



CIS 4560 Term Project Tutorial



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Lab Tutorial

Pain Pills Data Analysis in Hive

Objectives

List what your objectives are. In this hands-on lab, you will learn how to:

- Connect to Hadoop Cluster remotely
- Load Pain Pills Data into Hadoop Clusters
- Create a staging table in Beeline
- Check and verify the data
- Load the clean data into PainPills table
- Check and verify the data again
- Generating Top 10 Reports
- Import Hadoop File to MS Power BI Desktop

Platform Spec

- Oracle Linux Server
- CPU Speed: 1995 MHz
- # of CPU cores: 8
- # of nodes: 3
- Total Memory Size: 58 GB

Step 1: Connect to Hadoop Cluster remotely

You need to remote to your Hadoop Clusters using the **ssh** command from the Git Bash terminal as follows:

```
$ ssh username@ipaddress
```

Step 2: Load Pain Pills Data into Hadoop Clusters

You can download the data files using the **wget** command from the terminal as follows:

```
$ wget https://github.com/vcheung621/cis4560/raw/main/arcos-southern-ca-itemized.zip
```

Once you download the data file, please proceed with the commands below to create a temporary directory (arcos) and unzip the zip file into the directory.

```
$ mkdir arcos  
$ mv arcos-southern-ca-itemized.zip arcos  
$ cd arcos/  
$ unzip arcos-southern-ca-itemized.zip
```

After you unzip all the CSV files, the below commands will create an HDFS directory (PainPillsFiles) and put all the CVS files into it.

```
$ hdfs dfs -mkdir PainPillsFiles  
$ hdfs dfs -put *.csv PainPillsFiles  
$ hdfs dfs -ls PainPillsFiles
```

Step 3: Create a staging table in Beeline

The following Hive statement creates an external staging table (painpills_stage). External tables preserve the data in the original file format while allowing Hive to perform queries against the data within the file.

NOTE: You have to replace the user name **<username>** to your username.

```
USE your_databasename;

--drop the table painpills_stage
DROP TABLE IF EXISTS painpills_stage;

--create the painpills staging table on comma-separated data
CREATE EXTERNAL TABLE IF NOT EXISTS painpills_stage(
REPORTER_DEA_NO STRING,
REPORTER_BUS_ACT STRING,
REPORTER_NAME STRING,
REPORTER_ADDL_CO_INFO STRING,
REPORTER_ADDRESS1 STRING,
REPORTER_ADDRESS2 STRING,
REPORTER_CITY STRING,
REPORTER_STATE STRING,
REPORTER_ZIP BIGINT,
REPORTER_COUNTY STRING,
BUYER_DEA_NO STRING,
BUYER_BUS_ACT STRING,
BUYER_NAME STRING,
BUYER_ADDL_CO_INFO STRING,
BUYER_ADDRESS1 STRING,
BUYER_ADDRESS2 STRING,
BUYER_CITY STRING,
BUYER_STATE STRING,
BUYER_ZIP BIGINT,
BUYER_COUNTY STRING,
TRANSACTION_CODE STRING,
DRUG_CODE BIGINT,
NDC_NO STRING,
DRUG_NAME STRING,
QUANTITY BIGINT,
UNIT STRING,
ACTION_INDICATOR STRING,
ORDER_FORM_NO STRING,
CORRECTION_NO STRING,
STRENGTH STRING,
TRANSACTION_DATE STRING,
CALC_BASE_WT_IN_GM FLOAT,
DOSAGE_UNIT BIGINT,
TRANSACTION_ID BIGINT,
```

```

Product_Name STRING,
Ingredient_Name STRING,
Measure STRING,
MME_Conversion_Factor FLOAT,
Combined_Labeler_Name STRING,
Revised_Company_Name STRING,
Reporter_family STRING,
dos_str STRING
)
ROW FORMAT SERDE 'org.apache.hadoop.hive.serde2.OpenCSVSerde'
WITH SERDEPROPERTIES (
  "separatorChar" = "\",",
  "quoteChar" = "\"",
  "escapeChar" = "\\"
)
STORED AS TEXTFILE LOCATION '/user/<username>/PainPillsFiles'
TBLPROPERTIES ('skip.header.line.count'='1');

```

Step 4: Check and verify the data

After constructing the table, we will examine and validate the data. The queries provided below will determine the total data count. It is essential to confirm the absence of any corrupt data. One method to validate data involves verifying if the column data aligns with the CSV files, selecting the DRUG_NAME column as an example because we know it contains only two unique values in the source CSV file. Additionally, we can inspect the zip code column (buyer_zip) for any letters and examine the manufacturer column (combined_labeler_name) for null values.

```

select count(*) from painpills_stage;
+-----+
|  _c0  |
+-----+
| 9571662 |
+-----+

```

```

select count(*) from painpills_stage where drug_name not in
('HYDROCODONE', 'OXYCODONE');
+-----+
|  _c0  |
+-----+
|  507  |
+-----+

```

```

select count(*) from painpills_stage where drug_name in
('HYDROCODONE', 'OXYCODONE');
+-----+
|  _c0  |
+-----+

```

```
+-----+
| 9571155 |
+-----+
```

```
SELECT COUNT(*) AS count_letters
FROM painpills_stage
WHERE LENGTH(regexp_extract(buyer_zip, '[a-zA-Z]', 0)) > 0;
+-----+
| count_letters |
+-----+
| 507           |
+-----+
```

```
SELECT COUNT(*) AS null_count
FROM painpills_stage
WHERE Combined_Labeler_Name = 'null';
+-----+
| null_count |
+-----+
| 11430      |
+-----+
```

Step 5: Load the clean data into PainPills table

Having identified 11,937 (507+11,430) instances of corrupt data through the previous query, we will proceed to clean this data. Additionally, the original dataset contains numerous columns that are not required for our analysis. We will selectively choose the relevant columns. The following statement will generate a new table called PAINPILLS, consisting of clean data and the essential columns.

```
--use beeline
DROP TABLE IF EXISTS painpills;

--create the painpills table on comma-separated data
CREATE TABLE painpills
ROW FORMAT SERDE 'org.apache.hadoop.hive.serde2.OpenCSVSerde'
WITH SERDEPROPERTIES (
  "separatorChar" = "\",",
  "quoteChar"     = "\"",
  "escapeChar"    = "\\"
)
STORED AS TEXTFILE LOCATION '/user/vcheung4/PainPills'
AS
SELECT buyer_dea_no AS dea_no,
buyer_name as pharmacy,
buyer_addl_co_info as addl_co_info,
buyer_address1 as address1,
buyer_address2 as address2,
```

```

buyer_city as city,
buyer_state as state,
buyer_zip as zip,
buyer_county as county,
drug_name,
quantity,
TO_DATE(from_unixtime(unix_timestamp(transaction_date,'MMddyyyy'),'yyyy-MM-
dd')) AS transaction_date,
calc_base_wt_in_gm,
dosage_unit as number_of_pills,
transaction_id,
product_name,
ingredient_name,
combined_labeler_name as manufacturer,
revised_company_name as distributor,
dos_str
FROM painpills_stage where drug_name in ('OXYCODONE','HYDROCODONE') AND
Combined_Labeler_Name <> 'null';

```

Step 6: Check and verify the data again

Now check and verify the data again to see any dirty data.

```

select count(*) from painpills;
+-----+
|  _c0  |
+-----+
| 9559725 |
+-----+

```

```

select count(*) from painpills where drug_name not in
('HYDROCODONE','OXYCODONE');
+-----+
|  _c0  |
+-----+
|  0    |
+-----+

```

```

select count(*) from painpills where drug_name in
('HYDROCODONE','OXYCODONE');
+-----+
|  _c0  |
+-----+
| 9559725 |
+-----+

```

```
SELECT COUNT(*) AS count_letters
FROM painpills
WHERE LENGTH(regexp_extract(zip, '[a-zA-Z]', 0)) > 0;
```

```
+-----+
| count_letters |
+-----+
| 0             |
+-----+
```

```
SELECT COUNT(*) AS null_count
FROM painpills
WHERE manufacturer = 'null';
```

```
+-----+
| null_count |
+-----+
| 0           |
+-----+
```

Above are the expected results. The DRUG_NAME column only contains two distinct values. The zip column contains no letter characters. The manufacturer column contains no null values. The new total record count is 9559725 (9571662 – 11937).

Step 7: Generating Top 10 Reports

Now you can create a top 10 distributors' report by executing the following:

```
select distributor, format_number(sum(number_of_pills),0) AS total_pills,
round(sum(number_of_pills)/(select sum(number_of_pills) from painpills) *
100,1) as percentage from painpills group by distributor order by percentage
desc limit 10;
```

```
+-----+-----+-----+
| distributor | total_pills | percentage |
+-----+-----+-----+
| AmerisourceBergen Drug | 988,807,325 | 19.5 |
| McKesson Corporation | 875,541,900 | 17.3 |
| CVS | 583,582,700 | 11.5 |
| Walgreen Co | 468,470,760 | 9.2 |
| Cardinal Health | 430,580,165 | 8.5 |
| Thrifty Payless Inc | 363,882,100 | 7.2 |
| Kaiser Permanente | 290,377,930 | 5.7 |
| H. D. Smith | 227,268,410 | 4.5 |
| Wal-Mart | 149,561,300 | 3.0 |
| Valley Wholesale Drug Co | 99,650,110 | 2.0 |
+-----+-----+-----+
```

You can create a top 10 manufacturers' report by executing the following:

```
select manufacturer, format_number(sum(number_of_pills),0) AS total_pills,
round(sum(number_of_pills)/(select sum(number_of_pills) from painpills) *
100,1) as percentage from painpills group by manufacturer order by percentage
desc limit 10;
```

manufacturer	total_pills	percentage
SpecGx LLC	1,687,218,718	33.3
Actavis Pharma, Inc.	1,573,661,563	31.1
Par Pharmaceutical	978,929,948	19.3
Amneal Pharmaceuticals LLC	179,715,626	3.5
Purdue Pharma LP	151,651,496	3.0
Kaiser Foundation Hospitals	128,272,830	2.5
AbbVie Inc.	42,803,604	0.8
KVK-Tech, Inc.	42,003,700	0.8
Dispensing Solutions Inc.	24,254,380	0.5
Bryant Ranch Prepack	26,838,261	0.5

You can create a top 10 pharmacies' report by executing the following:

```
select pharmacy, format_number(sum(number_of_pills),0) AS total_pills,
round(sum(number_of_pills)/(select sum(number_of_pills) from painpills) *
100,1) as percentage from painpills group by pharmacy order by percentage
desc limit 10;
```

pharmacy	total_pills	percentage
GARFIELD BEACH CVS, L.L.C.	805,190,641	15.9
WALGREEN CO.	508,510,910	10.0
THRIFTY PAYLESS INC.	500,215,840	9.9
KAISER FOUNDATION HLTH PLN	222,259,950	4.4
LONGS DRUG STORES CALIFORNIA, L.L.C.	166,237,150	3.3
THE VONS COMPANIES INC	119,895,670	2.4
COSTCO WHOLESALE CORPORATION	120,475,210	2.4
OPTUMRX	92,022,350	1.8
NEW ALBERTSON'S, INC.	84,835,050	1.7
TARGET STORES A DIV.OF TARGET CORP.	64,813,340	1.3

You can create a top 10 products' report by executing the following:

```
select product_name, format_number(sum(number_of_pills),0) AS total_pills,
round(sum(number_of_pills)/(select sum(number_of_pills) from painpills) *
100,1) as percentage from painpills group by product_name order by percentage
desc limit 10;
```

product_name	total_pills	percentage
HYDROCODONE BIT/ACETAMINOPHEN 5MG/50	572,361,010	11.3
HYDROCODONE BIT. 10MG/ACETAMINOPHEN	429,918,585	8.5
HYDROCODONE BIT 5MG/ACETAMINOPHEN 50	400,853,017	7.9
HYDROCODONE.BIT./ACET.,10MG & 325MG/	316,910,150	6.3
HYDROCODONE BITARTRATE 7.5MG/ACETAMI	302,069,604	6.0
HYDROCODONE BIT/ACETA 10MG/325MG USP	266,708,730	5.3
HYDROCODO.BIT/APAP 7.5MG/750MG USP T	248,234,042	4.9
HYDROCODONE.BIT. & ACETA 5MG & 500M	220,160,616	4.3
OXYCODONE HCL/ACETAMINOPHEN 5MG/325M	176,668,000	3.5
HYDROCODONE BIT./ACETA 10MG/325MG TA	124,347,687	2.5

Since we have 11 Hadoop data files, we must merge them into one. Execute the below command to combine and output into one text file.

```
hdfs dfs -getmerge -nl PainPills/* output.csv
```

On your PC with git bash, you can remotely download the output file "output.csv" to your PC to visualize it using MS PowerBI.

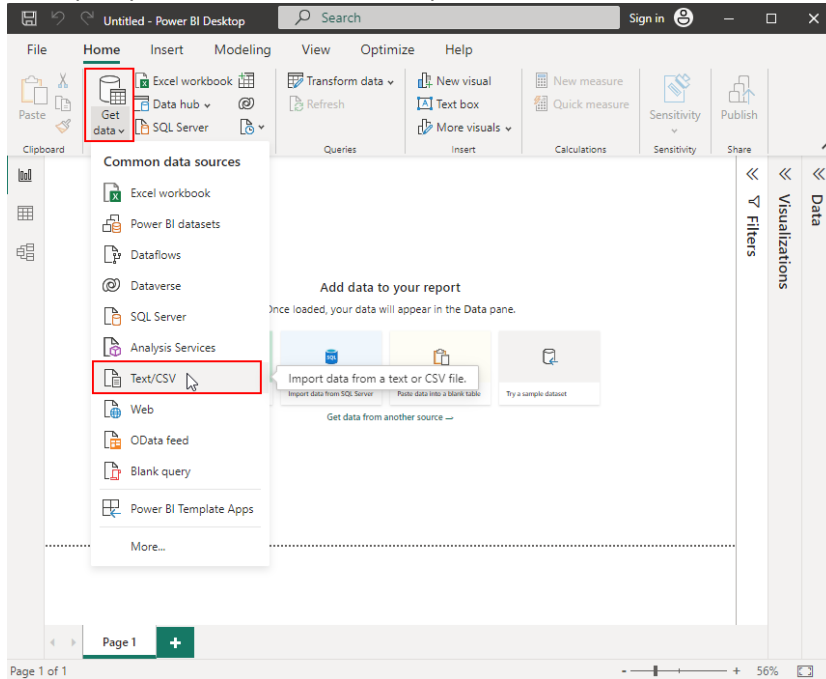
Note: You must replace the user name <username> with your username. Also, you may need to download the MS PowerBI Desktop version.

```
scp <username>@xxx.xxx.xxx.xxx:/home/<username>/output.csv .
```

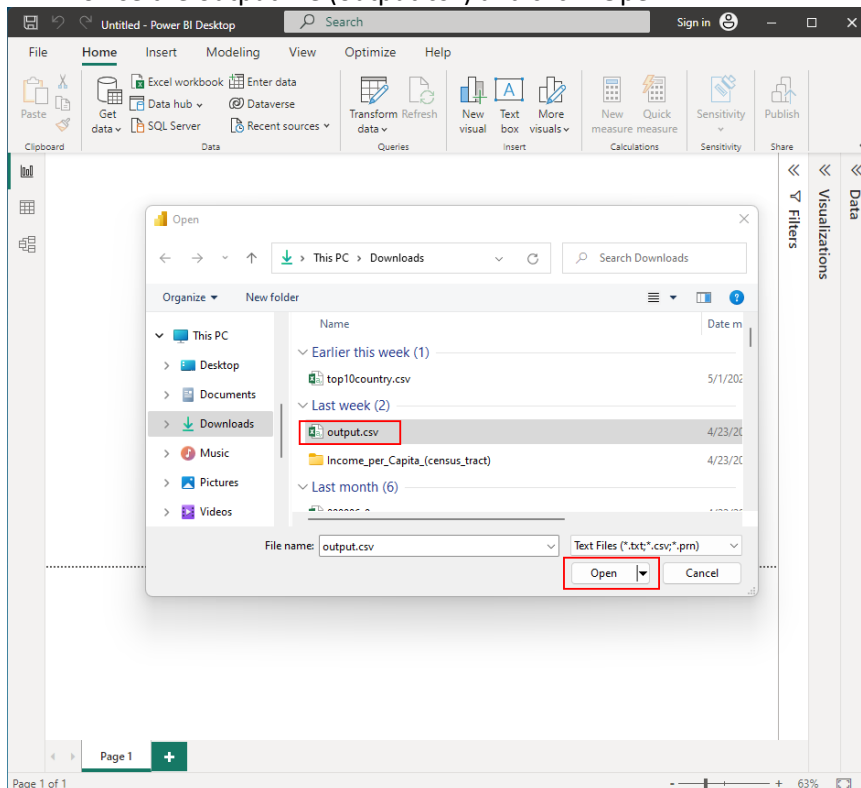
Step 8: Import Hadoop File to MS Power BI Desktop

Open your MS Power BI Desktop at your local computer.

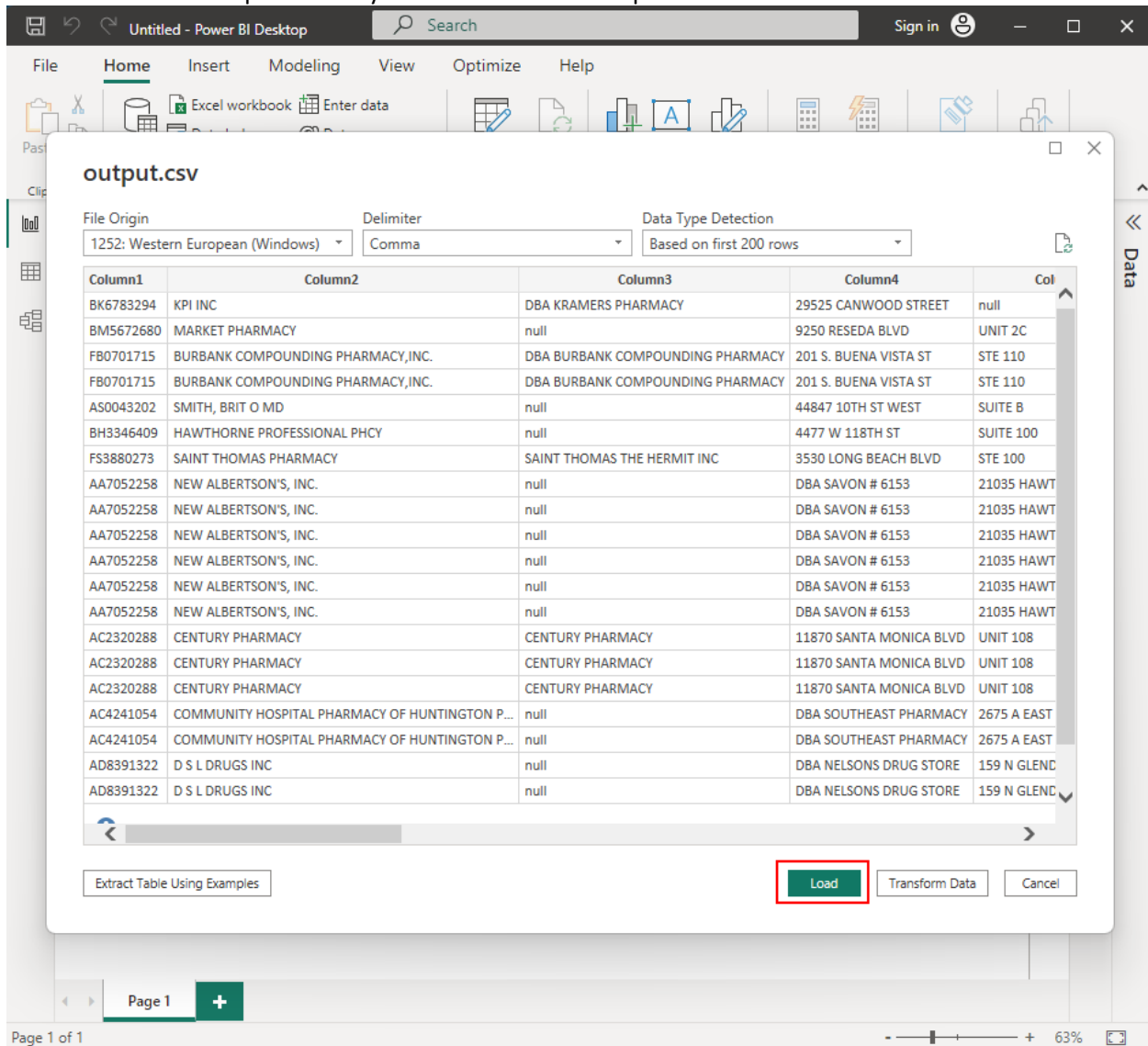
1. Open your MS Power BI Desktop and click on "Get data" and then click on "Text/CSV".



2. Browse the output file (output.csv) and click "Open".



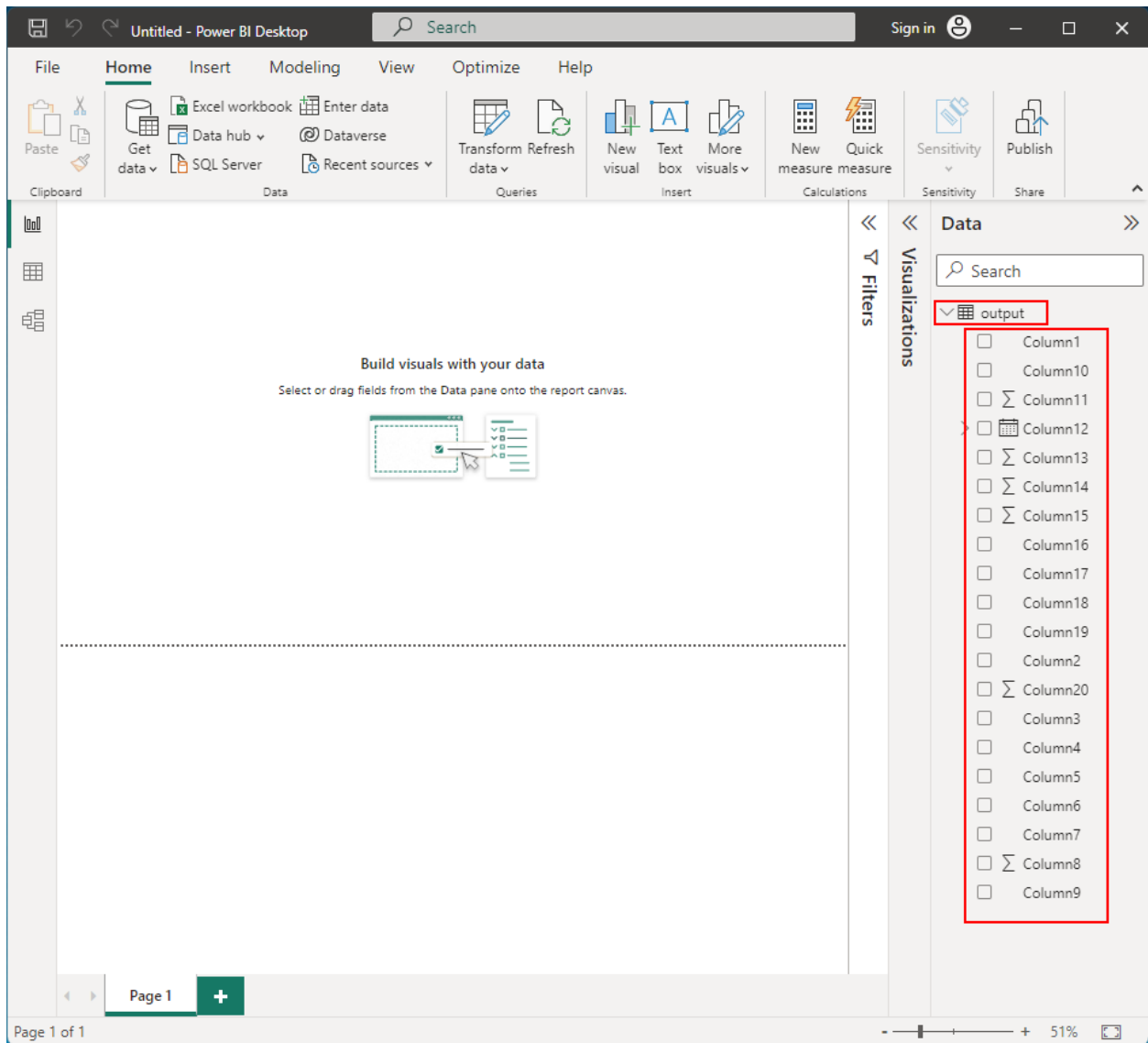
3. Click "Load". This process may take a while for the import.



4. Expand the output under the "Data" section and right click to rename the column names as follow:

- Column1 as dea_no,
- Column2 as pharmacy,
- Column3 as addl_co_info,
- Column4 as address1,
- Column5 as address2,
- Column6 as city,
- Column7 as state,
- Column8 as zip,
- Column9 as county,
- Column10 as drug_name,
- Column11 as quantity,
- Column12 as transaction_date,

- Column13 as calc_base_wt_in_gm,
- Column14 as number_of_pills,
- Column15 as transaction_id,
- Column16 as product_name,
- Column17 as ingredient_name,
- Column18 as manufacturer,
- Column19 as distributor,
- Column20 as dos_str



5. Click the "Stack column chart" under "Visualizations" -> "Add data to your visual"

The screenshot displays the Microsoft Power BI Desktop application window. The title bar reads "Untitled - Power BI Desktop". The ribbon at the top includes tabs for File, Home, Insert, Modeling, View, Optimize, Help, Table tools, and Column tools. The "Column tools" tab is active, showing options for Sort, Data groups, Manage relationships, and New column. The main workspace is titled "Build visuals with your data" and contains a prompt to "Select or drag fields from the Data pane onto the report canvas." The "Visualizations" pane on the right is open, showing a list of visualization types. The "Stacked column chart" is highlighted with a red box. Below the visualization types, there are sections for "Values" (with a text box "Add data fields here"), "Drill through" (with a text box "Add drill-through fields here"), and "Cross-report" (with a toggle switch set to "Off"). The "Data" pane on the right shows a list of fields under the "output" table, including "dos_str", "drug_name", "ingredient_name", "manufacturer", "number_of_pills", "pharmacy", "product_name", "quantity", "state", "transaction_date", "transaction_id", and "zip". The "dos_str" field is selected. The status bar at the bottom indicates "Page 1 of 1" and a zoom level of "40%".

6. Drag the "distributor" and the "number_of_pills" fields to the "Stack column chart"

The screenshot shows the Power BI Desktop interface. The main area displays a Stack column chart with six bars of varying heights. The 'Data' pane on the right lists fields under the 'output' table. The 'distributor' field is highlighted with a red box, and the 'number_of_pills' field is also highlighted with a red box. The 'Visualizations' pane on the left shows the 'Stack column chart' selected. The top ribbon includes tabs for File, Home, Insert, Modeling, View, Optimize, Help, Format, and Data / Drill. The bottom status bar indicates 'Page 1 of 1' and a zoom level of 51%.

Power BI Desktop interface showing a Stack column chart. The chart displays six bars of varying heights. The 'Data' pane on the right lists fields under the 'output' table. The 'distributor' field is highlighted with a red box, and the 'number_of_pills' field is also highlighted with a red box. The 'Visualizations' pane on the left shows the 'Stack column chart' selected. The top ribbon includes tabs for File, Home, Insert, Modeling, View, Optimize, