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Data Article

# Data on major power outage events in the continental U.S.

### Sayanti Mukherjee<sup>a,\*</sup>, Roshanak Nateghi<sup>b</sup>, Makarand Hastak<sup>c</sup>

<sup>a</sup> Lyles School of Civil Engineering, Division of Construction Engineering and Management, and School of Industrial Engineering, Purdue University, West Lafayette, IN 47907, USA

<sup>b</sup> School of Industrial Engineering and Division of Environmental and Ecological Engineering, Purdue University, West Lafayette, IN 47907, USA

<sup>c</sup> Lyles School of Civil Engineering and Division of Construction Engineering and Management, Purdue University, West Lafayette, IN 47907, USA

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#### ABSTRACT

This paper presents the data that is used in the article entitled "A Multi-Hazard Approach to Assess Severe Weather-Induced Major Power Outage Risks in the U.S." (Mukherjee et al., 2018) [1]. The data described in this article pertains to the major outages witnessed by different states in the continental U.S. during January 2000-July 2016. As defined by the Department of Energy, the major outages refer to those that impacted atleast 50,000 customers or caused an unplanned firm load loss of atleast 300 MW. Besides major outage data, this article also presents data on geographical location of the outages, date and time of the outages, regional climatic information, land-use characteristics, electricity consumption patterns and economic characteristics of the states affected by the outages. This dataset can be used to identify and analyze the historical trends and patterns of the major outages and identify and assess the risk predictors associated with sustained power outages in the continental U.S. as described in Mukherjee et al. [1].

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<sup>\*</sup> Corresponding author at: Lyles School of Civil Engineering, Division of Construction Engineering and Management, and School of Industrial Engineering, Purdue University, West Lafayette, IN 47907, USA.

*E-mail addresses*: sayanti.purdue@gmail.com (S. Mukherjee), rnateghi@purdue.edu (R. Nateghi), hastak@purdue.edu (M. Hastak).

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Subject area	Risk and reliability
More specific subject area	
	Electricity service reliability
Type of data	Table, Excel file
How data was acquired	Using different publicly available datasets such as: (i) OE-417 form
	Schedule 1 published by DOE's Office of Electricity Delivery and Energy
	Reliability [2] (ii)
	U.S. Energy Information Administration (EIA) [form EIA-826 and EIA-861]
	[3]; (iii) National Oceanic and Atmospheric Administration (NOAA) and
	National Climatic Data Center (NCDC) [4]; (iv) U.S. Department of Labor;
	Bureau of Labor Statistics [5]; (v) U.S. Census Bureau.
Data format	Raw; Aggregated, Filtered
Experimental factors	Not applicable
Experimental features	Statistical analysis of the data leveraging a hybrid classification-
-	regression model to identify and estimate the influence of various pre-
	dictors attributing to increased risk of sustained power outages
Data source location	All the states in the continental U.S.
Data accessibility	Data is available within this article in the link provided

#### Value of the data

- This dataset serves as a rich repository of various information related to the major outage patterns, and characteristics of the states in the continental U.S., including their climate and topographical characteristics, electricity consumption patterns, population, and land-cover characteristics.
- This data provides valuable information that can be used to conduct future research in various paradigms, such as—state-level power outage risk maps for the continental U.S., predicting demand load loss, analyzing vulnerability of the U.S. states to frequent major power outages, and studying historical trends of major power outages.
- The aggregated and filtered data would also help the researchers to test various types of hypothesis of their interest in the future, especially in the areas of utility planning, risk management, and policy analysis.
- This dataset can be also leveraged to replicate the results corresponding to the original article following the data preparation procedures and the methodology as proposed in [1].

#### 1. Data

The data presented in this article is included in a single excel file containing 55 variables. The excel file can be accessed from the link: https://engineering.purdue.edu/LASCI/research-data/outages/out agerisks. The variable measures are given in Imperial System of Measurement. The variable descriptions are summarized in Table 1. This data contains valuable information related to the severe weather-induced major power outages and the various regional characteristics that might attribute to the growing risks of such outages.

#### 2. Experimental design, materials and methods

The data on major power outages and the characteristics of the regions witnessing the outages were obtained from various publicly available data sources such as the: (i) OE-417 form

Table 1	
Variable	descriptions.

