



# Release of Updated ICE Calculator: Phase 1

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August 4, 2025



### ICE Calculator 2.0 research team









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### **Agenda**

- ☐ Motivation for updating the ICE Calculator
- ☐ ICE Calculator is being updated in at least three phases
- ☐ Surveying approach and results
- Modeling approach and results
- □ ICE Calculator website and API
- ☐ Simple comparison of ICE 2.0 to 1.0





# **Motivation for updating** the ICE Calculator



### ICE Calculator estimates customer costs of shorter duration interruptions

- □ Berkeley Lab's Interruption Cost Estimate (ICE) Calculator is the leading and only publicly-available tool for estimating the customer cost impacts of power interruptions
- ☐ Development of the ICE Calculator was sponsored by the U.S. Department of Energy Office of Electricity
- ☐ ICE Calculator is being used to:
  - ☐ Support internal utility reliability planning activities
  - ☐ Provide a basis for discussing utility reliability investments with regulators
  - ☐ Assess the economic impact of past power outages







### **Motivation for updating the ICE Calculator**

- ☐ The original ICE Calculator, ICE 1.0, is based on utility-sponsored customer surveys
- ☐ Reliance on ICE 1.0 has been challenged because the surveys are:
  - Dated—many of the surveys are 25+ years old
  - □ Not statistically representative of all regions of the U.S.
  - ☐ Limited survey data available for estimating the cost of interruptions over 12 hours

Summary of ICF 1.0 Surveys

	Number of Observations					
Utility Company	Survey Year	Medium and Large C&I	Small C&I	Residential	Min. Duration (Hours)	Max. Duration (hours)
Southeast-1	1997	9	0		0	1
Southeast-2	1993	3,926	1,559	3,107	0	4
Southeast-2	1997	3,055	2,787	3,608	0	12
Southeast-3	1990	2,095	765		0.5	4
Southeast-3	2011	7,941	2,480	3,969	1	8
Midwest-1	2002	3,1	71		0	8
Midwest-2	1996	1,956	206		0	4
West-1	2000	2,379	3,236	3,137	1	8
	1989	2,025	5		0	4
\\/a=+ 2	1993	1,790	825	2,005	0	4
West-2	2005	3,052	3,223	4,257	0	8
	2012	5,342	4,632	4,106	0	24
Southwest	2000	3,991	2,247	3,598	0	4
Northwest-1	1989	2,210		2,126	0.25	8
Northwest-2	1999	7,091		4,299	0	12



# **Updating and upgrading the ICE Calculator**

Ber	keley Lab/Resource Innovations and sponsoring utilities have:
	Created a Project Executive Committee (PEC) made up of the sponsoring utilities
	Created a Project Advisory Committee (PAC) made up of well-known external stakeholders
	Received key feedback and/or approvals from PEC and PAC throughout the Initiative
	Developed a consistent set of short duration (up to 24 hours) customer interruption cost surveys
	Coordinated consistent administration of surveys
	Developed new short duration customer damage function (CDF) equations with new
	survey information
	Updated the ICE Calculator website including new enhancements





