



California's Electricity Consumption under Climate Change

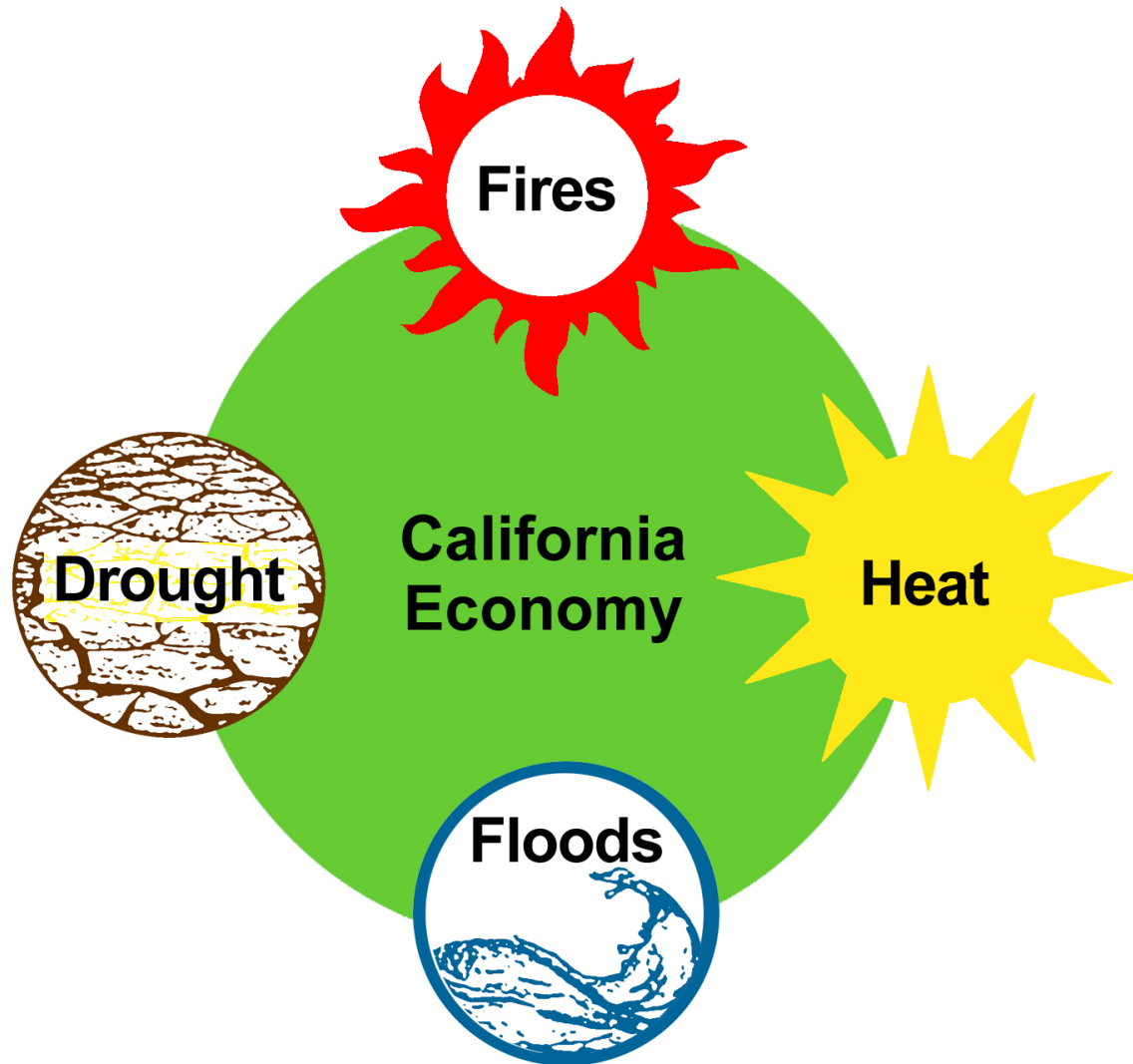
Maximilian Auffhammer

Associate Professor, Agricultural and Resource Economics

National Bureau of Economic Research

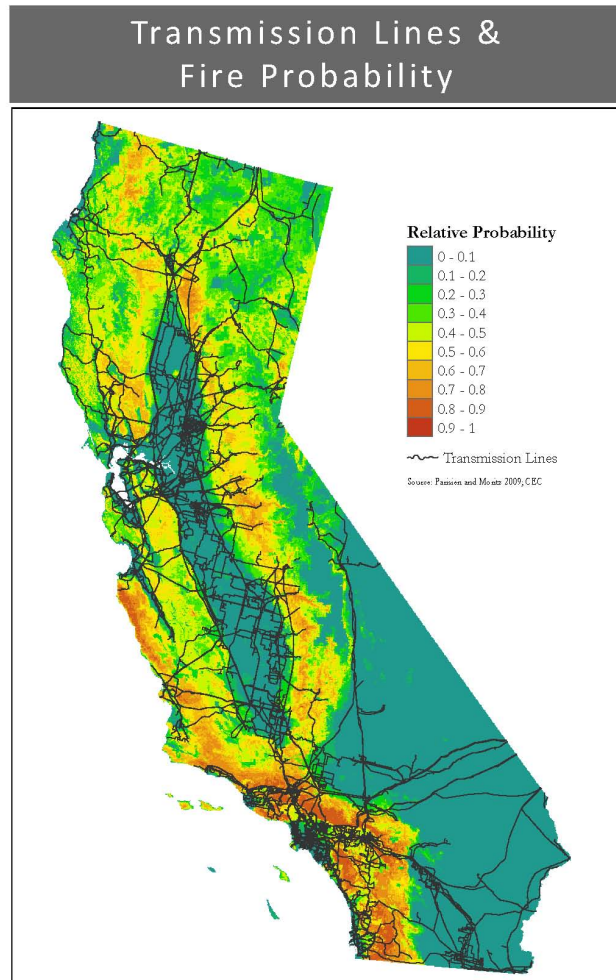
CESifo

Climate Change will negatively affect California's Economy





Existing Transmission Lines Under Increased Fire Risk



2085



**Probability Line
Affected by Fire
w/in 30-yr Period**

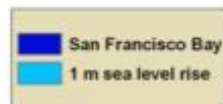
* Lines 220kv & above

- 0% - 10%
- 10.1% - 20%
- 20.1% - 30%
- 30.1% - 40%
- 40.1% - 50%
- 50.1% - 60%
- 60.1% - 70%
- 70.1% - 80%



