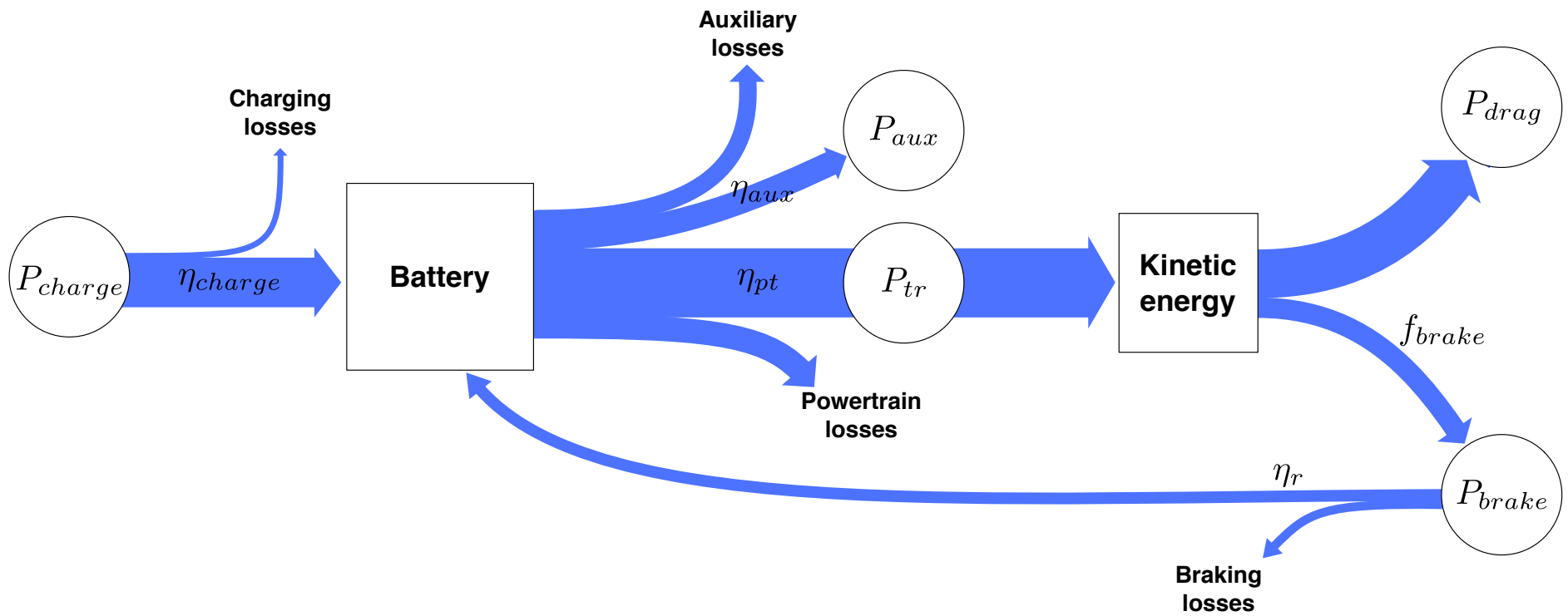


Energy Distribution

GPS surveys + vehicle model

# Vehicle Model

---



# Tractive Energy Calculation

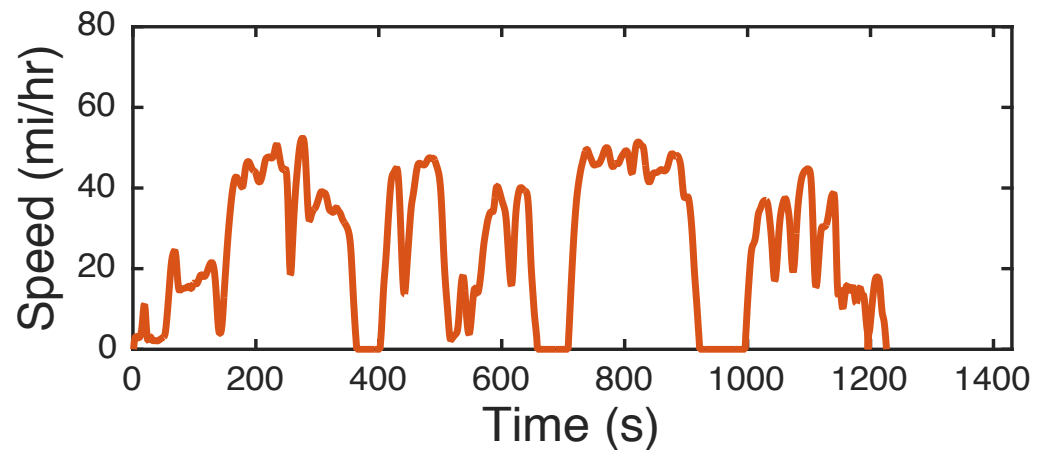
---

Drag Coefficients

$$F_{tr}(v) = a + bv + cv^2 + (1 + q)m \frac{dv}{dt}$$

Rotational Inertia      Mass

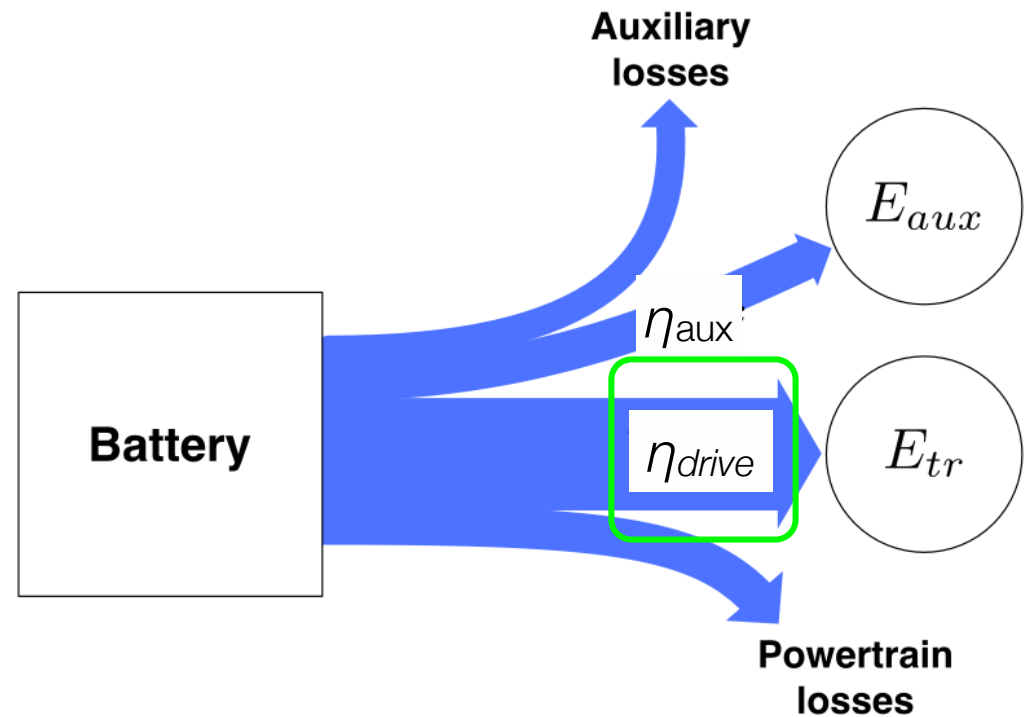
$$E_{tr} = \int_{F_{tr}(t) > 0} F_{tr}(t) v(t) dt$$



# Vehicle Model

---

$$\Delta E_B = \frac{E_{tr}}{\eta_{drive}} + \frac{E_{aux}}{\eta_{aux}}$$





# Drive Efficiency Calculation

---

$$\eta_{drive} \approx f(\text{drive cycle})$$

Test Result:

$$\Delta E_B = \frac{E_{tr}}{\eta_{drive}} + \frac{E_{aux}}{\eta_{aux}}$$

Expression for  
Efficiency:

$$\eta_{drive} = \frac{E_{tr}}{\Delta E_B - E_{aux}/\eta_{aux}}$$

$$\eta_{drive}(\mathbf{f}_{\text{brake}}) = \frac{\eta_{pt}^*}{1 - \eta_{pt}^* \mathbf{f}_{\text{brake}} \eta_r^*}$$



