Hazardous Air Pollutants in USA from 1990 to 2017 Analysis in Hive using IBM BigInsights

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Abstract: This paper aims at performing data analysis in Hive using IBM BigInsights for the Hazardous Air Pollutants in USA from 1990 to 2017 along with transfering data with WINSCP and visualization with Tableau. From the data which was available we were able to categorize the air pollutants by different parameters like which pollutant was measured the most followed by city, state, date etc. The data set is a daily summary file, containing data for every monitor in the EPA database.

Keywords:- data analysis, transferring data, visualization, categorize, pollutant, summary file, EPA database etc.

1. Introduction

Air pollution is a serious problem in the world right now. Hazardous air pollutants, also known as toxic air pollutants or air toxics are poisonous for human body. Those hazardous air can cause cancer or other serious health problems, such as reproductive problems to abnormality by birth time. This data set is from the Environmental Protection Agency (EPA) tracking 187 air pollutants from 1990 to 2017 [1]. The data set is a daily summary file,

containing data for every monitor in the EPA database. You will learn how to:

- Analyze data to determine which air pollutants are measured the most
- Analyze data to determine which cities have the highest and lowest air pollutants measured
- Analyze data to determine which states have the highest and lowest air pollutants measured
- Analyze data to determine which dates have the highest and lowest air pollutants measured
- Transfer data using WINSCP
- Visualize data in Tableau

2. General Instructions

In this project, we have analyzed and visualized Air Pollution Data. We have downloaded Air Pollution Data from Kaggle.com, upload to Google Drive, then download to the local system in Bluemix BigInsights. Then you will learn how to upload it to HDFS. You will figure out how to manipulate and analyze air pollution data in HDFS using HiveQL [2]. You will also practice how to visualize the result in Tableau.

2.1 The Project Flow

2.1.1 Air Pollutants data downloaded from Kaggle.com

The first stage of this project was downloading the dataset from www.kaggle.com. To download it, we needed to create an account on their website. Without creating an account we won't be able to download the dataset. After downloading it we need to save the dataset in the zip file.

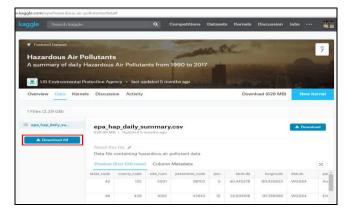


Figure 1: Downloading the dataset

The Figure 1 describes about the dataset which we have downloaded. This dataset is in .csv format and has total twenty nine columns. This data set is from the Environmental Protection Agency (EPA) tracking 187 air pollutants from 1990 to 2017 [3]. The data set is a daily summary file, containing data for every monitor in the EPA database.

2.1.2 Air Pollutants data loaded into Google Drive

The next stage was loading the dataset into the google drive. It was necessary to upload into Google Drive so that we can genereate the link and can be used easily to upload the dataset into the table. The dataset has to be in zip file before loading. This can be explained below.

← → C O a Secure https://doi.org/2009/ecom/chine/folders/3/00/ps/U/Sr6/ps/Godes/abd Abdr 対 👢 🛭 O 💿									
Google Drive		Q	Search Drive	v	∷ (
	(EN		My Drive > CSULA-CIS •		© # 0	î : = 0			
, <u>0</u>	My Drive		Name	Owner	Last modified ↓	File size			
) []	Computers		polition_data #		9.55 PM	-			
#h			hazardous-sir-pollutants.zip	me	Nov 14, 2017 me	628 MB			
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*	Starred		surveyong	me	Nov 14, 2017 me	100 KB			
Î	Trash		food item.png	me	Nov 14, 2017 me	318 NB			
•	Backups		analyze result.png	mè	Nov 14, 2017 me	111 1/8			
	f 17 G8 used		5 Untitled1.png	me	Nov 14, 2017 me	28 KB			
	Jpgrade storage		- United png	me	Nov 14, 2017 me	30 KB			

Figure 2: Data uploaded into Google Drive

2.1.3 Air Pollutants data loaded into BigInsights

In this stage we have to right click the zip file after uploading the dataset it onto Goggle Drive, and a sharable link is seen. We have to copy the link so that we can use it in the putty terminal. The link is given as

https://drive.google.com/open?id=19pPy4pSVarMM6YAAnJjThox2lcThmFxJ We need to remotely access your BigInsights that you executed in your Bluemix account using ssh. You can download the data zip file Hazardous Air Pollutants from Google Drive. (Note: Don't forget to replace the red part of the link with the link you have generated). The commands in the terminal are as follows.