Sea Level Rise Leads to large Scale Inundation

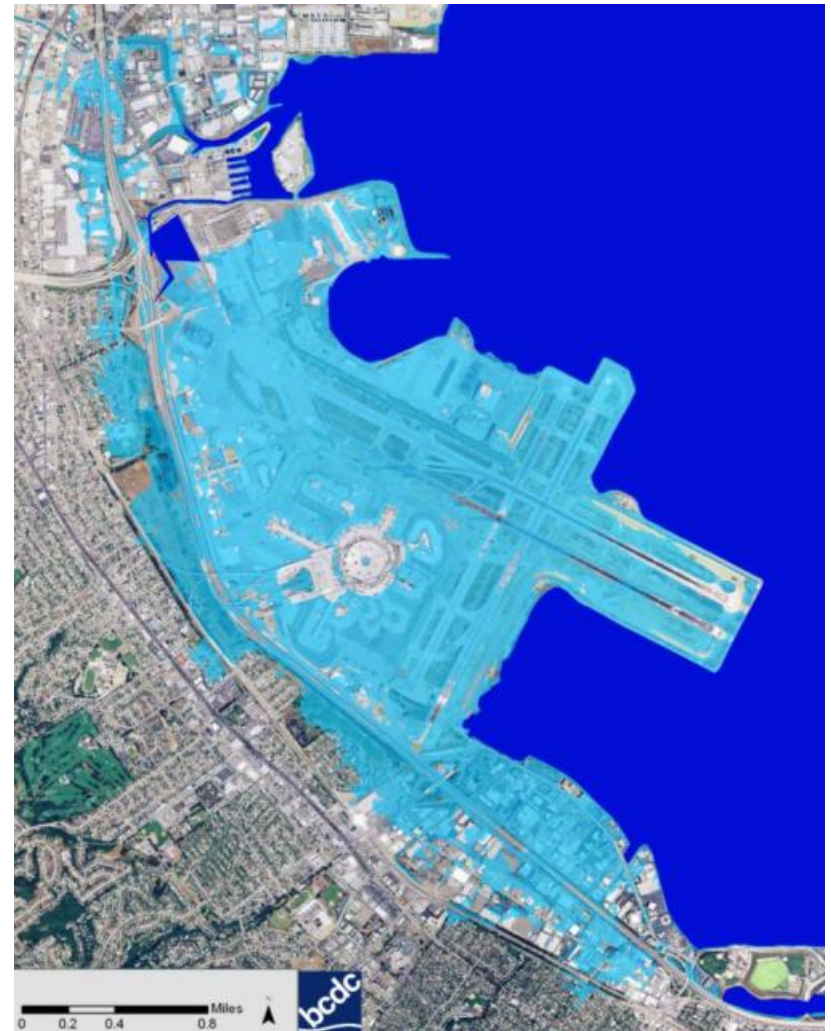
San Francisco Bay Scenario for Sea Level Rise
San Francisco Bay



Map is based on USGS elevation data and NAD83 imagery. Map is illustrative and depicts a potential inundation scenario in 2100. Limitations in the geospatial data could be very affect accuracy. Map should not be used for planning purposes.



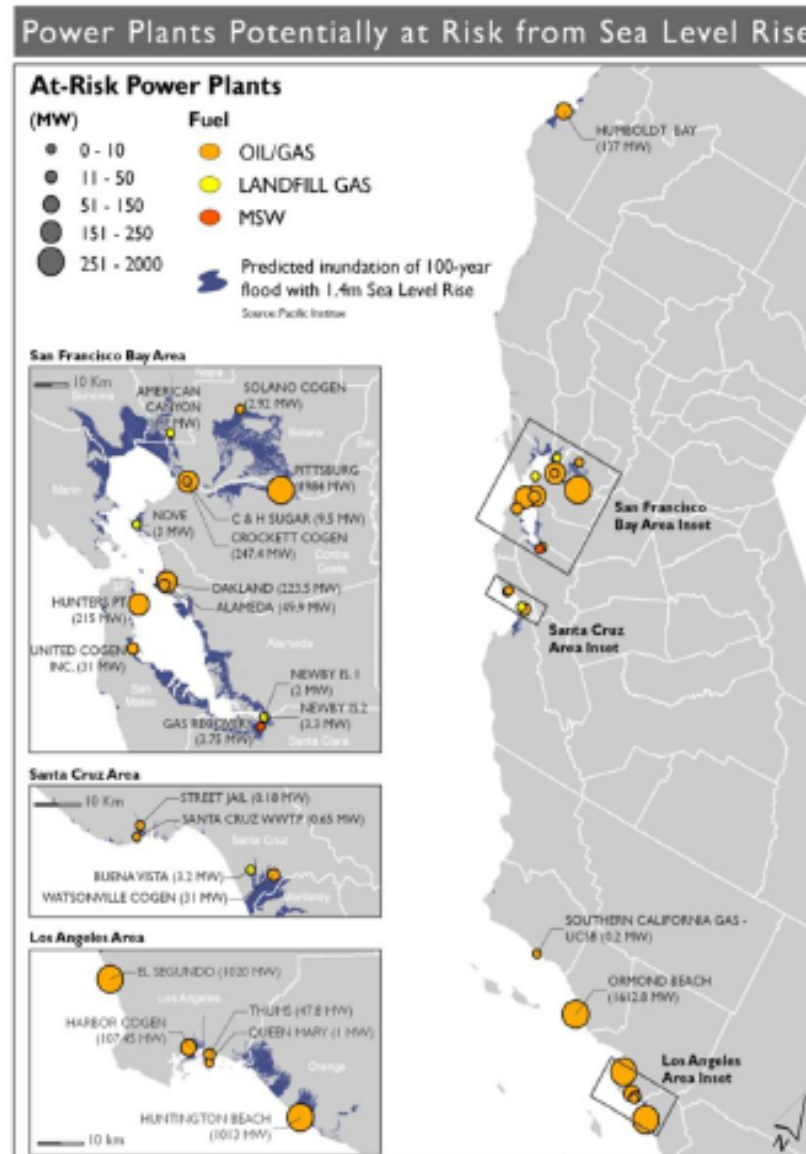
San Francisco International Airport & Oakland International Airport