# ICE Calculator is being updated in phases

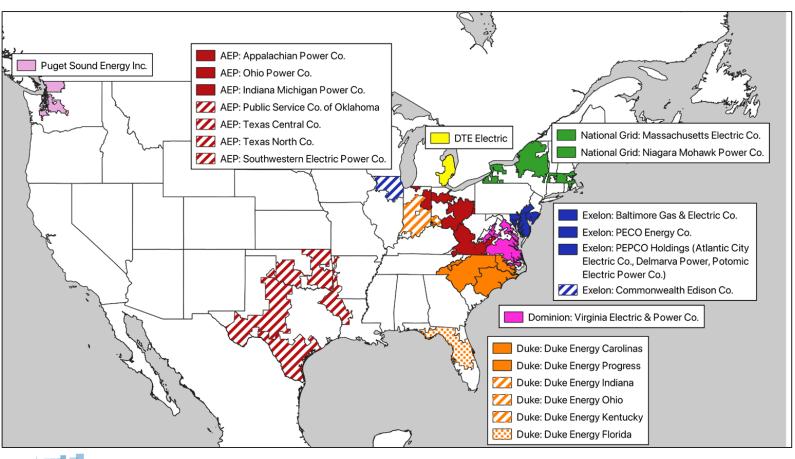


# **Update of ICE Calculator happening in phases**

Phase 1 (complete)
☐ Based on 11 surveys conducted in Eastern and Midwestern U.S., with one utility in
the Pacific Northwest
☐ ICE 2.0 version of ICE Calculator released April 28, 2025
☐ Updated customer damage functions
Upgraded web interface with enhanced capabilities
Phase 2 (in process)
☐ Surveying in process (California investor-owned utilities and Missouri utilities)
☐ ICE Calculator update expected late 2025/early 2026
Phase 3 (in process)
Surveying in process with select utility cooperatives in the U.S.
Surveying later this year with another Western utility
☐ Continue to find additional utility partners, especially in New England, Upper Great
Plains, Rockies, and Desert Southwest

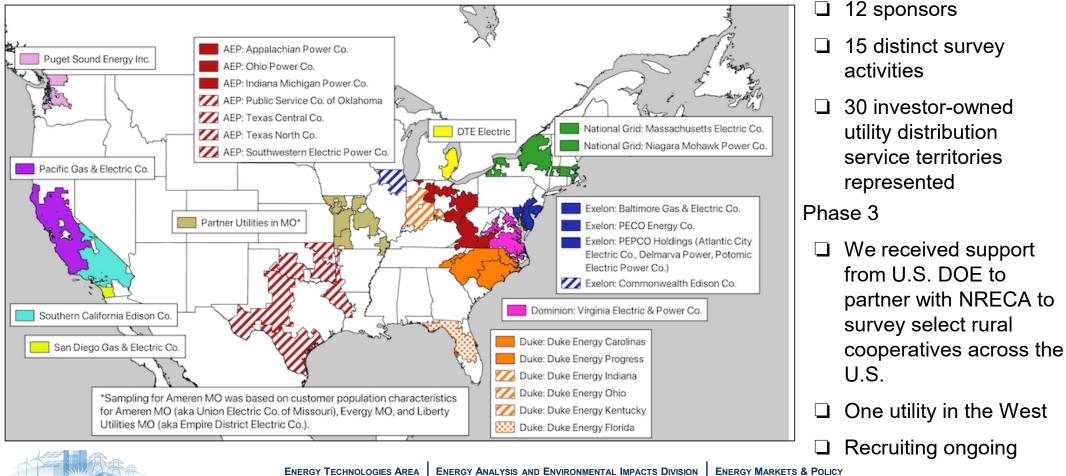


### **Participating utilities: Phase 1**



- □ 8 sponsors
- ☐ 11 distinct survey activities
- ☐ 24 investor-owned utility distribution service territories represented

### Participating utilities: Phase 1 and 2





# Surveying approach and results



# Valuation approach

Residential Customers	Non-residential Customers
Willingness-to-pay for hypothetical backup service*	Direct cost = value of lost production + interruption related costs – interruption related savings
Residential costs are often related to inconvenience.  However, potential tangible costs include:  Relocation costs	Interruption-related costs:  Labor costs to make up any lost production (which can be made up)  Labor costs to restart the production process  Material costs to restart the production process  Costs resulting from damage to input feed stocks  Costs of re-processing materials (if any)  Cost to operate backup generation equipment
<ul> <li>Buying supplies</li> <li>Going out to eat</li> <li>Inability to work</li> </ul>	Interruption-related savings:      Savings from unpaid wages during the interruption (if any)     Savings from the cost of raw materials not used because of the interruption     Savings from the cost of fuel not used     Scrap value of any damaged materials