\$ curl -c /tmp/cookies "https://drive.google.com/uc ?export=download&id=19pPy4pSVarMM6YAAnJjTho x2lcThmFxJ"> /tmp/intermezzo.html

 $\$ curl -L -b /tmp/cookies ''https://drive.google.com\$(cat /tmp/intermezzo.html | grep -Po 'uc-download-link'' [^>]* href=''\K[^'']*' | sed 's\&\&/g')'' >

After running the above two commands we are able to get the results which is visible in the following figure.

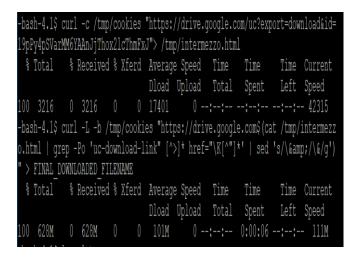


Figure 3: Data loaded into table

\$ ls-alrt (check if this file FINAL_DOWNLOADED_FILENAME is available on path)

\$ mv FINAL_DOWNLOADED_FILENAME air_pollutant.zip

\$ unzip air_pollutant.zip

The above queries will check if this file FINAL_DOWNLOADED_FILENAME is available on the path and unzip the file.

If the data is present, we can see it in the Figure 4.

```
-bash-4.1$ ls -alrt
total 653032
-rw-----. 1 sqian2 biusers 10096122 Nov 21 2016 tweetsbi.csv
drwxr-xr-x. 19 root root 4096 Nov 15 03:30 ..
drwx----. 3 sqian2 biusers 4096 Nov 15 17:49 .pki
-rw-----. 1 sqian2 biusers 1145 Nov 15 21:28 .bash_history
drwxr-xr-x. 3 sqian2 biusers 4096 Nov 15 21:32 .
-rw-----. 1 sqian2 biusers 658586975 Nov 15 21:32 .
-rw-----. 1 sqian2 biusers 658586975 Nov 15 21:32 FINAL DOWNLOADED_FILENAME
-bash-4.1$ mv FINAL DOWNLOADED_FILENAME air_pollutant.zip
Archive: air_pollutant.zip
inflating: epa_hap_daily_summary.csv
```

Figure 4: Data is present

\$ ls -alrt (check csv is available or not)

```
-bash-4.1$ ls -alrt
total 3056992
-rw-----. 1 sqian2 biusers 10096122 Nov 21 2016 tweetsbi.csv
-rw-----. 1 sqian2 biusers 2461649186 Jun 30 18:54 epa hap daily_summary.csv
drwxr-xr-x. 19 root root 4096 Nov 15 03:30 ..
drwx----. 3 sqian2 biusers 4096 Nov 15 17:49 .pki
-rw----. 1 sqian2 biusers 1145 Nov 15 21:28 .bash_history
-rw-----. 1 sqian2 biusers 658586975 Nov 15 21:32 air_pollutant.zip
drwxr-xr-x. 3 sqian2 biusers 4096 Nov 15 21:33 .
```

Figure 5: CSV Availability

2.1.4 Create Hive table to Query Air Pollutants data

The following Hive statement creates an external table that allows Hive query stored in HDFS. External tables preserve the data in the original file format, while allowing Hive to perform queries against the data within the file. The Hive statement below create a new table named, air_pollution, by describing the fields within the files, the delimiter (comma) between fields [4]. This will allow you to create Hive queries over your data.