Variable types	Variable names	Description
GENERAL INFORMAT	ION	
Time of the outage	YEAR	Indicates the year when the outage event occurred
event	MONTH	Indicates the month when the outage event occurred
Geographic areas	U.SSTATE	Represents all the states in the continental U.S.
	POSTAL.CODE	Represents the postal code of the U.S. states
	NERC.REGION	The North American Electric Reliability Corporation (NERC) regions involve
		in the outage event
REGIONAL CLIMATE	INFORMATION	
U.S. Climate regions	CLIMATE.REGION	U.S. Climate regions as specified by National Centers for Environmental
•		Information (nine climatically consistent regions in continental U.S.A.)
El Niño/La Niña	ANOMALY.LEVEL	This represents the oceanic El Niño/La Niña (ONI) index referring to the col
		and warm episodes by season. It is estimated as a 3-month running mean
		ERSST.v4 SST anomalies in the Niño 3.4 region (5°N to 5°S, 120-170°W) [6
	CLIMATE.CATEGORY	This represents the climate episodes corresponding to the years. The cate-
		gories-"Warm", "Cold" or "Normal" episodes of the climate are based on a
		threshold of $\pm$ 0.5 °C for the Oceanic Niño Index (ONI)
OUTAGE EVENTS INF	ORMATION	
	OUTAGE.START.DATE	This variable indicates the day of the year when the outage event started (a
information		reported by the corresponding Utility in the region)
	OUTAGE.START.TIME	This variable indicates the time of the day when the outage event started (a
		reported by the corresponding Utility in the region)
	OUTAGE.RESTORA-	This variable indicates the day of the year when power was restored to all th
	TION.DATE	customers (as reported by the corresponding Utility in the region)
	OUTAGE.RESTORA-	This variable indicates the time of the day when power was restored to al
	TION.TIME	the customers (as reported by the corresponding Utility in the region)
Cause of the event	CAUSE.CATEGORY	Categories of all the events causing the major power outages
	CAUSE.CATEGORY.	Detailed description of the event categories causing the major power outage
	DETAIL	
	HURRICANE.NAMES	If the outage is due to a hurricane, then the hurricane name is given by th
		variable
Extent of outages	OUTAGE.DURATION	Duration of outage events (in minutes)
	DEMAND.LOSS.MW	Amount of peak demand lost during an outage event (in Megawatt) [but i
		many cases, total demand is reported]
	CUSTOMERS.	Number of customers affected by the power outage event
	AFFECTED	
	RES.PRICE	Monthly electricity price in the residential sector (cents/kilowatt-hour)
	RES.PRICE COM.PRICE	Monthly electricity price in the residential sector (cents/kilowatt-hour) Monthly electricity price in the commercial sector (cents/kilowatt-hour)
	RES.PRICE COM.PRICE IND.PRICE	Monthly electricity price in the residential sector (cents/kilowatt-hour) Monthly electricity price in the commercial sector (cents/kilowatt-hour) Monthly electricity price in the industrial sector (cents/kilowatt-hour)
Electricity price	RES.PRICE COM.PRICE IND.PRICE TOTAL.PRICE	Monthly electricity price in the residential sector (cents/kilowatt-hour) Monthly electricity price in the commercial sector (cents/kilowatt-hour) Monthly electricity price in the industrial sector (cents/kilowatt-hour) Average monthly electricity price in the U.S. state (cents/kilowatt-hour)
Electricity price Electricity	RES.PRICE COM.PRICE IND.PRICE TOTAL.PRICE RES.SALES	Monthly electricity price in the residential sector (cents/kilowatt-hour) Monthly electricity price in the commercial sector (cents/kilowatt-hour) Monthly electricity price in the industrial sector (cents/kilowatt-hour) Average monthly electricity price in the U.S. state (cents/kilowatt-hour) Electricity consumption in the residential sector (megawatt-hour)
Electricity price	RES.PRICE COM.PRICE IND.PRICE TOTAL.PRICE	Monthly electricity price in the residential sector (cents/kilowatt-hour) Monthly electricity price in the commercial sector (cents/kilowatt-hour) Monthly electricity price in the industrial sector (cents/kilowatt-hour) Average monthly electricity price in the U.S. state (cents/kilowatt-hour) Electricity consumption in the residential sector (megawatt-hour) Electricity consumption in the commercial sector (megawatt-hour)
Electricity price Electricity	RES.PRICE COM.PRICE IND.PRICE TOTAL.PRICE RES.SALES COM.SALES	Monthly electricity price in the residential sector (cents/kilowatt-hour) Monthly electricity price in the commercial sector (cents/kilowatt-hour) Monthly electricity price in the industrial sector (cents/kilowatt-hour) Average monthly electricity price in the U.S. state (cents/kilowatt-hour) Electricity consumption in the residential sector (megawatt-hour)
Electricity price Electricity	RES.PRICE COM.PRICE IND.PRICE TOTAL.PRICE RES.SALES COM.SALES IND.SALES	Monthly electricity price in the residential sector (cents/kilowatt-hour) Monthly electricity price in the commercial sector (cents/kilowatt-hour) Monthly electricity price in the industrial sector (cents/kilowatt-hour) Average monthly electricity price in the U.S. state (cents/kilowatt-hour) Electricity consumption in the residential sector (megawatt-hour) Electricity consumption in the commercial sector (megawatt-hour) Electricity consumption in the industrial sector (megawatt-hour)
REGIONAL ELECTRICI Electricity price Electricity consumption	RES.PRICE COM.PRICE IND.PRICE TOTAL.PRICE RES.SALES COM.SALES IND.SALES TOTAL.SALES	Monthly electricity price in the residential sector (cents/kilowatt-hour) Monthly electricity price in the commercial sector (cents/kilowatt-hour) Monthly electricity price in the industrial sector (cents/kilowatt-hour) Average monthly electricity price in the U.S. state (cents/kilowatt-hour) Electricity consumption in the residential sector (megawatt-hour) Electricity consumption in the industrial sector (megawatt-hour) Electricity consumption in the industrial sector (megawatt-hour) Total electricity consumption in the U.S. state (megawatt-hour)
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Electricity price Electricity	RES.PRICE COM.PRICE IND.PRICE TOTAL.PRICE RES.SALES COM.SALES IND.SALES TOTAL.SALES RES.PERCEN	Monthly electricity price in the residential sector (cents/kilowatt-hour) Monthly electricity price in the commercial sector (cents/kilowatt-hour) Monthly electricity price in the industrial sector (cents/kilowatt-hour) Average monthly electricity price in the U.S. state (cents/kilowatt-hour) Electricity consumption in the residential sector (megawatt-hour) Electricity consumption in the commercial sector (megawatt-hour) Electricity consumption in the industrial sector (megawatt-hour) Electricity consumption in the U.S. state (megawatt-hour) Total electricity consumption in the U.S. state (megawatt-hour) Percentage of residential electricity consumption compared to the total electricity consumption in the state (in %) Percentage of commercial electricity consumption compared to the total
Electricity price Electricity	RES.PRICE COM.PRICE IND.PRICE TOTAL.PRICE RES.SALES COM.SALES IND.SALES TOTAL.SALES RES.PERCEN	Monthly electricity price in the residential sector (cents/kilowatt-hour) Monthly electricity price in the commercial sector (cents/kilowatt-hour) Monthly electricity price in the industrial sector (cents/kilowatt-hour) Average monthly electricity price in the U.S. state (cents/kilowatt-hour) Electricity consumption in the residential sector (megawatt-hour) Electricity consumption in the commercial sector (megawatt-hour) Electricity consumption in the industrial sector (megawatt-hour) Total electricity consumption in the U.S. state (megawatt-hour) Percentage of residential electricity consumption compared to the total electricity consumption in the state (in %)
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Electricity price Electricity	RES.PRICE COM.PRICE IND.PRICE TOTAL.PRICE RES.SALES COM.SALES IND.SALES TOTAL.SALES RES.PERCEN COM.PERCEN IND.PERCEN	Monthly electricity price in the residential sector (cents/kilowatt-hour) Monthly electricity price in the commercial sector (cents/kilowatt-hour) Monthly electricity price in the industrial sector (cents/kilowatt-hour) Average monthly electricity price in the U.S. state (cents/kilowatt-hour) Electricity consumption in the residential sector (megawatt-hour) Electricity consumption in the commercial sector (megawatt-hour) Electricity consumption in the industrial sector (megawatt-hour) Total electricity consumption in the U.S. state (megawatt-hour) Percentage of residential electricity consumption compared to the total electricity consumption in the state (in %) Percentage of commercial electricity consumption compared to the total electricity consumption in the state (in %) Percentage of industrial electricity consumption compared to the total electricity consumption in the state (in %) Annual number of customers served in the residential electricity sector of the US, stat
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Electricity price Electricity consumption	RES.PRICE COM.PRICE IND.PRICE TOTAL.PRICE RES.SALES COM.SALES IND.SALES TOTAL.SALES RES.PERCEN COM.PERCEN IND.PERCEN RES.CUSTOMERS COM.CUSTOMERS IND.CUSTOMERS	Monthly electricity price in the residential sector (cents/kilowatt-hour) Monthly electricity price in the commercial sector (cents/kilowatt-hour) Monthly electricity price in the industrial sector (cents/kilowatt-hour) Average monthly electricity price in the U.S. state (cents/kilowatt-hour) Electricity consumption in the residential sector (megawatt-hour) Electricity consumption in the commercial sector (megawatt-hour) Electricity consumption in the industrial sector (megawatt-hour) Total electricity consumption in the U.S. state (megawatt-hour) Percentage of residential electricity consumption compared to the total electricity consumption in the state (in %) Percentage of commercial electricity consumption compared to the total electricity consumption in the state (in %) Percentage of industrial electricity consumption compared to the total electricity consumption in the state (in %) Annual number of customers served in the commercial electricity sector of the US, stat Annual number of customers served in the industrial electricity sector of the US, stat

