All code, plots reside here: <a href="https://github.com/karunmj/usu-coursework/tree/master/cs5660datasc/hw/hw1">https://github.com/karunmj/usu-coursework/tree/master/cs5660datasc/hw/hw1</a> Data preprocessing involved loading the csv file as a data frame object using Pandas library in Python

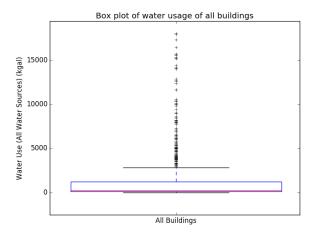
#### 1. Water usage analysis:

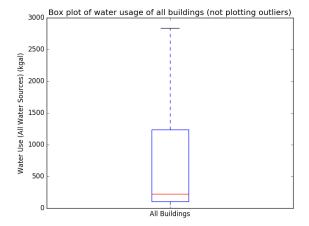
All NaN values in water usage column were replaced by the mean of available water usage data of other buildings.

### a. Water use for all buildings

Mean with outliers - 6913.163341 kgal Median with outliers - 225.0 kgal Mode with outliers - 0 and 165.0 kgal

Box plots for all building





From above plots and measures, it looks like there are a bunch of zero usage numbers. This is especially evident in the mode measure. There also seems to exist very high numbers that tend to pull the measures higher up.

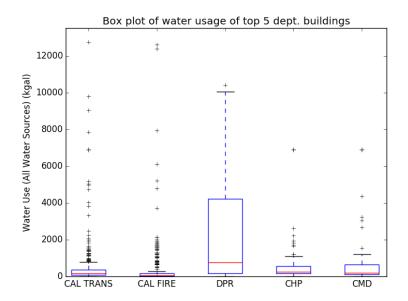
#### b. Water use for top 5 department buildings

The top 5 departments based on building numbers were found to be CAL TRANS, CAL FIRE, DPR, CHP and CMD. Their measure are as follows:

CAL TRANS - Mean = 690.53, Median=165, Mode=165

CAL FIRE - Mean =501.88, Median=58.6, Mode=51.5 DPR - Mean =2942.11, Median=762.65, Mode=165 CHP - Mean = 1344.05, Median=256.7, Mode=0, 165 CMD - Mean =772.75, Median=206.4, Mode=165

Box plot for Top 5 department buildings



From the plots and data, it looks like the top 5 depts. have similar behavior to all other buildings.

c. Removing outliers, water use for all buildings
All data that lies beyond (q1-1.5\*(q3-q1)) and (q3+1.5\*(q3-q1)), where q1 and q3 are first and third quartile have been removed as outliers.

Mean without outliers - 433.752430556 kgal Median without outliers - 165.0 kgal Mode without outliers - 165.0 kgal

d. Removing outliers, water use for top 5 department buildings

CAL TRANS - Mean = 186.9, Median=165, Mode=165

CAL FIRE - Mean =64.35, Median=51.5, Mode=51.5

DPR - Mean =2077.42, Median=700, Mode=165

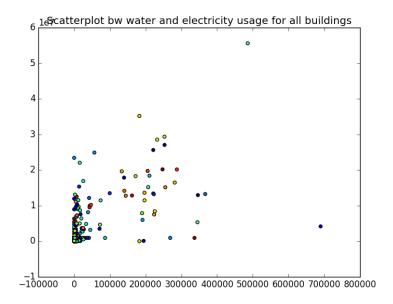
CHP - Mean = 325.9, Median=235, Mode=165

CMD - Mean =324.24, Median=165, Mode=165

Removing outliers has made the data much cleaner, especially the zeroes and the very high values have been got rid of.

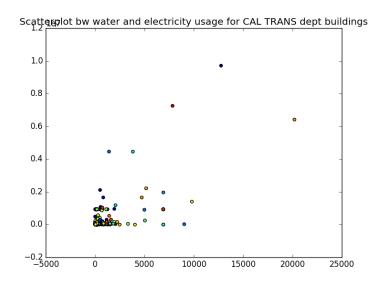
- 2. Resource usage correlation
  - a. Between all buildings

### Scatter plot



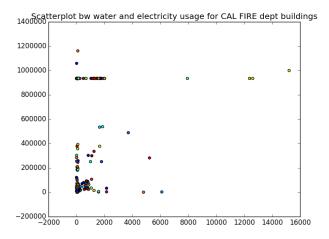
Persons correlation bw electricity and water usage - 0.6661176605002519 Since the coefficient is greater than 0, both electricity and water usage has a positive correlation, i.e. as electricity usage increase so does water.