<sup>\*</sup>One-and-one-half-bound dichotomous choice contingent valuation (Cooper, Hanemann, and Signorello 2002)



### **Survey overview**

Three different customer surveys: residential, small/medium non-residential (SMNR), and large non-
residential (LNR)

- ☐ Four interruption durations: momentary (up to 5 min), 2 hours, 8 hours, and 24 hours
- ☐ Four interruption scenarios: season, day of week, time of day, and advanced warning
- ☐ One longer duration (3 days) scenario question (not used to update the ICE Calculator)
- ☐ Target responses per survey: 250 residential, 250 SMNR, and 67 LNR
- ☐ Stratified sample of customers in each class based on usage

#### **Example set of interruption scenarios for a respondent**

Scenario	Season	Time of Week	Onset Time	Advance Warning	Duration	Pivot
А	Summer	Weekday	2:00 PM	No	5 minutes or less	Weekend
В	Summer	Weekday	2:00 PM	No	2 hours	Weekend
С	Summer	Weekday	2:00 PM	No	24 hours	Weekend



# **Survey responses: All customers**

Segment	Customer Sampling Population	Customers Sampled	Response Target	Total Responses	Overall Response Rate	Validated Responses	Validated Response Rate
Residential	22,276,695	35,743	2,750	3,316	9.3%	3,026	8.5%
Non- residential	2,141,558	90,464	3,487	4,579	5.1%	3,874	4.3%

<sup>\*</sup>Initial responses were screened for invalid, illogical, or outlier responses



# Validated survey responses

Utility	Validated Residential Responses	Validated Non-residential Responses
AEP East	314	342
AEP West	263	301
ComEd	259	369
Duke Energy Carolinas	270	404
Duke Energy Florida	267	367
Duke Energy Midwest	280	384
DTE Electric	271	351
Dominion Energy	281	288
Exelon	270	294
National Grid	275	350
PSE	276	424
Total	3,026	3,874



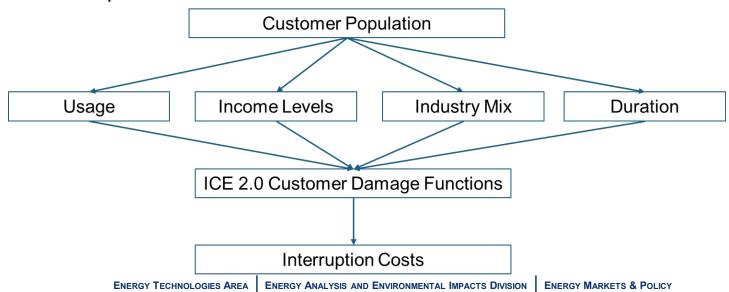


# Modeling approach and results



### Goal: Develop "customer damage functions" (CDF)

- □ LBNL/RI processed the survey responses and developed customer damage functions
- These equations correlate interruption costs to a range of explanatory variables
  - Duration, electricity consumption, income, industry types, and more
- ☐ The customer damage functions allow users to estimate interruption costs for specific customer populations
  - For example, costs could be estimated at the circuit level if the characteristics of the customers served on that specific circuit are known





### Residential model selection: Potential and selected explanatory variables

#### **Potential Model Final Model Continuous Variables Continuous Variables** Interruption duration (in minutes) Interruption duration (in minutes) Annual electricity usage (in kWh) Annual electricity usage (in kWh) GDP per kWh (collected at the state level) **Categorical Variables Categorical Variables** Season **Interruption Onset Time** Persons in Household Summer Morning 1-2 people Winter 3+ people Midday **Ownership of Backup Generation** Evening **Ownership of Backup Generation** Yes Yes Season No Summer No Winter **Work from Home Work from Home Status** Day of Week Yes Yes Model Weekday No No Selection Weekend Age of Respondent **Total Household Income Advance Warning** Under 40 years Under \$50,000 per year 40-70 years Yes \$50,000-\$100,000 per year No 70+ years \$100,000-\$150,000 per year **Previous Interruption in Last 12 Total Household Income** Over \$150,000 per year **Months** Under \$50,000 per year Yes \$50,000-\$100,000 per year No \$100,000-\$150,000 per year Over \$150,000 per year **Housing Type** Apartment/Condominium Attached Single-Family **Detached Single-Family**