Open Hive shell environment as follow **\$ hive**

In the Hive shell, you need to copy and paste the following Hive QL code to create an external table "air_pollution". (**Note:** Don't forget to replace the red part with your account name)

hive> CREATE TABLE IF NOT EXISTS air_pollution (state_code DECIMAL,county_code DECIMAL, site_num DECIMAL,parameter_code DECIMAL, poc DECIMAL,latitude DECIMAL (10,6), longitude DECIMAL (10,6), datum string, parameter_name string,sample_duration string, pollutant_standard string,date_local date, units_of_measure string,event_type string, observation count DECIMAL,

observation_percent DECIMAL, arithmetic_mean DECIMAL, first_max_value float, first_max_hour float, aqi string, method_code DECIMAL, method_name string, local_site_name string, address string, state_name string, county_name string, city_name string, cbsa_name string, date_of_last_change date)

```
ROW FORMAT DELIMITED FIELDS TERMINATED BY ','
STORED AS TEXTFILE LOCATION '/user/sqian2/epa_hap_daily_summary'
TBLPROPERTIES ('skip.header.line.count'='1');
```

The next step is you have to load the data into the table. (**Note:** Don't forget to replace the red part with your account name)

hive>load data local inpath '/home/sqian2/epa_hap_daily_summary.csv' into table air_pollution;

```
hyme CREATE TABLE IP NOT EXISTS air_pollution

> (state_code_DECIMAL,
> county_code_DECIMAL,
> site_num_DECIMAL,
> parameter_code_DECIMAL,
> por_DECIMAL,
> latitude_DECIMAL (10,6),
> longitude_DECIMAL (10,6),
> datum_string,
> parameter_name_string,
> sample_duration string,
> pollutant_standard string,
> date_local_date ,
> units_of_measure_string,
> event_type_string,
> event_type_string,
> event_type_string,
> observation_percent_DECIMAL,
> arithmetic_mean_DECIMAL,
> first_max_value_float ,
> first_max_value_float,
> first_max_value_float,
> adit_string,
> method_code_DECIMAL,
> method_code_DECIMAL,
> method_name_string,
> county_name_string,
> county_name_string,
> county_name_string,
> county_name_string,
> clsa_name_string,
> clsa
```

Figure 6: Table Created

Then in the Hive shell, you need to check if the table "air_pollution" is shown:

hive>show tables;

Now you can query the content of the air_pollution table: hive>select * from air_pollution limit 10;

hive> select * :	from air_pollut:					
0K 42 125			40.445278	-00 420033	WGS84	Arsenic PM2.5 LC
24 HOUR	2005-12-30		ms/cubic meter			100 0 0
.003 0.0	811		ASS Teflon - Er		ve XRF	HILLMAN
STATE PARK - KI	NGS CREEK ROAD	Pennsylv	ania Washing	ton Not	in a city	Pittsburgh PA 2
015-07-22						
48 439						
de 24 HOUR			Parts per billi			
0.0 0.0						
			Tarrant Fort Wo	orth Dalla	as-Fort Wo:	
014-03-25 22 127			32.057581		WGS84	Lead PM2.5 LC 2
4 HOUR	2001-11-12					Lead PM2.5 LC 2
.00228 0.0	802		ms/cubic meter			ter 2.2 sq. cm
Proton Induced			Sikes Louisia			a city 2
015-07-22	n-Ray Excitation		DIKES HOUISIG			
18 89						
016-05-23	Parts per bill:	ion Carbon				
						ITRI/ 1219.5 meter
	ssee St old ar	mmuntion b	unker 201 MIS	SISSIPPI ST.	IITRI BUNKI	ER IndianaL
ake Gary 6 89	Cnicago-Naperv: 3003 88136	ille-Elgin	IL-IN-WI 40.53999	2017-02-20 -121.57646	NAD83	Nickel PM2.5 LC2
4 HOUR	2001-09-02	Mignogra	ms/cubic meter			100 0 1
.3E-4 0.0	802					ter 2.2 sq. cm
						RS LASSEN VOLCANI
C NP Califor			city Redding		-07-22	
26 163			42.306674			Lead PM10 STP 2
4 HOUR		Microgra	ms/cubic meter			
.0163 0.0	109		A/GMW 321B - IC	P/MS PROPI	ERTY OWNED	BY DEARBORN PUBLI
C SCHOOLS	2842 WYOMING	Michigan	Wayne	Dearborn		
MI 2015-07						
6 83 4 HOUR	9000 88128 2015-08-04		34.733889	-120.008349	WGS84	Lead PM2.5 LC 2
4 HOUR .0 0.0	2015-08-04	Microgra	ms/cubic meter	(LC) None		ter 2.2 sq. cm
X-Ray Fluoresce	out San Da	Facil Wildo	module A with C	yclone iniet-	formin	Santa Barbara N
ot in a city						Dunca Dalbala N
72 61			18.425652	-66.115846	WGS84	Nickel PM2.5 LC2
4 HOUR			ms/cubic meter			
.0127 0.0		Met One	SASS Teflon - F	nergy Dispers	ive XRF	USGS AND
			ico Guaynab	o Guayr		
a-Caguas PR						
29 510			38.656498	-90.198646	NAD83	
ified 24 HOUR			Parts per bill			
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reet BLAIR S'	TREET: 3247 Bla			310/ Miss		
t. Louis	St. Louis MO-I 1002 12112		37.950741		NAD83	Chromium (TSP) S
TP 24 HOUR			Micrograms/cub			1 100 0
0.003 0.0	304	TO-VOL-3	CONTECH 920 or	924_ TEFLON -	Y_DAY FILL	RESCENCE Stockton
-Hazelton	HAZELTON-HD ST	OCKTON	California	San Joaquin	Stockt	on Stockton
× 11 00	0010 00 11			Jouquin		
-Lodi CA	2013-06-11					

Figure 7: Displaying the first 10 values

2.1.5 Creating Hive Queries to Analyze Data.

The following Hive Queries will show you the top 10 pollutants:

Hive>Select count(*) as pollution,parameter_name from air_pollution group by parameter_name order by pollution DESC limit 10;

```
MapReduce Jobs Launched:
Stage-Stage-1: Map: 10 Reduce: 10 Cumulative CPU: 57.28 sec HDFS Read: 2464126
621 HDFS Write: 2540 SUCCESS
Stage-Stage-2: Map: 1 Reduce: 1 Cumulative CPU: 3.15 sec HDFS Read: 9949 HDFS
Write: 222 SUCCESS
Total MapReduce CPU Time Spent: 1 minutes 0 seconds 430 msec
OK
600171 Lead PM2.5 LC
600150 Nickel PM2.5 LC
599855 Manganese PM2.5 LC
599857 Chromium PM2.5 LC
599821 Arsenic PM2.5 LC
469375 Benzene
308983 13-Butadiene
245750 Tetrachloroethylene
245517 Chloroform
244835 Dichloromethane
Time taken: 117.333 seconds, Fetched: 10 row(s)
```

Figure 8: Displaying top 10 Pollutants

The following Hive Queries will show you the top 10 pollutants by city:

Hive> Select count(*) as pollution, parameter_name, cbsa_name from air_pollution where cbsa_name != "" group by parameter_name,cbsa_name order by pollution DESC limit 10;

```
otal MapReduce CPU Time Spent: 1 minutes 31 seconds 360 msec
44229
       Benzene Houston-The Woodlands-Sugar Land TX
       13-Butadiene
                       Houston-The Woodlands-Sugar Land TX
       Benzene Dallas-Fort Worth-Arlington TX
       13-Butadiene
                       Dallas-Fort Worth-Arlington TX
       Benzene New York-Newark-Jersey City NY-NJ-PA
       Dichloromethane Houston-The Woodlands-Sugar Land TX
       Vinyl chloride Houston-The Woodlands-Sugar Land TX
7477
       Chloroform
                       Houston-The Woodlands-Sugar Land TX
17476
       Trichloroethylene
                               Houston-The Woodlands-Sugar Land TX
       Ethylene dichloride
                               Houston-The Woodlands-Sugar Land TX
Pime taken: 134.577 seconds, Fetched: 10 row(s)
```

Figure 9: Top 10 Pollutants by city

The following Hive Queries will show you the last 10 pollutants by city:

Hive> Select count(*) as pollution, parameter_name, cbsa_name from air_pollution group by parameter_name,cbsa_name order by pollution ASC limit 10:

```
tage-Stage-1: Map: 10 Reduce: 10 Cumulative CPU: 70.1 sec HDPS Read: 2464133131 HDPS Write: 360813
tage-Stage-2: Map: 1 Reduce: 1 Cumulative CPU: 3.33 sec HDFS Read: 368482 HDFS Write: 446 SUCCESS
otal MapReduce CPU Time Spent: 1 minutes 13 seconds 430 msec
      Cadmium (TSP) STP
                             Dallas-Fort Worth-Arlington TX
      Manganese (TSP) STP
                             Dallas-Fort Worth-Arlington TX
                             Mankato-North Mankato MN
      Mercury PM10 STP
                             Dallas-Fort Worth-Arlington TX
      Beryllium (TSP) STP
                             Huntington-Ashland WV-KY-OH
      Manganese (TSP) STP
      Mercury PM10 STP
                             Fargo ND-MN
      Chromium (TSP) STP
                             Baton Rouge LA
      Beryllium (TSP) STP
                             Huntington-Ashland WV-KY-OH
      Nickel (TSP) STP
                             Huntington-Ashland WV-KY-OH
                             Akron OH
me taken: 104.69 seconds, Fetched: 10 row(s)
```

Figure 10: Last 10 Pollutants by City

The following Hive Queries will show you the top 10 pollutants by state:

Hive> Select count(*) as pollution, parameter_name, state_name from air_pollution group by parameter_name, state_name order by pollution DESC limit 10;

```
MagReduce Jobs Launched:
Stage-Stage-1: Map: 10 Reduce: 10 Cumulative CPU: 62.92 sec HDFS Read: 2464133191 HDFS Write: 79426 SUCCESS
Stage-Stage-2: Map: 1 Reduce: 1 Cumulative CPU: 3.78 sec HDFS Read: 87097 HDFS Write: 294 SUCCESS
Total MapReduce CPU Time Spent: 1 minutes 6 seconds 700 msec
OK
121622 Benzene Texas
117431 13-Butadiene Texas
68312 Nickel FM2.5 LC California
68312 Nickel FM2.5 LC California
68312 Manganese FM2.5 LC California
66397 Arsenic FM2.5 LC California
66597 Chromium FM2.5 LC California
66597 Chromium FM2.5 LC California
65877 Trichloroethylene Texas
52853 Chloroform Texas
Time taken: 102.843 seconds, Fetched: 10 row(s)
```

Figure 11: Top 10 Pollutants by State

The following Hive Queries will show you the last 10 pollutants by state:

Hive> Select count(*) as pollution, parameter_name, cbsa_name from air_pollution group by parameter_name,cbsa_name order by pollution ASC limit 10;

```
Reduce Jobs Launched:
tage-Stage-1: Map: 10 Reduce: 10 Cumulative CPU: 87.03 sec HDFS Read: 2464133131 HDFS Write: 36081
tage-Stage-2: Map: 1 Reduce: 1 Cumulative CPU: 3.24 sec HDFS Read: 368402 HDFS Write: 446 SUCCESS
tal MapReduce CPU Time Spent: 1 minutes 30 seconds 270 msec
     Cadmium (TSP) STP
                             Dallas-Fort Worth-Arlington TX
     Manganese (TSP) STP
                            Dallas-Fort Worth-Arlington TX
     Mercury PM10 STP
                            Mankato-North Mankato MN
     Beryllium (TSP) STP
                            Dallas-Fort Worth-Arlington TX
     Manganese (TSP) STP
                            Huntington-Ashland WV-KY-OH
     Mercury PM10 STP
                             Fargo ND-MN
     Chromium (TSP) STP
                             Baton Rouge LA
     Beryllium (TSP) STP
                            Huntington-Ashland WV-KY-OH
                             Huntington-Ashland WV-KY-OH
     Nickel (TSP) STP
      Tetrachloroethylene
                            Akron OH
me taken: 111.55 seconds, Fetched: 10 row(s)
```

Figure 12: Last 10 Pollutants by State

The following Hive Queries will show you the top 20 pollutants by date:

Hive> Select count(*) as pollution, parameter_name, date_local from air_pollution group by parameter_name, date_local order by pollution DESC limit 20;

Figure 13: Top 20 Pollutants by Date

The following Hive Queries will show you the last 20 pollutants by date:

Hive> Select count(*) as pollution, parameter_name, date_local from air_pollution group by parameter_name, date_local order by pollution ASC limit 20;

```
MapReduce Jobs Launched:
Stage-Stage-1: Map: 10 Reduce: 10 Cumulative CPU: 211.64 sec HDFS Read: 2464133061 HDFS Write: 7824899 SUCCESS Stage-Stage-2: Map: 1 Reduce: 1 Cumulative CPU: 18.12 sec HDFS Read: 7832557 HDFS Write: 726 SUCCESS TOTAL MapReduce CFU Time Spent: 3 minutes 49 seconds 760 msec OK

1122-Tetrachloroethane 1997-07-07
1 1122-Tetrachloroethane 1995-09-26
1 1122-Tetrachloroethane 1996-04-23
1 1122-Tetrachloroethane 1995-03-20
1 1122-Tetrachloroethane 1995-04-19
1 1122-Tetrachloroethane 2000-02-02
1 1122-Tetrachloroethane 1998-07-02
1 1122-Tetrachloroethane 1998-07-02
1 1122-Tetrachloroethane 2000-10-216
1 1122-Tetrachloroethane 2000-11-18
1 trans-13-Dichloropropene 2016-08-25
1 1122-Tetrachloroethane 1997-09-05
1 trans-13-Dichloropropene 2015-11-19
1 1122-Tetrachloroethane 1995-07-18
1 1122-Tetrachloroethane 1995-07-18
1 1122-Tetrachloroethane 1995-07-18
1 1122-Tetrachloroethane 1995-07-24
1 1122-Tetrachloroethane 1994-03-05
1 1122-Tetrachloroethane 1994-03-05
1 1122-Tetrachloroethane 1994-03-05
1 1122-Tetrachloroethane 1994-03-05
1 1122-Tetrachloroethane 1994-05-24
1 1122-Tetrachloroethane 1994-05-02
Time taken: 146.862 seconds, Fetched: 20 row(s)
```

Figure 14: Last 20 pollutants by Date

2.2 Create Tables for Tableau

In these sections it will described in detail about different tables which are created in Tableau [5]. Since the dataset is too big, you need to create a table for each Hive Queries:

hive -e "use default ; Select count(*) as pollution,parameter_name,cbsa_name from air_pollution group by parameter_name,cbsa_name order by pollution ASC limit 10;"| perl -lpe 's/"/\"/g; $s/^{\frac{1}{y''}}$; $s/^{$

Replace RED TEXT with each query that you need to create a table. Replace BLUE TEXT with the corresponding file name that you want to name it. After the

above query is done for each table, open WINSCP, and log in WINSCP as you would in putty using your Host name, user name, and password.

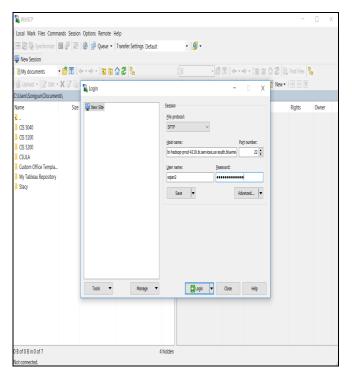


Figure 15: Create Tables for Tableau

Drag the csv files you have created to a local location on your computer on the left side of the window. You should have 7 CSV files downloaded.

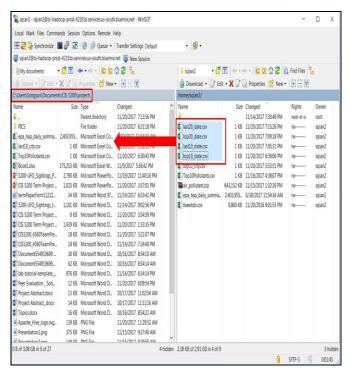


Figure 16: Download the CSV Files.

Once the csv files are downloaded, you need to open Tableau on your local computer [6]. Tableau to open data file directly from Tableau and Visualization.

Open Tableau, and open the file according to the following order.

1. Top 10 pollutants

First Rename F1 to Count, F2 to Pollutants. Select Sheet 1 next to Data Source, and drag Count to Rows and Pollutants to Columns. Drag Pollutants to Color, and you will get this chart.

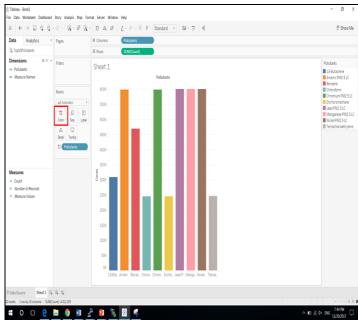


Figure 17: Top 10 Pollutants by Chart

2.Top 10 Pollutants by City

Rename F1 to Count, F2 to Pollutants, F3 to CBSA_NAME. Select Sheet 1 next to Data Source, and change CBSA's geographic role to CBSA MSA (USA). Drag Longitude(generated) to Columns, Latitude(generated) to Rows, CBSA to color, Count to Size, Pollutants to Detail. Select Show me, and select Geo Map:

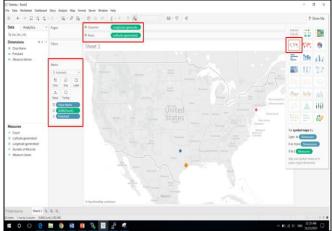


Figure 18: Top 10 Pollutants by City (Map view)

Create a new Worksheet by selecting the icon next to the Sheet 1. Drag Pollutants and CSBA to Columns and Count to Rows. Drag Pollutants to Color, you will get this:

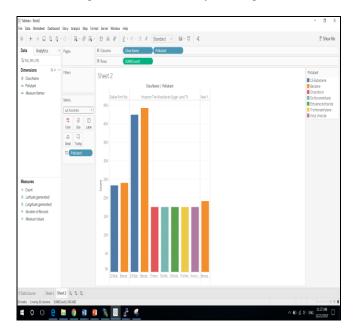


Figure 19: Top 10 Pollutants by City (chart)

3.Last 10 Pollutants by City

Rename F1 to Count, F2 to Pollutants, F3 to CBSA_NAME. Select Sheet 1 next to Data Source, and change CBSA's geographic role to CBSA MSA (USA). Drag Longitude(generated) to Columns, Latitude(generated) to Rows, CBSA to color, Count to Size, Pollutants to Detail. Select Show me, and select Geo Map.

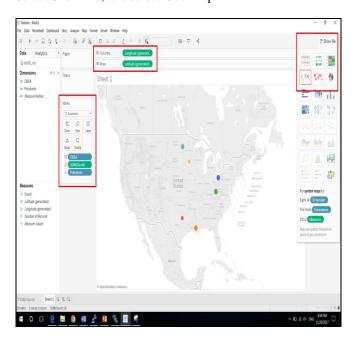


Figure 20: Last 10 Pollutants by City (Map View)

Create a new Worksheet by selecting the icon next to the Sheet 1. Drag Pollutants and CSBA to Columns and Count to Rows. Drag Pollutants to Color, you will get this:

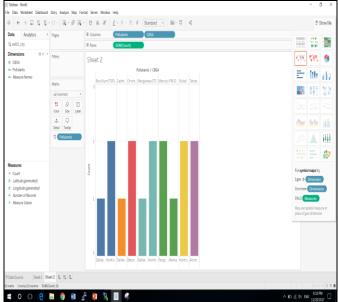


Figure 21: Last 10 Pollutants by City (chart)

4. Top 10 Pollutants by state

Change F1 to count, F2 to Pollutants, F3 to State. Select Sheet 1 next to Data Source, change State's geographical role to State/Province. Drag Longitude to Columns, Latitude to Rows, Pollutants to Color, Count to Size, State to Details. And select Geo Map.

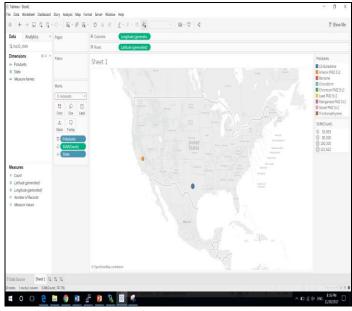


Figure 22: Top 10 Pollutants by state (Map View)

Create a new Worksheet by selecting the icon next to the Sheet 1. Drag Pollutants and State to Columns and Count to Rows. Drag State to Color, the bar chart will only generate two colors due to the top 10 are only in Texas and California.

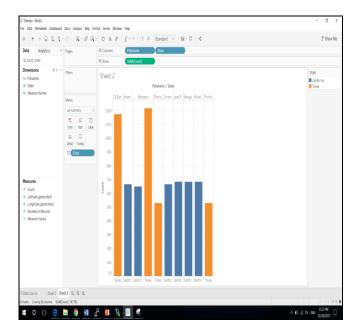


Figure 23: Top 10 Pollutants by state (chart)

5. Last 10 Pollutants by State

Change F1 to count, F2 to Pollutants, F3 to State. Select Sheet 1 next to Data Source, change State's geographical role to State/Province. Drag Longitude to Columns, Latitude to Rows, Pollutants to Color, Count to Size, State to Details and select Geo Map.

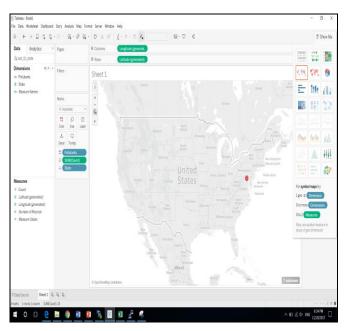


Figure 24: Last 10 Pollutants by State (Map View)

Create a new Worksheet by selecting the icon next to the Sheet 1. Drag Pollutants and State to Columns and Count to Rows. Drag State to Color, the bar chart will only generate two colors due to the top 10 are only in Country of Mexico and Maryland.

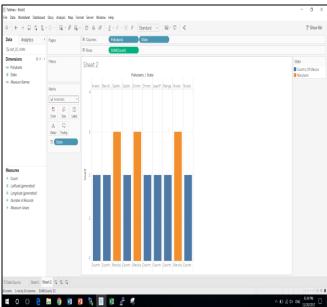


Figure 25: Last 10 Pollutants by State (chart)

6. Top 20 Pollutants by Date

Change F1 to count, F2 to Pollutants, F3 to Date. Select Sheet 1 next to Data Source, drag Date to Columns, Count to Rows, Pollutants to Color. Choose Day (May 8, 2015 format) for date, Sort Day of Date descending by Count, Choose stack bar.

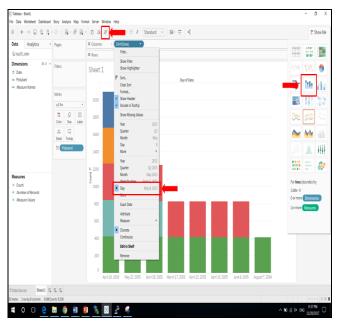


Figure 26: Top 20 Pollutants by Date (chart)

7. Last 20 Pollutants by Date

Change F1 to count, F2 to Pollutants, F3 to Date Select Sheet 1 next to Data Source, drag Date to Columns, Count to Rows, Pollutants to Color. Choose Day (May 8, 2015 format) for date, Sort Day of Date descending by Count, Choose stack bar.

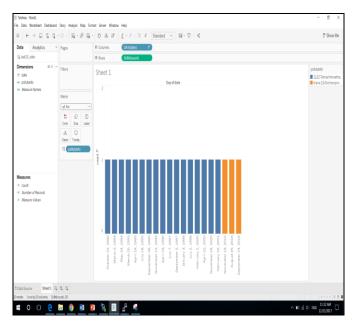


Figure 27: Last 20 Pollutants by Date

3. Conclusion

From the above analysis, we can see that interesting sets of trends and patterns exists in large data sets which helps us to get a better understanding of the data.

Recent advancement in cloud technologies helps us to harness the power of parallel processing of a cluster of computers with little investment and almost no maintenance of the underlying computer hardware.

The Air pollution is a serious problem in the world right now. Hazardous air pollutants, also known as toxic air pollutants or air toxics are poisonous for human body.

We have Analyzed data to determine which air pollutants are measured the most. We have found that pollutant Lead PM2.5 has maximum pollutant factor.

The pollutant Benzene has affected the city of The Woodlands-Sugar Land in Texas the most and the pollutant Cadmium (TSP) STP has affected the city of Dallas-Fort Worth-Arlington Texas the least.

The pollutant Benzene has affected the state of Texas the most and the pollutant Cadmium (TSP) STP the state of Texas the least.

The pollutant Lead PM2.5 has affected the United States the most and the pollutant 1122-Tetrachloroethane has affected the least since 1997 till 2017.

References

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