Solve system of equations with EPA results

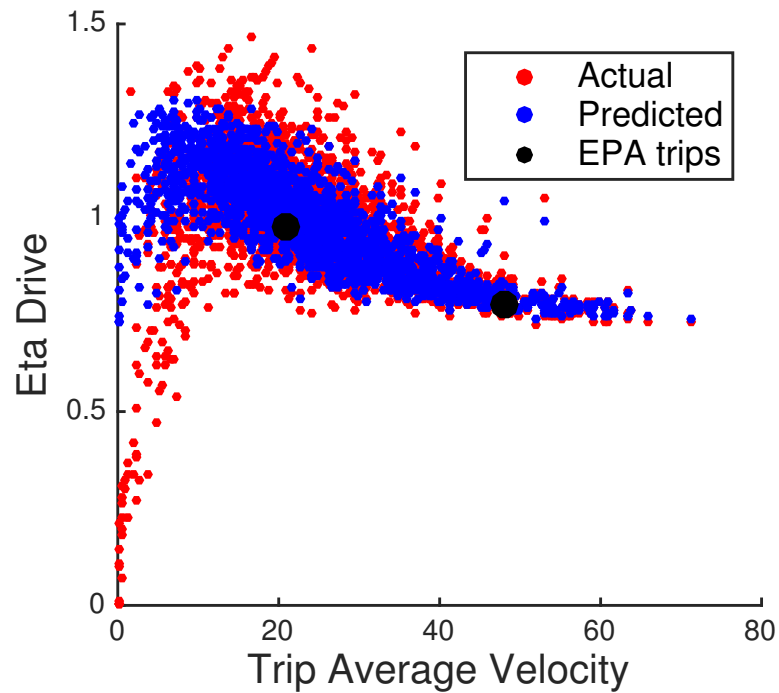


$$\eta_{pt} = 0.908 \quad \eta_r = 0.849$$

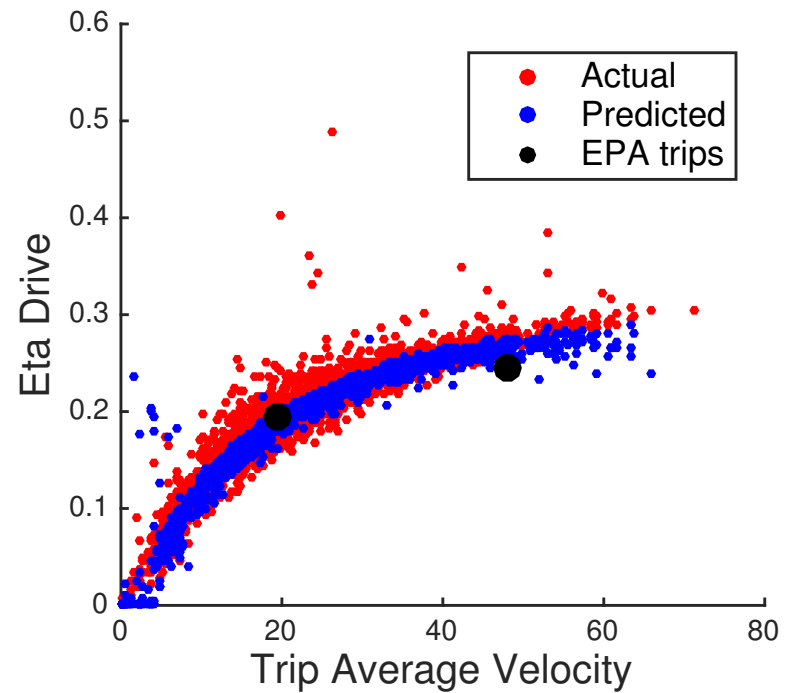


# Drive Efficiency Validation

---

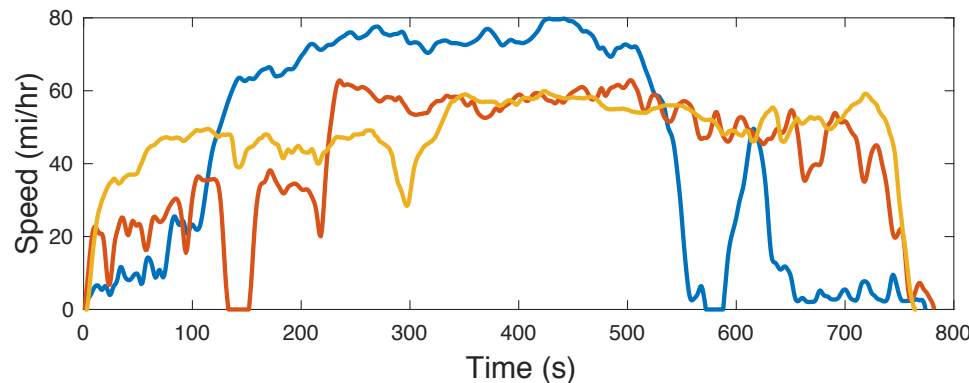


BEV

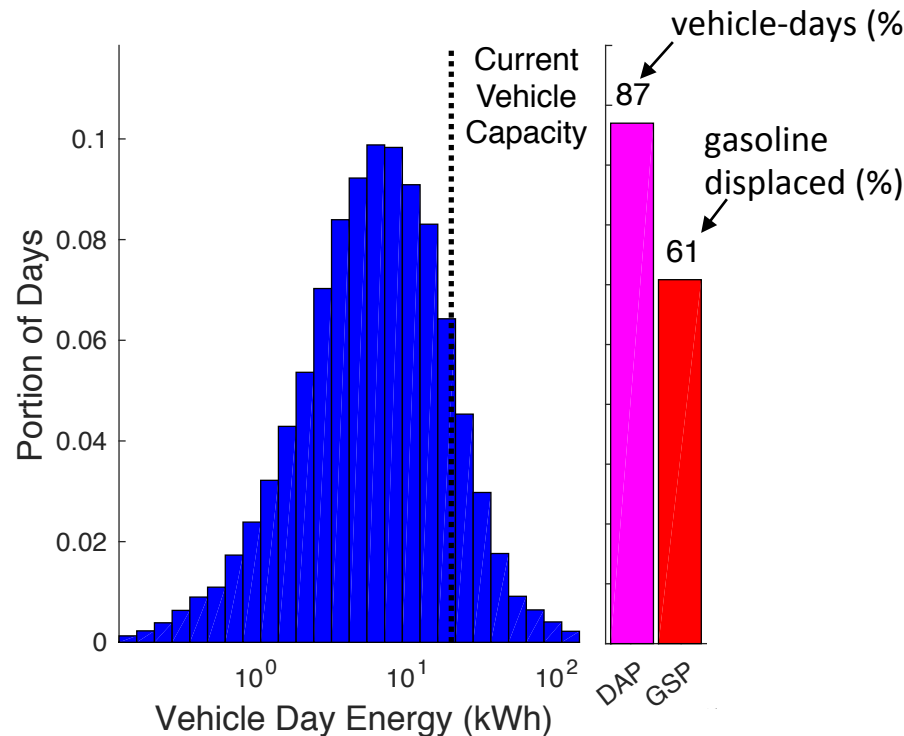


ICEV

# Batteries evaluated against U.S. driving patterns



Based on driving patterns across all U.S. cities and millions of drivers....

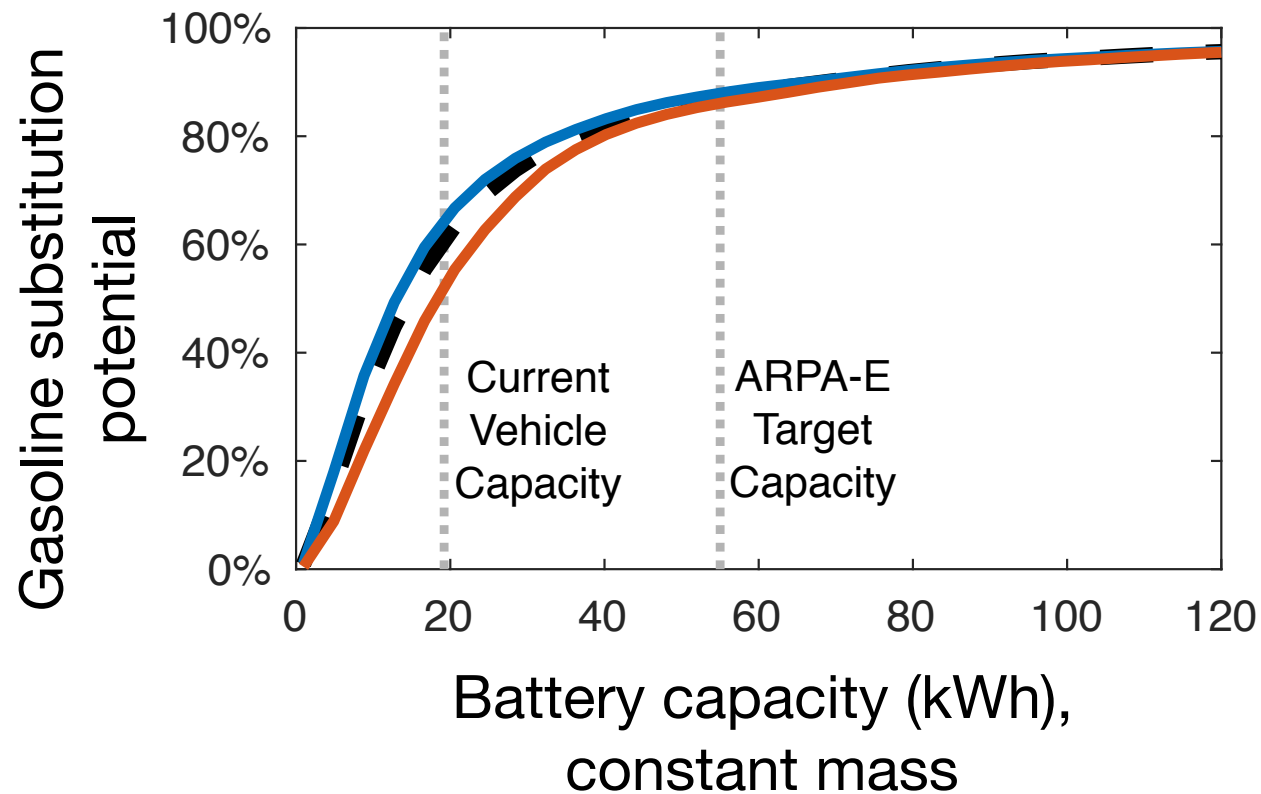


**87% of vehicles** can be replaced by a low-cost electric vehicle on an average day, even if only nighttime charging is available.

This number is remarkably similar across diverse cities, from Houston to New York.

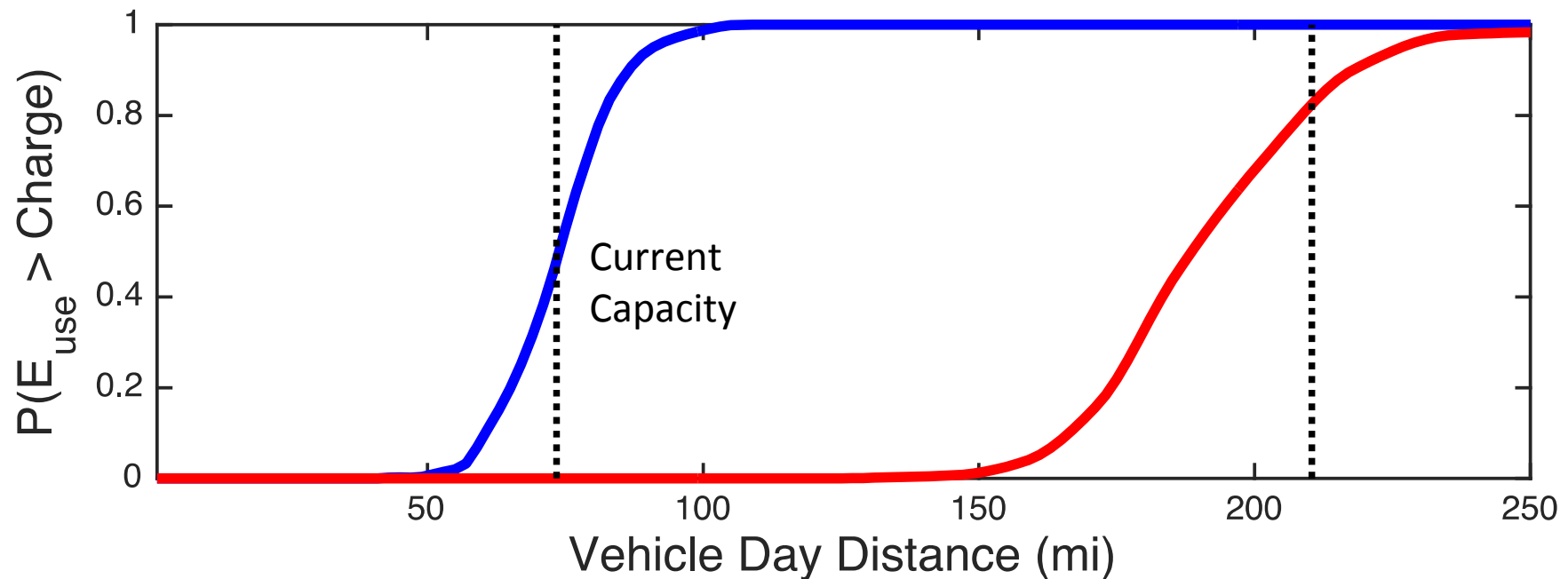
# Diminishing returns to battery improvement

---

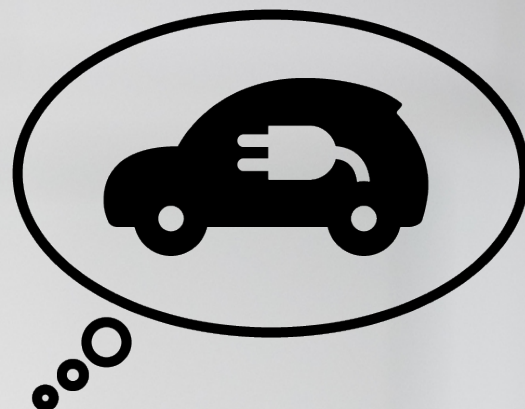


# Predicting electric vehicle range

---



- Range is not constant—73 miles on average but with a distance of 58 miles, a 5% chance of running out of charge
- Range does not increase linearly with battery capacity



# How much improvement needed in energy storage technologies and materials?

---

- *Example 1:* Evaluate stationary storage cost structures against electricity demand, prices and resource availability
- *Example 2:* Evaluate mobile battery specific energy against personal vehicle travel patterns

# Conclusions and discussion

---

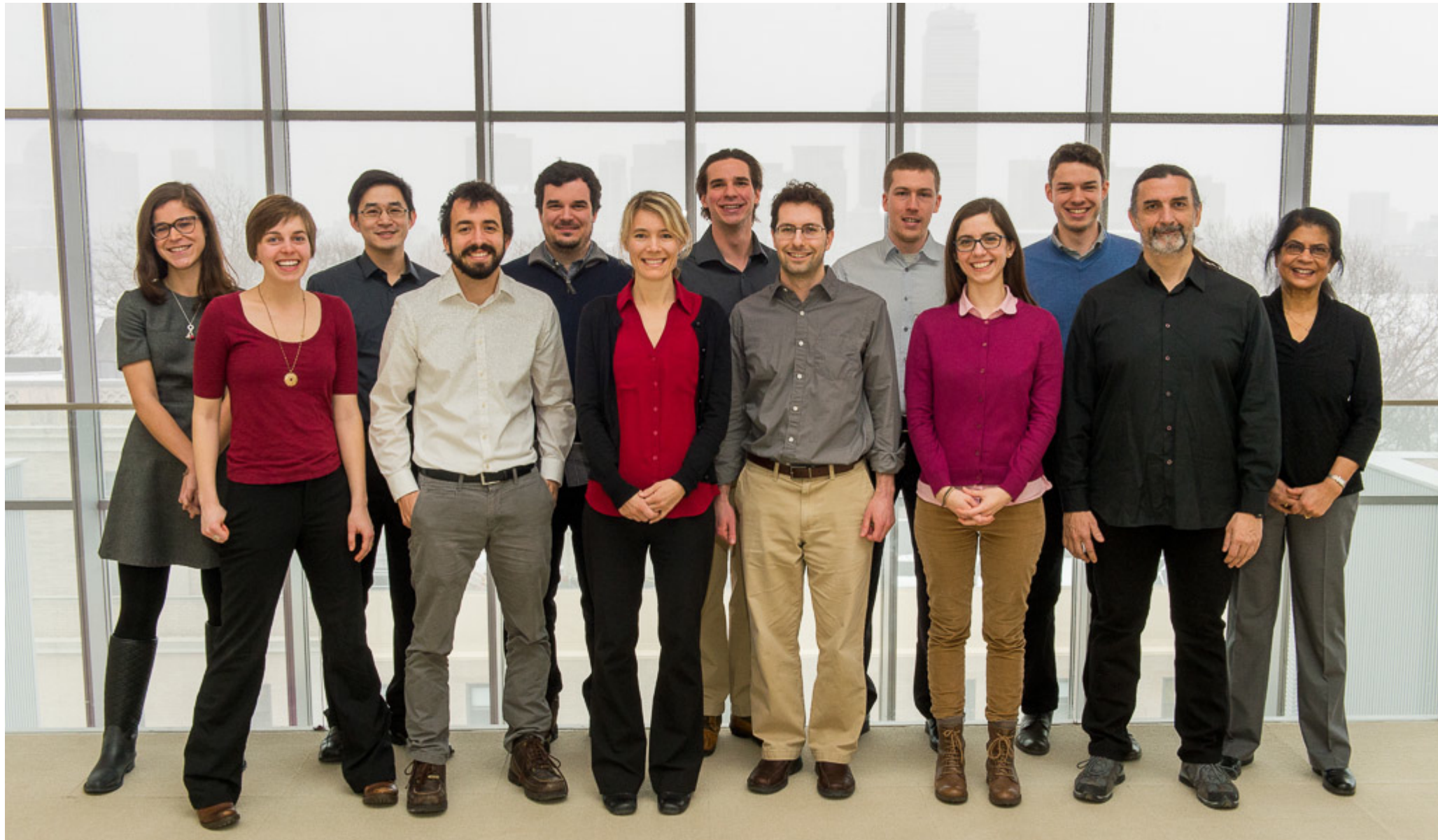
- Energy storage development next ~15 years critical for renewables growth and climate change mitigation
- Some storage technologies becoming profitable for renewables in several locations, but further development needed
- 87% of US personal vehicle-day energy needs met with today's batteries w/out recharging, but other powertrains needed to enable widespread electric vehicle adoption
- Energy storage materials and device development targets can be quantified by examining patterns of energy demand

# Conclusions and discussion

---

- Energy storage development next ~15 years critical for renewables growth and climate change mitigation
- Some storage technologies becoming profitable for renewables in several locations, but further development needed
- 87% of US personal vehicle-day energy needs met with today's batteries w/out recharging, but other powertrains needed to enable widespread electric vehicle adoption
- **Energy storage materials and device development targets can be quantified by examining patterns of energy demand**





Magdalena Klemun, Michael Chang, Gonalo Pereira, Joshua Mueller, Fabian Riether, Marco Miotti, Mandira Roy  
Morgan Edwards, Zach Needell, Jessika Trancik, James McNerney, Gksin Kavlak, Victor Ocana