Table 1 (continued)

Variable types	Variable names	Description	
REGIONAL ECONOMIC CHARACTERISTICS			
Economic outputs	PC.REALGSP.STATE	Per capita real gross state product (GSP) in the U.S. state (measured in 2009 chained U.S. dollars)	
	PC.REALGSP.USA	Per capita real GSP in the U.S. (measured in 2009 chained U.S. dollars)	
	PC.REALGSP.REL	Relative per capita real GSP as compared to the total per capita real GDP of the U.S. (expressed as fraction of per capita State real GDP & per capita US real GDP)	
	PC.REALGSP.CHANGE	Percentage change of per capita real GSP from the previous year (in %)	
	UTIL.REALGSP	Real GSP contributed by Utility industry (measured in 2009 chained U.S. dollars)	
	TOTAL.REALGSP	Real GSP contributed by all industries (total) (measured in 2009 chained U.S. dollars)	
	UTIL.CONTRI	Utility industry's contribution to the total GSP in the State (expressed as	
		percent of the total real GDP that is contributed by the Utility industry) (in %)	
	PI.UTIL.OFUSA	State utility sector's income (earnings) as a percentage of the total earnings	
		of the U.S. utility sector's income (in %)	
REGIONAL LAND-USE CHARACTERICS			
Population	POPULATION	Population in the U.S. state in a year	
	POPPCT_URBAN	Percentage of the total population of the U.S. state represented by the urban population (in $\%$ )	
	POPPCT_UC	Percentage of the total population of the U.S. state represented by the population of the urban clusters (in $\%$ )	
	POPDEN_URBAN	Population density of the urban areas (persons per square mile)	
	POPDEN_UC	Population density of the urban clusters (persons per square mile)	
	POPDEN_RURAL	Population density of the rural areas (persons per square mile)	
Land area	AREAPCT_URBAN	Percentage of the land area of the U.S. state represented by the land area of the urban areas (in $\%$ )	
	AREAPCT_UC	Percentage of the land area of the U.S. state represented by the land area of the urban clusters (in %)	
	PCT_LAND	Percentage of land area in the U.S. state as compared to the overall land area in the continental U.S. (in $\%$ )	
	PCT_WATER_TOT	Percentage of water area in the U.S. state as compared to the overall water area in the continental U.S. (in %)	
	PCT_WATER_INLAND	Percentage of inland water area in the U.S. state as compared to the overall inland water area in the continental U.S. (in %)	

Note: "NA" in the data file indicates that data was not available.

Schedule 1 published by DOE's Office of Electricity Delivery and Energy Reliability [2] (ii) U.S. Energy Information Administration (EIA) [form EIA-826 and EIA-861] [3]; (iii) National Oceanic and Atmospheric Administration (NOAA); (iv) National Climatic Data Center (NCDC); (v) U.S. Department of Labor; Bureau of Labor Statistics [5]; and, (vi) U.S. Census Bureau. The data spans from January 2000 to July 2016. The various data sources were then aggregated using the year, month and the region (i.e., the U.S. state) as the nexus. The major outages are described in terms of duration of the outage event and the total number of customers affected during that event. The dataset is rigorously preprocessed and checked for inconsistencies to minimize the measurement errors leveraging different methods such as data visualization, analyzing the descriptive statistics as well as manual cross-checking of the observations.

#### Acknowledgements

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#### Transparency document. Supplementary material

Transparency data associated with this article can be found in the online version at https://doi.org/ 10.1016/j.dib.2018.06.067.

#### Appendix A. Supplementary material

Supplementary data associated with this article can be found in the online version at https://doi.org/10.1016/j.dib.2018.06.067.

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