### b. Between top 5 department buildings



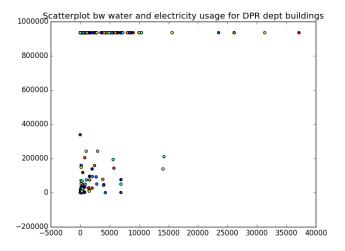
Persons correlation bw electricity and water usage for CAL TRANS buildings - 0.59746992566881985

Since the coefficient is greater than 0, both electricity and water usage has a positive correlation, i.e. as electricity usage increase so does water.



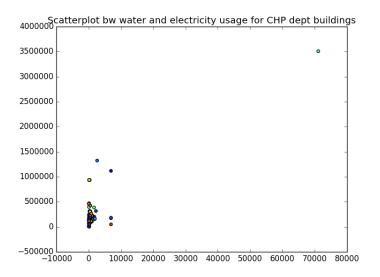
Persons correlation bw electricity and water usage for CAL FIRE buildings - 0.24978554815196741

Since the coefficient is greater than 0, both electricity and water usage has a positive correlation, i.e. as electricity usage increase so does water. However, this value is very close to 0 which indicates there exists almost no correlation.



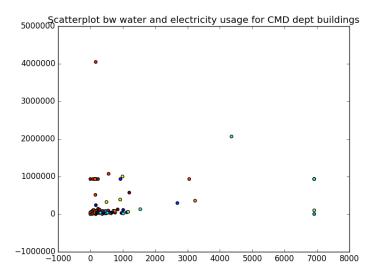
Persons correlation bw electricity and water usage for DPR buildings - 0.15380068291814197

Since the coefficient is greater than 0, both electricity and water usage has a positive correlation, i.e. as electricity usage increase so does water. However, this value is very close to 0 which indicates there exists almost no correlation.



Persons correlation bw electricity and water usage for CHP buildings - 0.8167926077097335

Since the coefficient is greater than 0, both electricity and water usage has a positive correlation, i.e. as electricity usage increase so does water. However, this value is very close to 1 which indicates there exists a likelihood of linear relationship.



Persons correlation bw electricity and water usage for CMD buildings - 0.21429228623294547

Since the coefficient is greater than 0, both electricity and water usage has a positive correlation, i.e. as electricity usage increase so does water. However, this value is very close to 0 which indicates there exists almost no correlation.

Overall, there exists a positive correlation between electricity and water usage

#### 3. Building similarities

### a. Resource usage

All the variables are of type quantitative. Just like in the first answer, any missing data is replaced with the mean of existing data.

	Manhattan		
	First	Second	Third
Mendota maintenance	OROVILLE AREA	Torrance (State	Orange (State
st.	(5710.5)	Owned)	Owned)
		(12913.64)	(15479.04)
Metropolitan state	DAA 22, SAN	PATTON STATE	MEADOWVIEW
hospital	DIEGO COUNTY	HOSPITAL	(3984573)
	FAIRGROUNDS	(3600558.56)	
	(667634.1)		
Long beach field	CSR-SLU San Luis	AMERICAN RIVER	CAJON
office	Obispo FS - 2014 E	FISH HATCHERY	MAINTENANCE
	Complete	*	STATION
	*		*

	Euclidean		
	First	Second	Third
Mendota maintenance	OROVILLE AREA	Torrance (State	FREMONT
st.	(3931.75)	Owned)	MAINTENANCE
		(10262.35)	STATION
			(13123.36)
Metropolitan state	DAA 22, SAN	PATTON STATE	MEADOWVIEW
hospital	DIEGO COUNTY	HOSPITAL	(3969122.5)
	FAIRGROUNDS	(3593816.7)	
	(578653.06)		
Long beach field	CSR-SLU San Luis	AMERICAN RIVER	925 BOLSA CHICA
office	Obispo FS - 2014 E	FISH HATCHERY	SB
	Complete	*	*
	*		

	Cosine		
	First	Second	Third
Mendota maintenance	OROVILLE AREA	Torrance (State	FERRELLGAS
st.	(7.18e-5)	Owned)	(0.0007)
		(0.0004)	
Metropolitan state	DAA 22, SAN	SOUTHERN	PATTON STATE
hospital	DIEGO COUNTY	DIVISION	HOSPITAL
	FAIRGROUNDS	HEADQUARTERS	(0.013)
	(0.0005)	(0.009)	
Long beach field	CSR-SLU San Luis	AMERICAN RIVER	CAJON
office	Obispo FS - 2014 E	FISH HATCHERY	MAINTENANCE
	Complete	*	STATION*
	(3.44e-6)		

### b. Property variables

Since the quantities involved are nominal (except for property area), these are first converted to quantitative. I have assigned a unique integer to each string element in the column. These strings are also unique (I have preprocessed the column to regard both lower and upper cases of a text as same). For example, the 'City' attribute has 642 unique entries, and each of them has been assigned an integer index to calculate similarity metrics.

	Manhattan		
	First	Second	Third
Mendota maintenance	ALAMEDA	SKYLONDA	WASCO
st.	MAINTENANCE	STORAGE	MAINTENANCE
	STATION*	*	STATION
			*
Metropolitan state	PBSP-PELICAN	LAC- CALIFORNIA	Sonoma DC
hospital	BAY STATE	STATE PRISON,	*
	PRISON	LOS ANGELES	
	*	COUNTY	
		*	
Long beach field	Chula Vista	MONTEBELLO	715 CASTLE ROCK
office	Maintenance Station	OFFICE BUILDING	SP
	*	*	*

	Euclidean		
	First	Second	Third
Mendota maintenance	ALAMEDA	SKYLONDA	WASCO
st.	MAINTENANCE	STORAGE	MAINTENANCE
	STATION	*	STATION
	*		*
Metropolitan state	PBSP-PELICAN	LAC- CALIFORNIA	Sonoma DC
hospital	BAY STATE	STATE PRISON,	*
	PRISON	LOS ANGELES	
	*	COUNTY	
		*	
Long beach field	Chula Vista	715 CASTLE ROCK	MONTEBELLO
office	Maintenance Station	SP	OFFICE BUILDING
	*	*	*

	Cosine		
	First	Second	Third
Mendota maintenance	1510 O ST DON	BIG SYCAMORE	17TH STREET
st.	CARLOS	MAINTENANCE	COMMONS/MIXED
	APARTMENTS	STATION	USE
Metropolitan state	DAA 22, SAN	CIM-CALIFORNIA	KVSP-KERN
hospital	DIEGO COUNTY	INSTITUTION FOR	VALLEY STATE
	FAIRGROUNDS	MEN	PRISON
Long beach field	BELL GARDENS	Pomona (Park)	BUTTONWILLOW
office	OFFICE BUILDING	Armory (State	AREA
		Owned) (Asset	
		Mana	

c. Resource usage and property variables

	Manhattan		
	First	Second	Third
Mendota maintenance	OROVILLE AREA	FREMONT	MANZANITA
st.		MAINTENANCE	MAINTENANCE
		STATION	STATION
Metropolitan state	DAA 22, SAN	PATTON STATE	DMV HQ Campus -
hospital	DIEGO COUNTY	HOSPITAL	East Building
	FAIRGROUND		
Long beach field	AMERICAN RIVER	CAJON	925 BOLSA CHICA
office	FISH HATCHERY	MAINTENANCE	SB
		STATION	

	Euclidean		
	First	Second	Third
Mendota maintenance	OROVILLE AREA	FREMONT	MANZANITA
st.		MAINTENANCE	MAINTENANCE
		STATION	STATION
Metropolitan state	DAA 22, SAN	PATTON STATE	MEADOWVIEW
hospital	DIEGO COUNTY	HOSPITAL	
	FAIRGROUND		
Long beach field	AMERICAN RIVER	CAJON	925 BOLSA CHICA
office	FISH HATCHERY	MAINTENANCE	SB
		STATION	

	Cosine		
	First	Second	Third
Mendota maintenance	OROVILLE AREA	FERRELLGAS	MANZANITA
st.			MAINTENANCE
			STATION
Metropolitan state	DAA 22, SAN	SOUTHERN	PATTON STATE
hospital	DIEGO COUNTY	DIVISION	HOSPITAL
	FAIRGROUND	HEADQUARTERS	
Long beach field	AMERICAN RIVER	CAJON	BISHOP AREA
office	FISH HATCHERY	MAINTENANCE	
		STATION	

<sup>(\*</sup> Exact distance numbers can be obtained from script, however not all of them are included in this report)