Mobile Home Unknown/Other

### Non-Residential model selection: Potential and selected explanatory variables

#### **Potential Model** Continuous Variables Interruption duration (in minutes) Annual electricity usage (in kWh) GDP per kWh (collected at the state level) Categorical Variables Ownership of Backup Generation **Interruption Onset Time** Morning Yes No Midday Evening Industry Accommodation and Food Services Season Administrative and Support and Waste Summer Management and Remediation Service Winter Agriculture, Forestry, Fishing and Hunting Day of Week Weekday Arts. Entertainment, and Recreation Construction Weekend **Educational Services** Advance Warning Yes Finance and Insurance No Health Care and Social Assistance **Previous Interruption in Last 12 Months** Information (e.g., Data Centers) Yes Management of Companies and Enterprises Nο Manufacturing Mining, Quarrying, and Oil and Gas Extraction Other Services Professional, Scientific, and Technical Services Public Administration Real Estate and Rental and Leasing Retail Trade Transportation and Warehousing Utilities

Wholesale Trade

#### **Final Model**

#### **Continuous Variables** Interruption duration (in minutes)

Annual electricity usage (in kWh)

#### **Categorical Variables**

- **Advance Warning** Yes
  - No

#### Day of Week (Probit Only)

- Weekday
- Weekend

#### Industry (GLM Model Only)

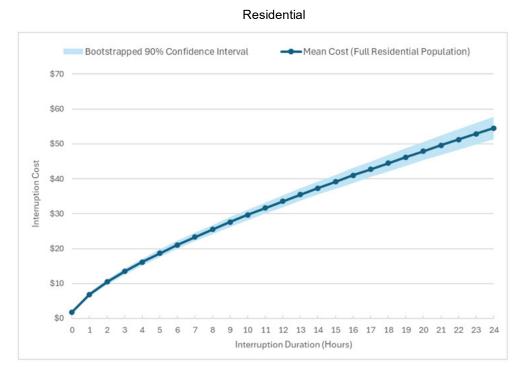
- Health Care and Social Assistance
- Manufacturing
- All other industries
- For modeling purposes, the SMNR and LNR responses were combined into one non-res segment
- ☐ The single non-res model can estimate costs for all customer segmentations, regardless of size
- Users can input usage values into the tool that align with their jurisdictions definition of "small", "medium", or "large" customers

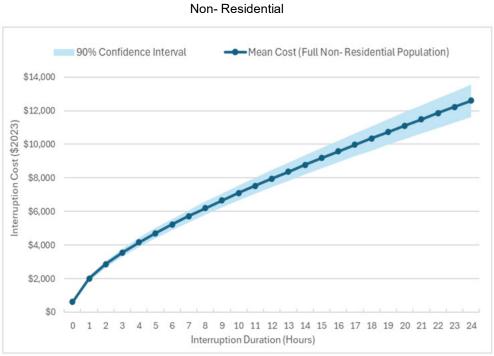


Model

Selection

### Predicted interruption costs by duration (default values; 90% confidence)

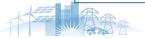




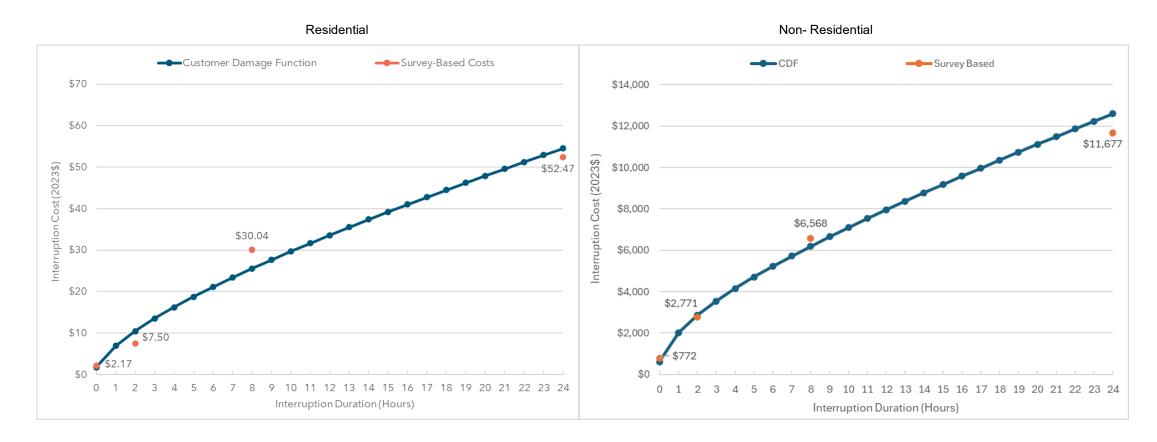


# Modeled results (2023\$)

Duration of Power Interruption Event	Cost per Event	Cost per kW	Cost per Unserved kWh	Cost per CMI	
	Resid	ential			
Momentary	\$1.80	\$1.50	\$18.03	\$0.36	
2 Hours	\$10.49	\$8.62	\$4.31	\$0.09	
8 Hours	\$25.55	\$21.21	\$2.65	\$0.05	
24 Hours	\$54.52	\$44.76	\$1.86	\$0.04	
	Non-residential				
Momentary	\$609	\$43	\$521	\$122	
2 Hours	\$2,839	\$202	\$101	\$24	
8 Hours	\$6,172	\$440	\$55	\$13	
24 Hours	\$12,646	\$902	\$38	\$9	



### CDF vs. survey-based interruption costs



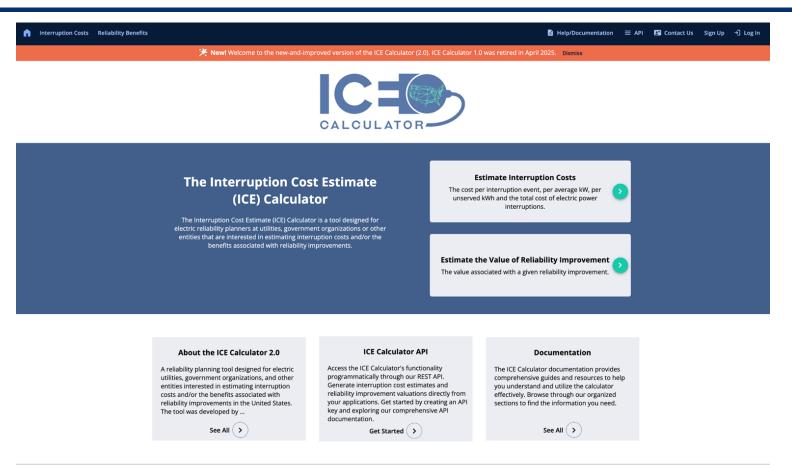




# ICE Calculator website and API



### ICE 2.0 website: <a href="https://icecalculator.com/">https://icecalculator.com/</a>



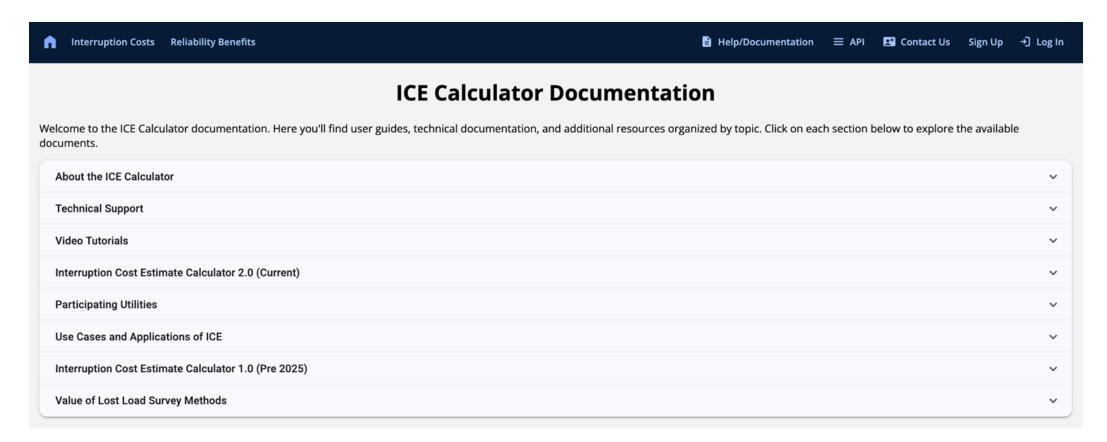








### **Help/Documentation page**

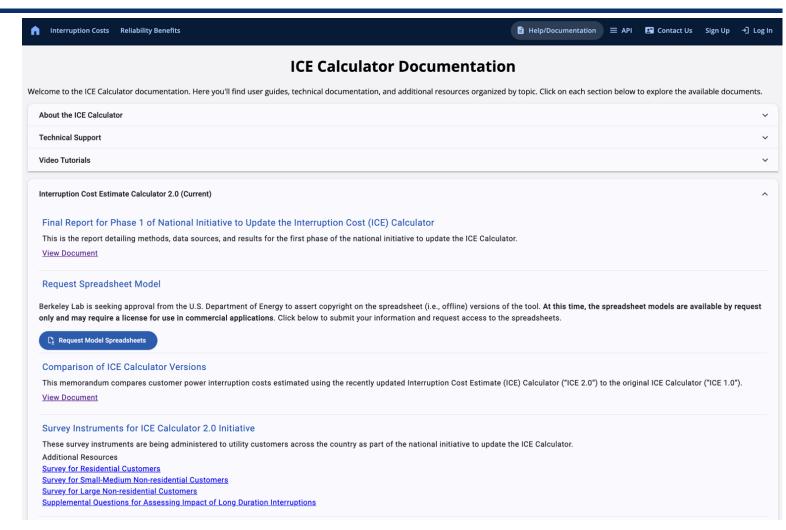




### Request spreadsheet model (non-commercial use only)

- □ Users can request spreadsheet-based version of ICE 2.0
- ☐ We are sharing these on a case-by-case basis
- ☐ Spreadsheets will be made available if not shared outside of organization and not used for commercial purposes
- ☐ ICE 1.0 spreadsheet is available on website

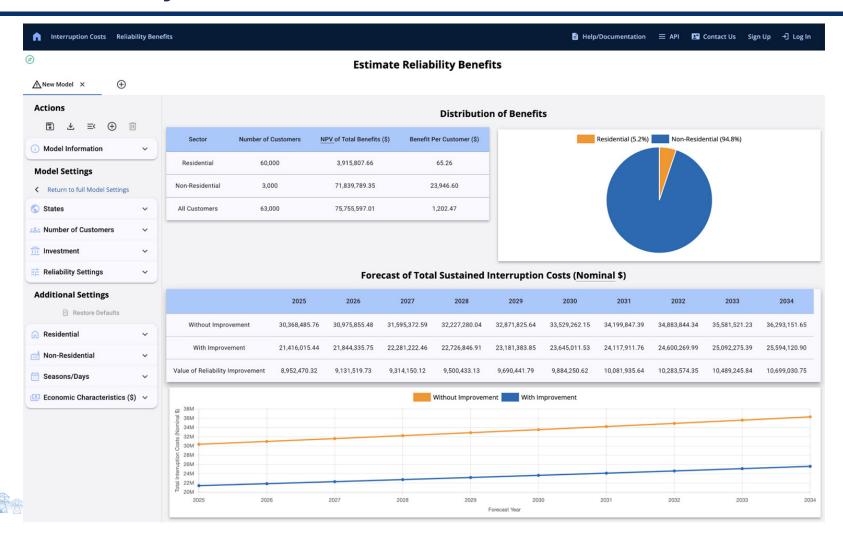




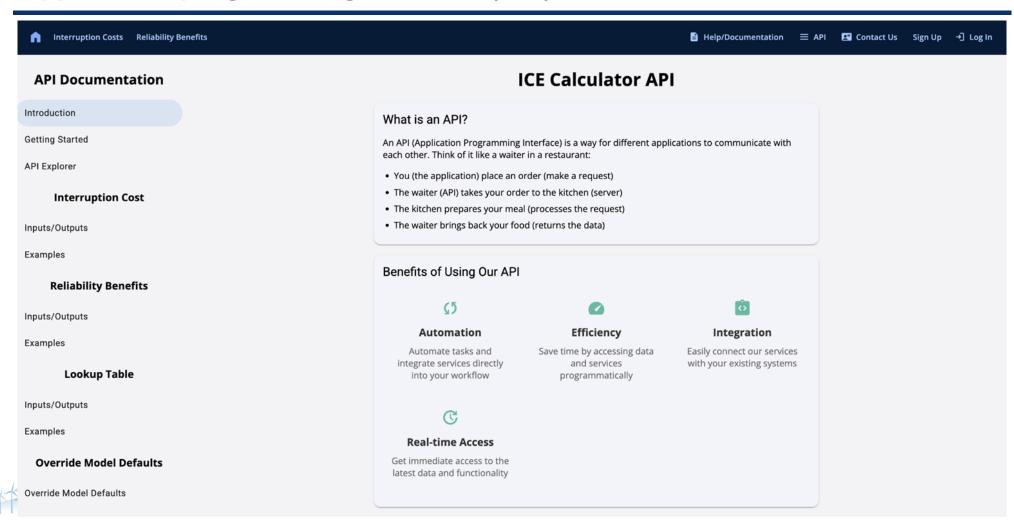
### **Estimate interruption costs**



### **Estimate reliability benefits**



### **Application programming interface (API)**





# Comparison of ICE 2.0 to 1.0



# Summary of differences between ICE 1.0 and 2.0

	ICE 1.0	ICE 2.0
Surveys Conducted (Years)	• 1989-2012	• 2022-2024 (Phase 1)
Survey Approach	<ul> <li>Administered independently</li> <li>Information on sample designs and recruitment procedures not available</li> <li>Different surveys with different questions</li> </ul>	<ul> <li>LBNL/Resource Innovations (RI) administered in a fully coordinated manner</li> <li>Consistent sample designs and recruitment procedures</li> <li>Identical set of survey questions</li> <li>One-and-one-half-bound dichotomous choice contingent valuation (residential)</li> </ul>
Geographic Coverage	<ul> <li>15 distinct surveying efforts conducted across 10 utility service territories</li> <li>Mostly conducted in western and southeastern U.S.</li> </ul>	<ul> <li>11 distinct survey activities conducted across 24 utility service territories</li> <li>Eastern and midwestern U.S. as well as the pacific northwest (future phases will include additional regional representation)</li> </ul>
Interruption Durations Considered	Varied and generally limited to 12 hrs or less	Momentary (lasting up to 5 min), 2 hrs, 8 hrs, and 24 hrs
Customer Damage Functions	<ul><li>Residential</li><li>Small non-residential</li><li>Medium/large non-residential</li></ul>	Residential     Non-residential



# Interested in Joining Initiative?



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ICE 2.0: Technical Support (link)

ICE 2.0: National Report Documenting Phase 1 (link)

Comparison of ICE 2.0 to 1.0 (link)

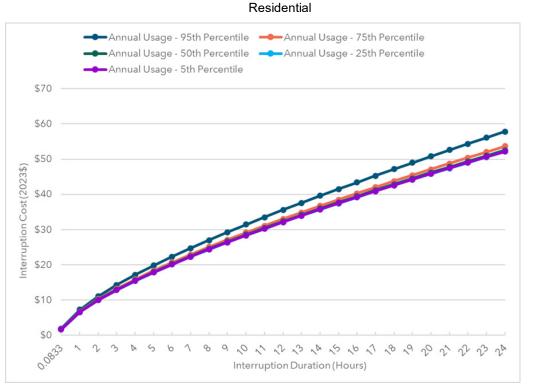


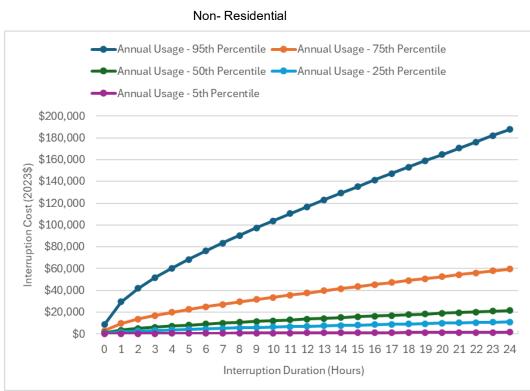
# **Explanatory variables included in the CDFs**

Residential	Non-residential			
Residential	Probit	GLM		
Duration of Interruption**	Duration of Interruption**	Duration of Interruption**		
Annual kWh Usage**	Annual kWh Usage**	Annual kWh Usage**		
Season**	Day of Week**	Percentage of Customers Given Advance Warning**		
Percentage of Customers with Backup Generators**	Percentage of Customers Given Advance Warning**	Percentage of Customers in the Manufacturing Industry**		
Percentage of Customers Working From Home*	-	Percentage of Customers in the Health Care Industry**		
Annual Household Income**	-	-		

<sup>\*</sup> significant at p < 0.05
\*\* significant at p < 0.01

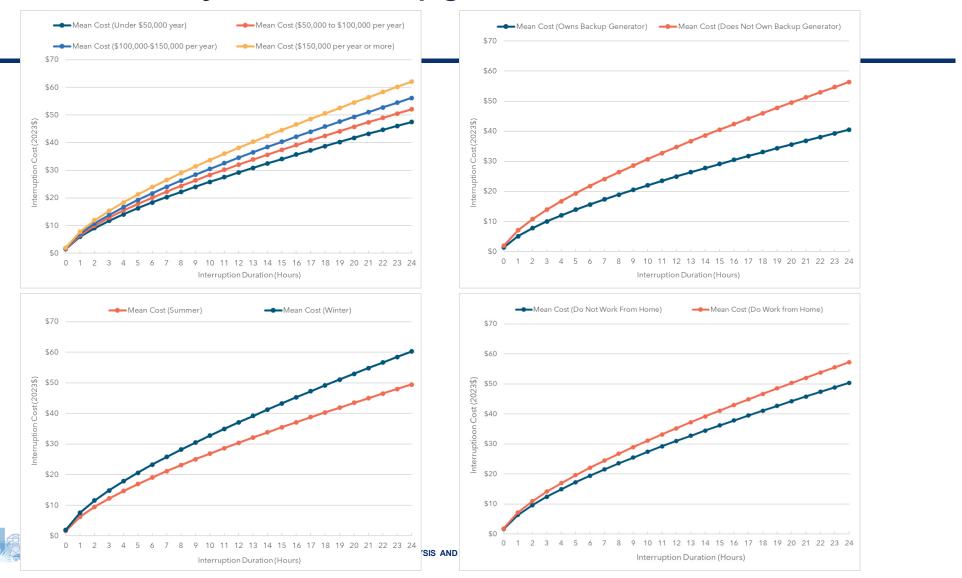
### Interruption costs by annual usage (consumption)







### Residential cost by income, backup generator, season, and work from home



### Non-residential costs by day of week, industry, and advanced warning