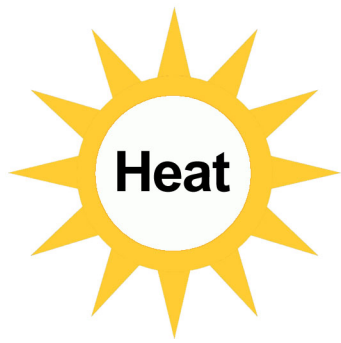


Source: BCDC, 2011



Power Plants Potentially at Risk

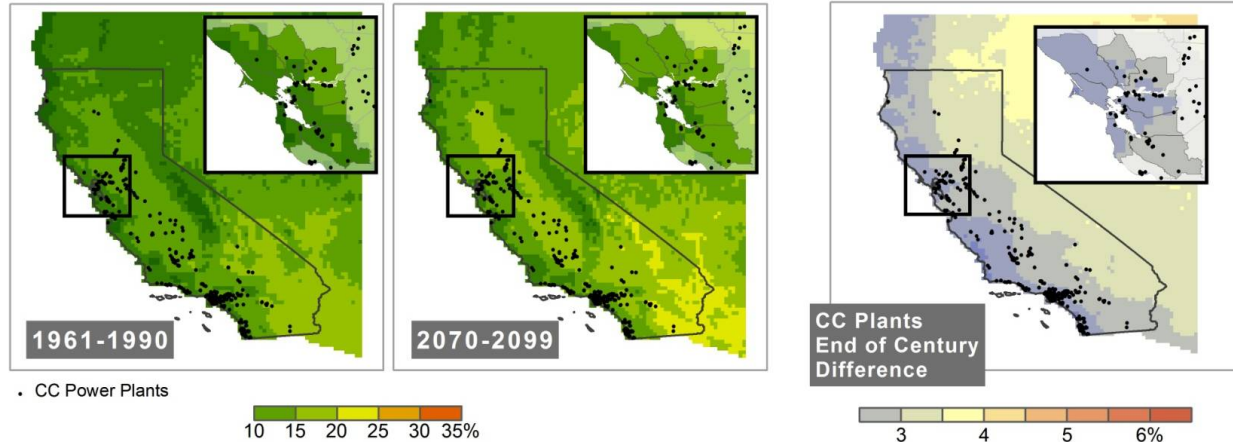




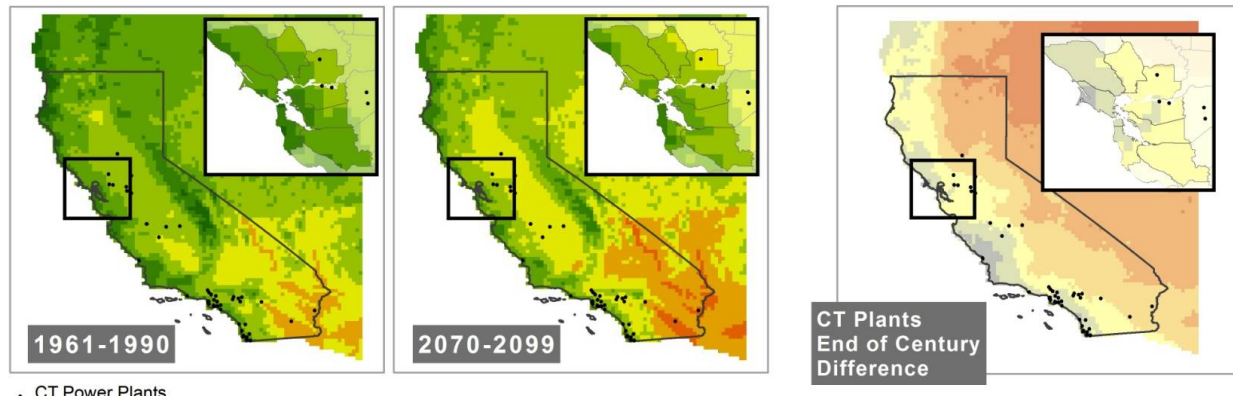
Power Generation and Transmission Losses

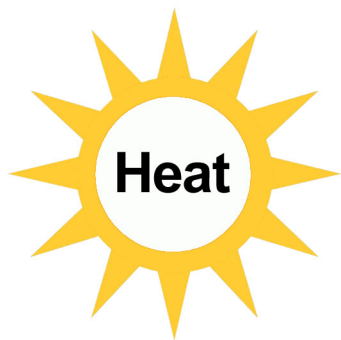
CC Power Plants

Source: Scripps; CEC

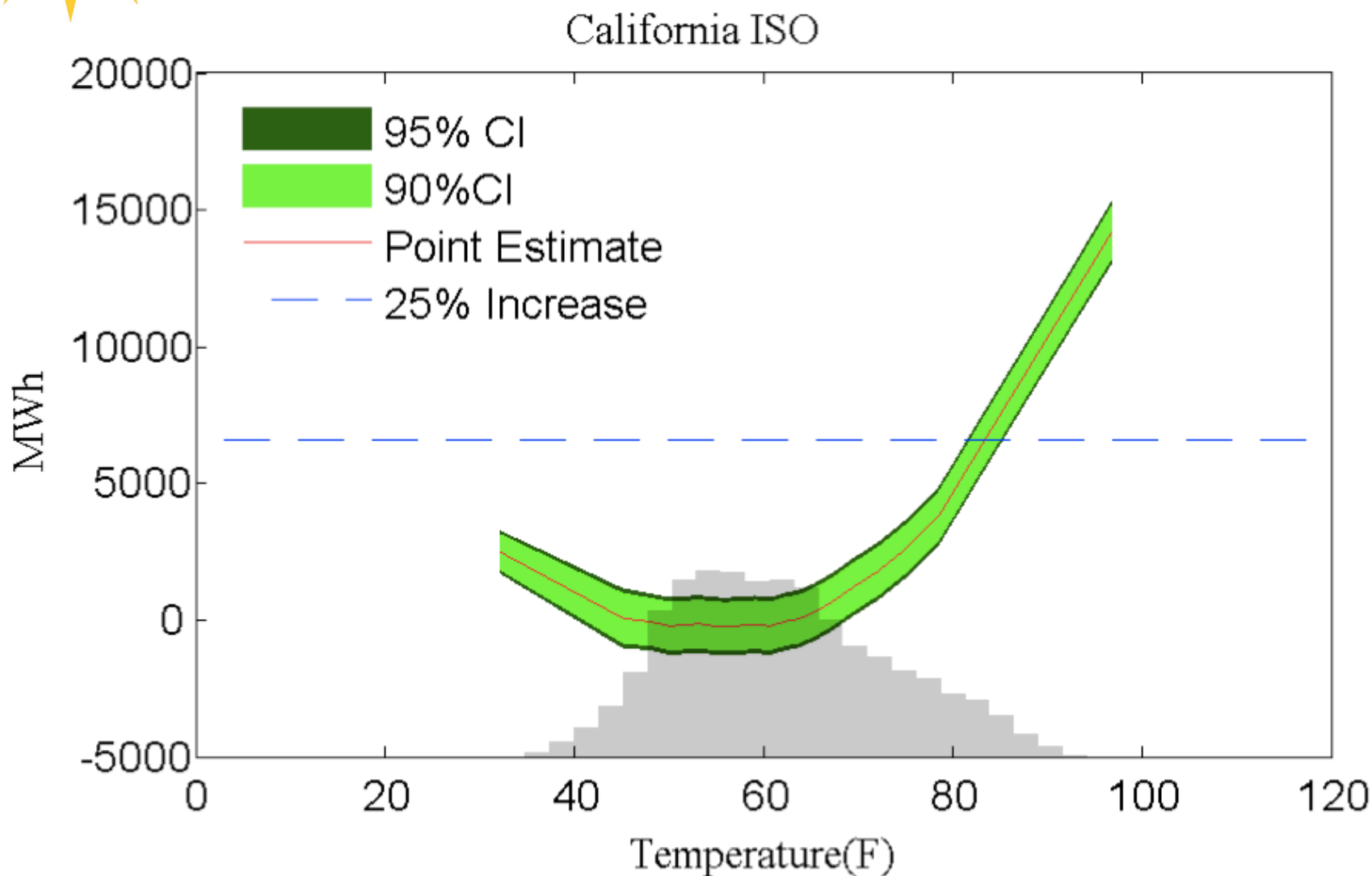


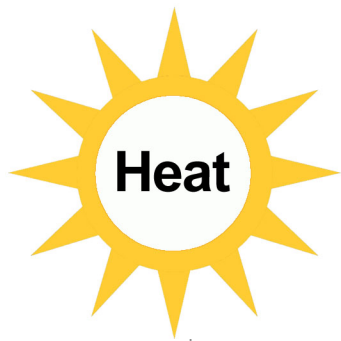
CT Power Plants





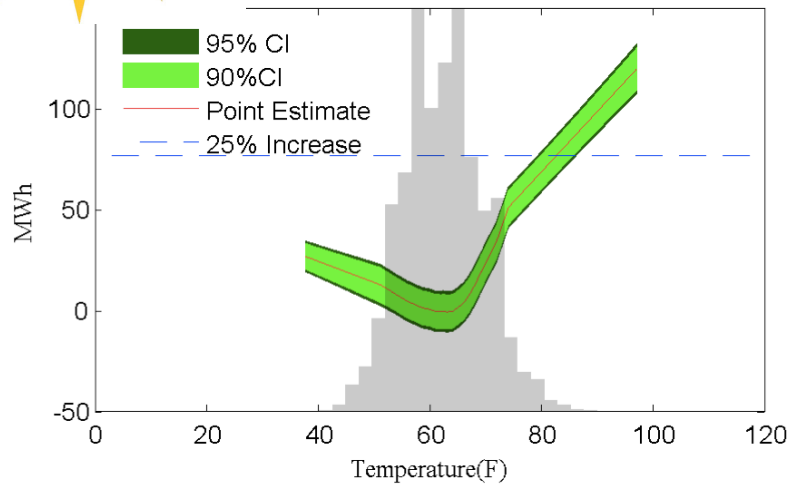
Electricity Load Increases on Hot Days



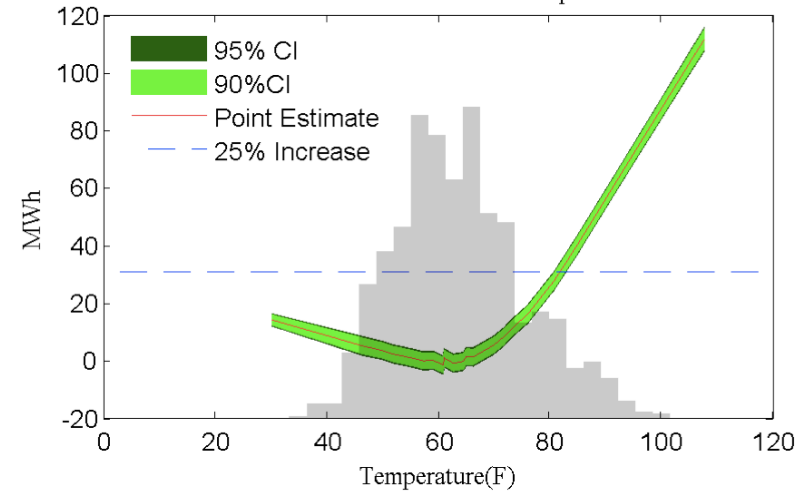


Electricity Load and Weather

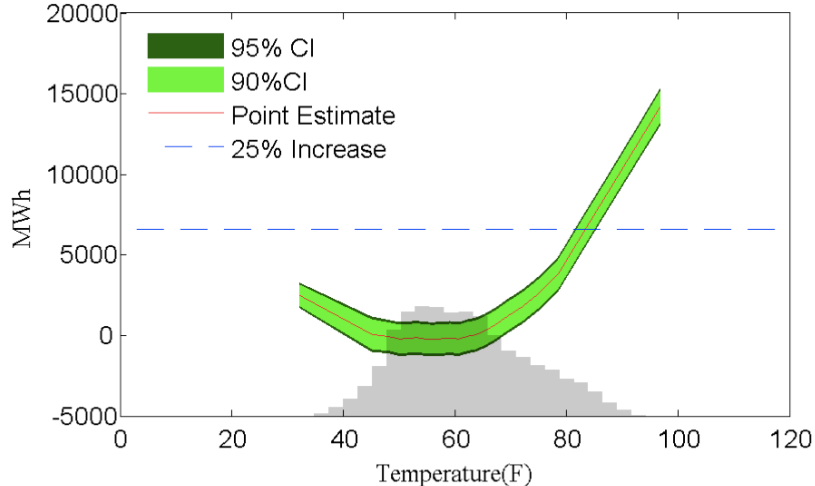
Anaheim Public Utilities Dept.



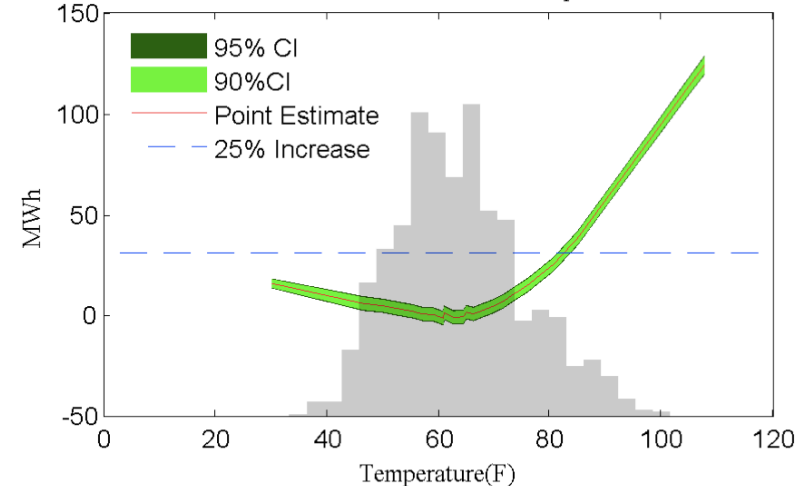
Burbank Public Service Dept.

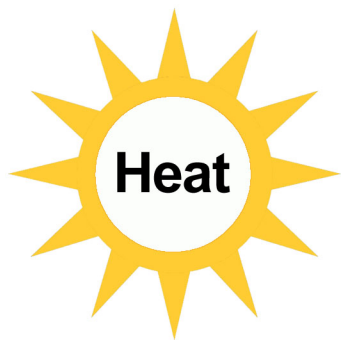


California ISO

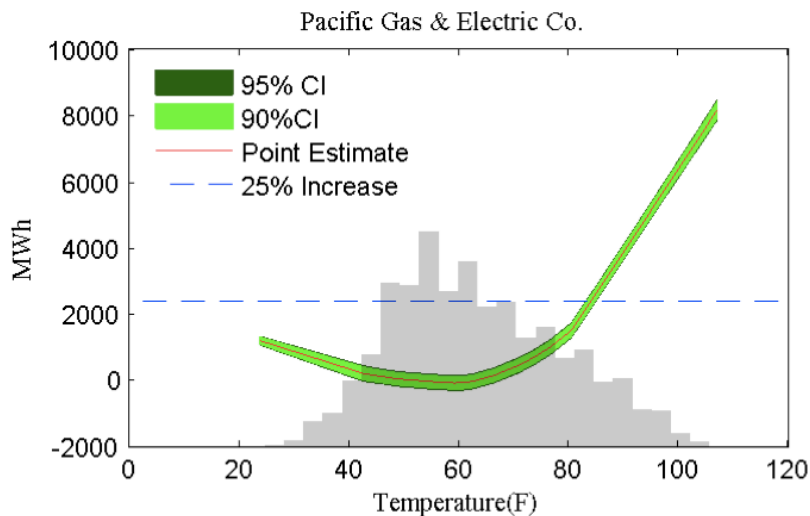
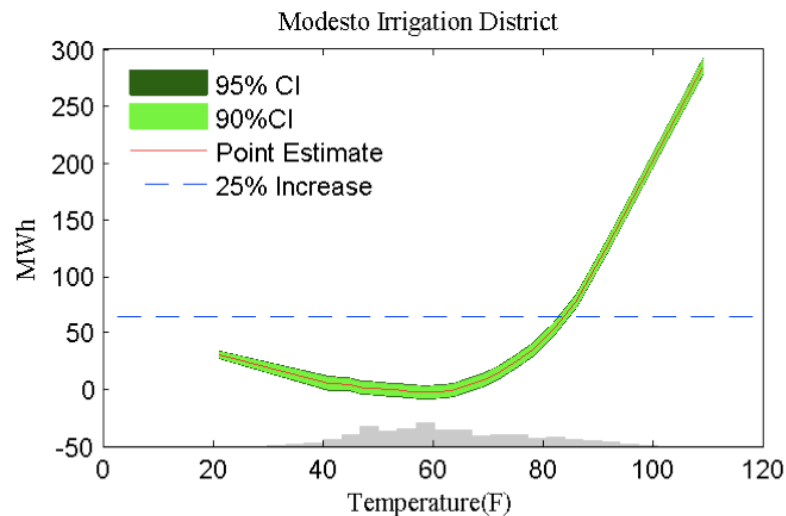
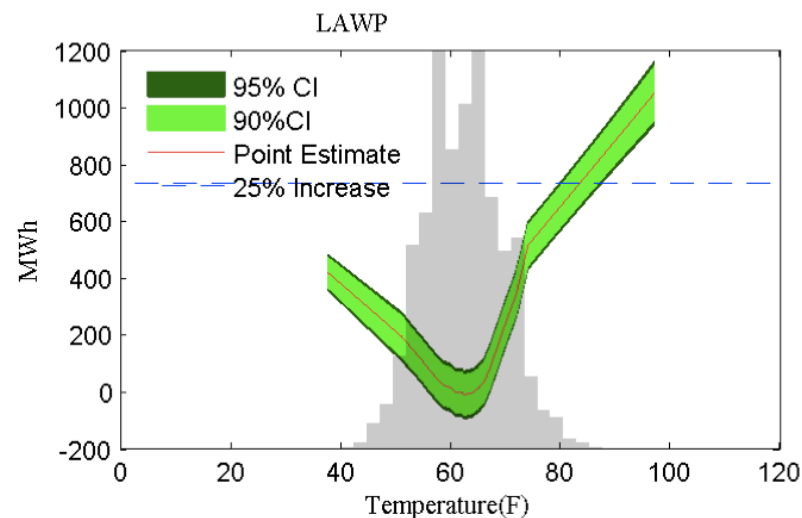
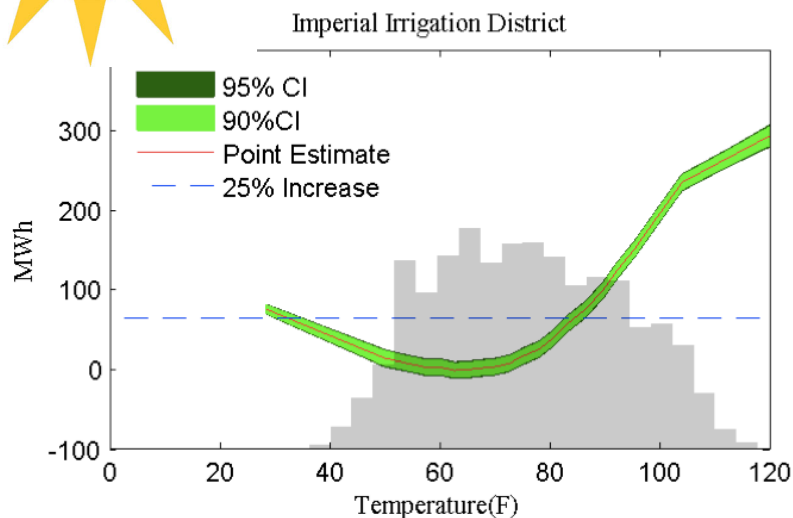


Glendale Public Service Dept.





Electricity Load and Weather



California's Residential Sector Electricity Consumption

- More than quadrupled since 1960
- Share in total consumption increased from 26% to 34%.
- Consumption equivalent to total consumption of Finland, Argentina or half of Mexico
- Provided by three major investor owned utilities (SCE, SDG&E, PG&E) and over 100 municipal utilities.

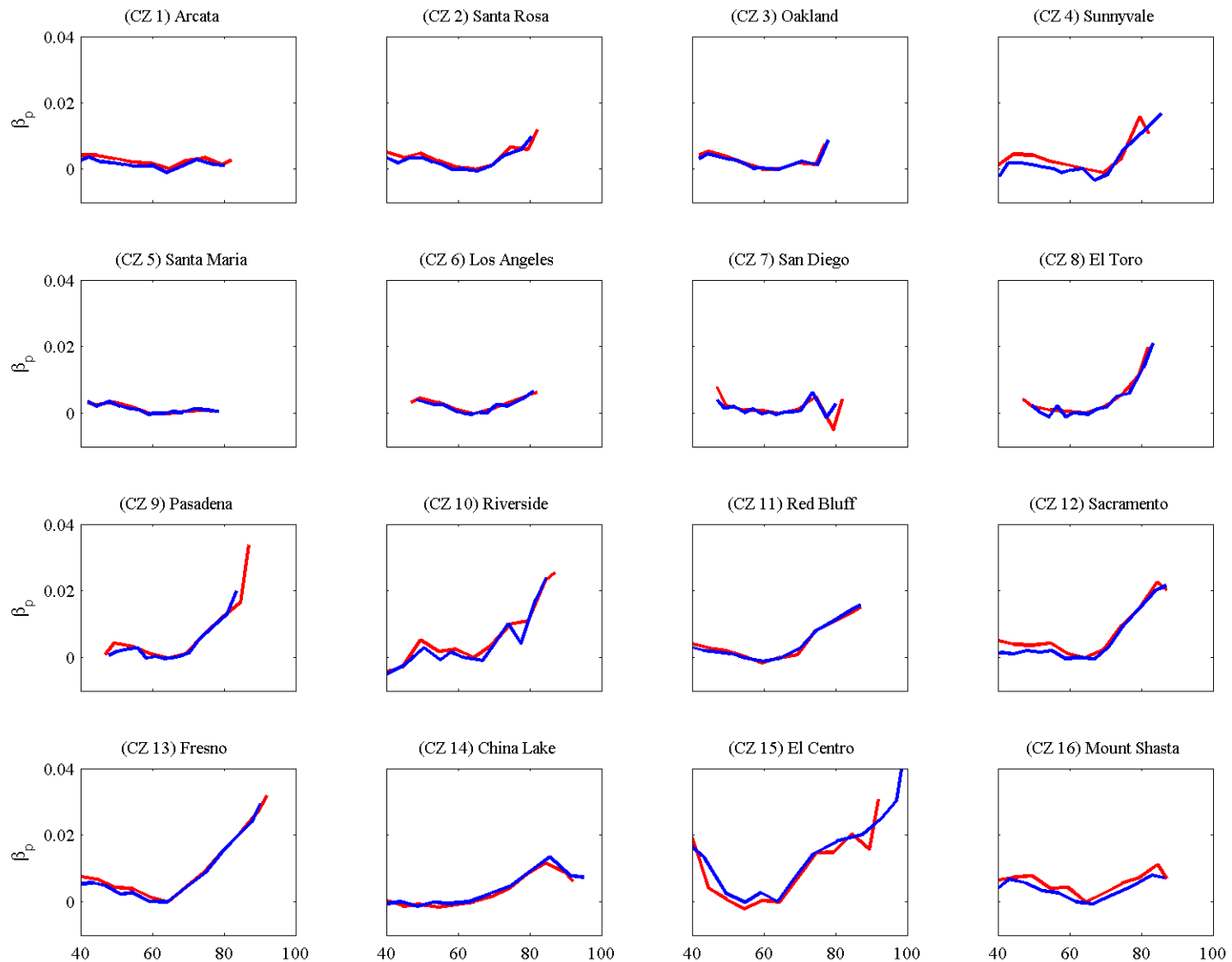
Our Approach

- Use random fluctuations in weather to estimate temperature response of residential electricity consumption.
- Use flexible functional form of temperature response.
- Allow for geographically differentiated temperature response
- Simulate future household and aggregate demand under different climate, price and population scenarios

Billing Data

- Complete residential billing data for California's investor owned utilities (thanks to UCEI/CSEM).
- ~80% of all California households from 2003-2006
- Separate out CARE households
- Limit to households with 25-35 day billing cycle
- Drop bills with daily consumption less than 2 Kwh and more than 80 Kwh
- Randomly sample data by zip code

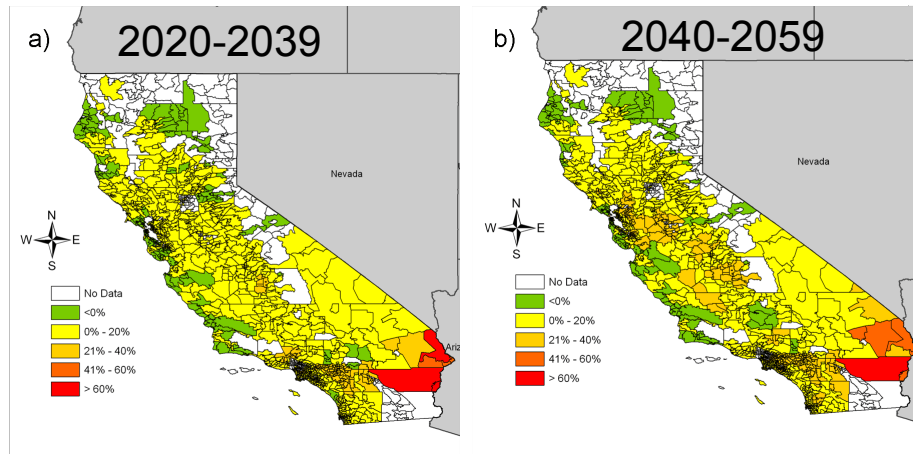
Temperature Response of residential electricity consumption is spatially heterogeneous



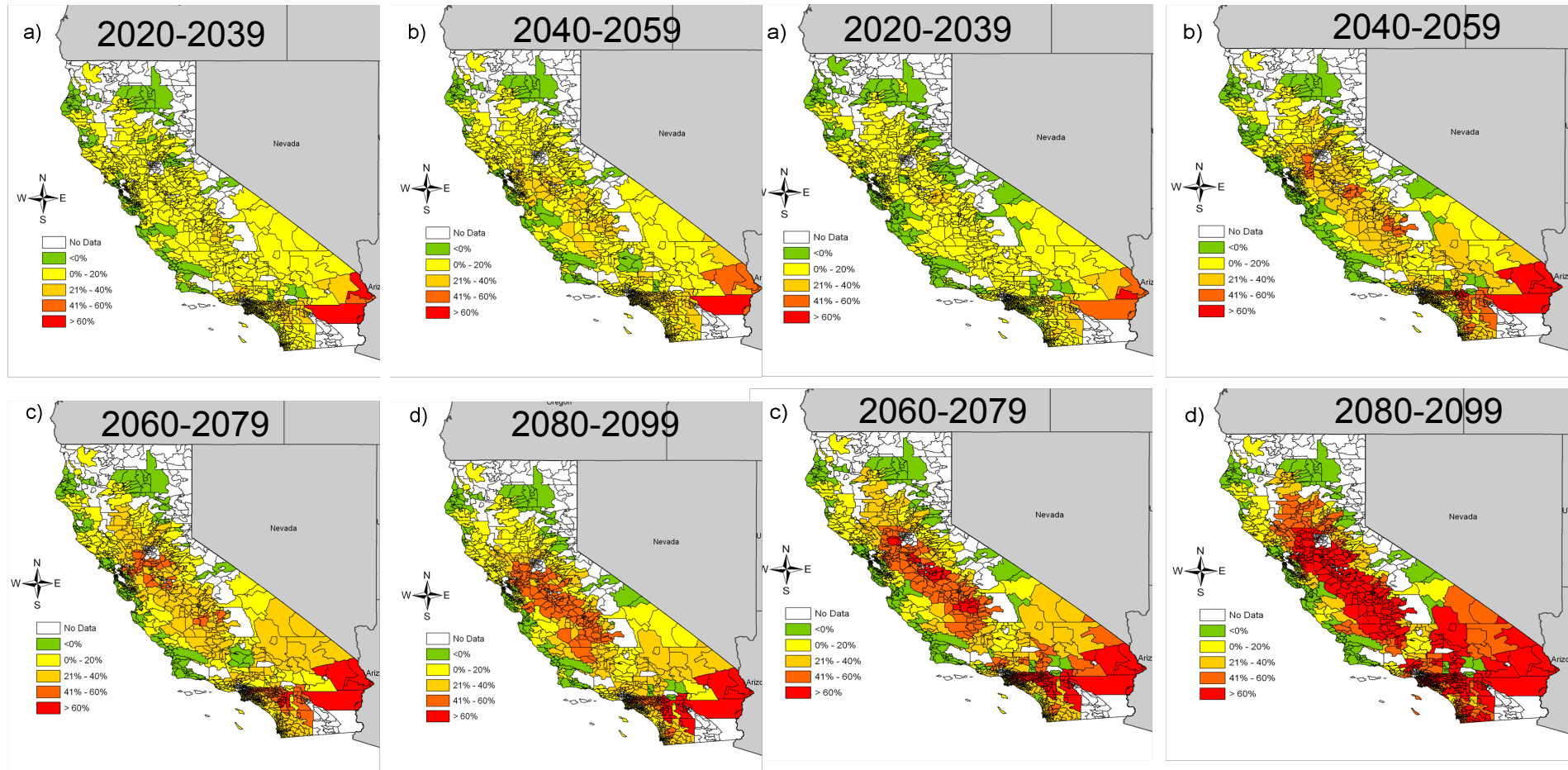
Source: Auffhammer and Aroonuegsawat (2011)

So are impacts on household consumption.

Household Impacts (NCAR PCM, B1)



Household Impacts (NCAR PCM, A2)



Simulation: Climate Only

weighted average increase in household electricity consumption using the number of households by zip code as weights.

Bin Type		Equidistant				Percentile			
Downscaling		BCSD		CA		BCSD		CA	
IPCC Scenario		A2	B1	A2	B1	A2	B1	A2	B1
	Price Increase								
2000-19	±0%	5%	2%	5%	3%	6%	3%	5%	3%
2020-39	±0%	5%	8%	7%	8%	6%	9%	7%	8%
2040-59	±0%	15%	9%	17%	10%	17%	11%	17%	10%
2060-79	±0%	24%	15%	28%	16%	28%	17%	28%	16%
2080-99	±0%	48%	18%	50%	20%	55%	21%	50%	20%

Constant Price/Population Scenario

Downscaling

BCSD

IPCC Scenario

A2

B1

Price Increase

2000-19	$\pm 0\%$	5%	2%
2020-39	$\pm 0\%$	5%	8%
2040-59	$\pm 0\%$	15%	9%
2060-79	$\pm 0\%$	24%	15%
2080-99	$\pm 0\%$	48%	18%

30% Higher Price Scenario

Downscaling		BCSD	
IPCC Scenario		A2	B1
Price Increase			
2000-19	±0%	5%	2%
2020-39	+30%	-6%	-3%
2040-59	+30%	3%	-2%
2060-79	+30%	11%	3%
2080-99	+30%	33%	6%

30%/30% Higher Price Scenario

Downscaling		BCSD	
IPCC Scenario		A2	B1
Price Increase			
2000-19	±0%	5%	2%
2020-39	+30%	-6%	-3%
2040-59	+60%	-9%	-13%
2060-79	+60%	-1%	-9%
2080-99	+60%	18%	-6%

Constant Price/Population Scenario

Downscaling

BCSD

IPCC Scenario

A2

B1

Price Increase

2000-19	±0%	5%	2%
2020-39	±0%	5%	8%
2040-59	±0%	15%	9%
2060-79	±0%	24%	15%
2080-99	±0%	48%	18%

Low Population Growth Scenario

Downscaling		BCSD	
IPCC Scenario		A2	B1
Price Increase			
2000-19	±0%	17%	13%
2020-39	±0%	31%	34%
2040-59	±0%	48%	41%
2060-79	±0%	66%	52%
2080-99	±0%	113%	65%

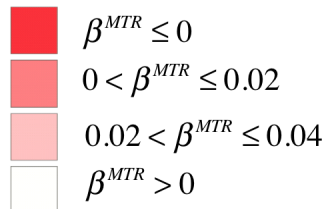
Medium Population Growth Scenario

Downscaling		BCSD	
IPCC Scenario		A2	B1
Price Increase			
2000-19	±0%	19%	15%
2020-39	±0%	48%	52%
2040-59	±0%	99%	88%
2060-79	±0%	154%	133%
2080-99	±0%	258%	179%

High Population Growth Scenario

Downscaling		BCSD	
IPCC Scenario		A2	B1
Price Increase			
2000-19	±0%	23%	19%
2020-39	±0%	64%	68%
2040-59	±0%	135%	123%
2060-79	±0%	240%	212%
2080-99	±0%	464%	342%

Maximum Temperature Response at ZIP Code Level

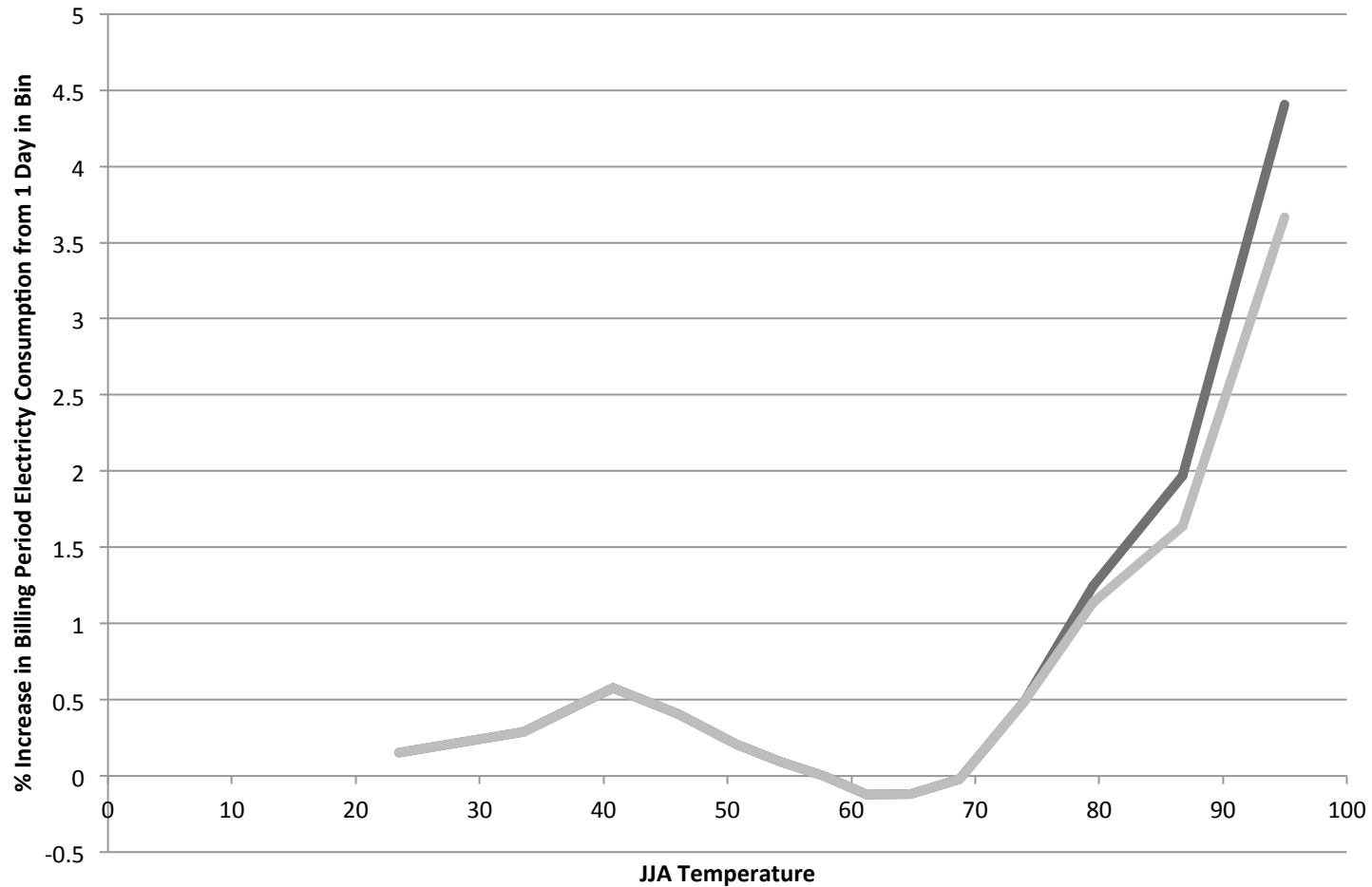


Decomposing Maximum Temperature response

	(1)	(2)	(3)	(4)	(5)	(6)
JJA Temp	0.357*** (0.039)	0.361*** (0.039)	0.386*** (0.042)	0.385*** (0.041)	0.380*** (0.041)	0.321*** (0.036)
Elevation		-0.000 (0.000)	-0.000 (0.000)	-0.000 (0.000)	-0.000 (0.000)	-0.000** (0.000)
Household Income			0.239*** (0.066)	0.235*** (0.066)	0.245*** (0.070)	0.279*** (0.087)
Population				0.000 (0.000)	0.000 (0.000)	0.000 (0.000)
Share White					0.686 (1.152)	1.394 (0.856)
Share Latino					0.658 (0.899)	1.902** (0.772)
Share Afr. Am.					0.474 (1.567)	2.287 (1.574)
Constant	-5.800*** (0.856)	-5.758*** (0.859)	-7.514*** (1.111)	-7.554*** (1.124)	-8.154*** (1.533)	-7.704*** (1.373)
Observations	1,337	1,337	1,337	1,337	1,337	661
R-squared	0.075	0.076	0.087	0.088	0.088	0.138

Notes: Robust standard errors in parentheses. *** p<0.01, ** p<0.05, * p<0.1

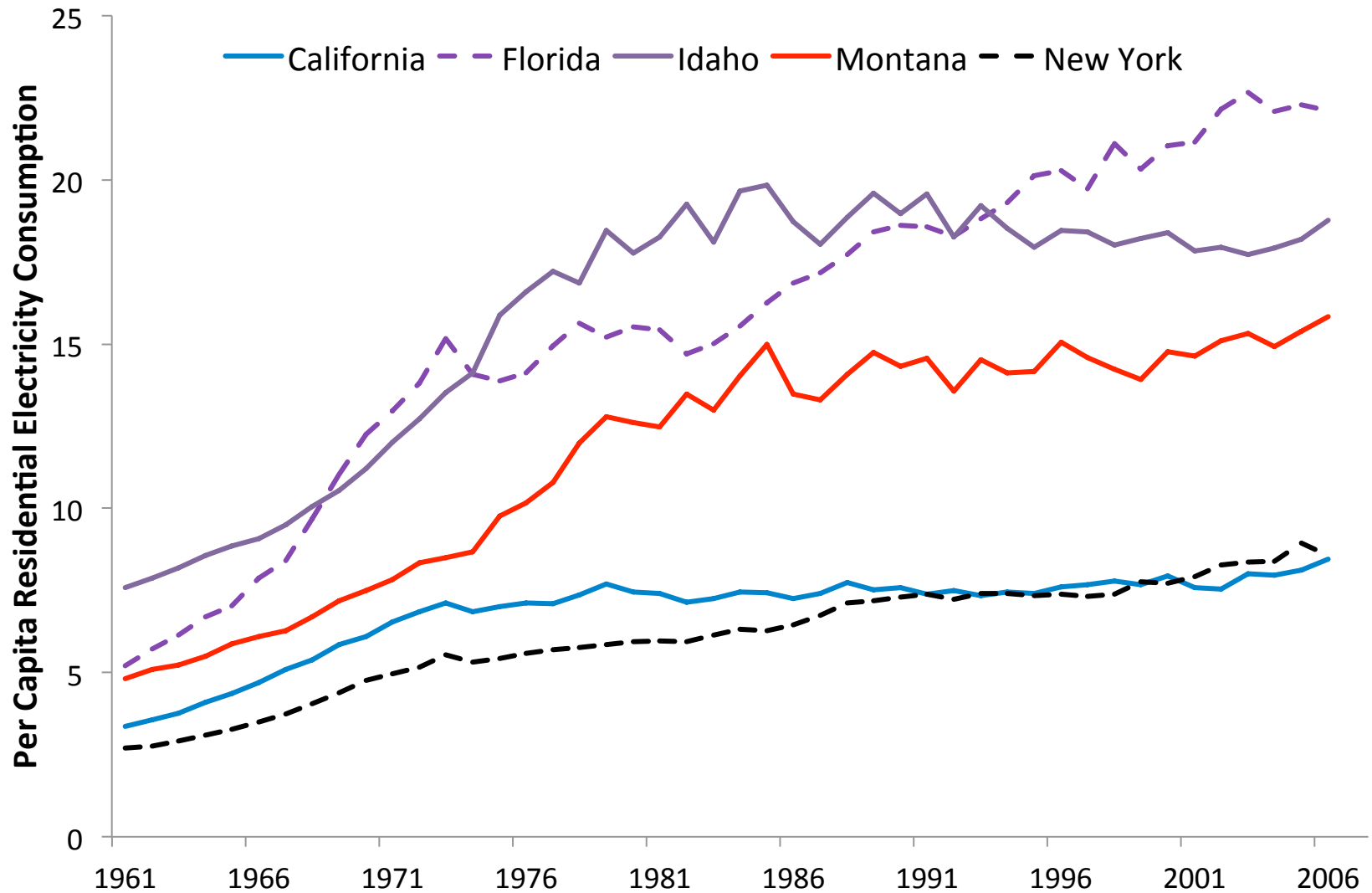
Temperature Response with Climate Change



The crucial importance of energy efficiency.

- California's goal: By 2050 reduce GHG emissions by 80%
- People live in bigger and more temperature responsive homes
- Fight this trend by:
 - Requiring more efficient buildings
 - Mandating more efficient appliances
 - Smarter Urban Planning
 - Increase share of Carbon neutral renewables.

The Rosenfeld Curve



The road ahead

- Policy makers need to design policies now that provide incentives to commit to the right emissions path.
- Researchers need to better understand what makes people “make the right choice”
- Where should public dollars go? R&D? Into Solar PV on roofs?
- Better understand adaptation.

Thank you.

Questions?
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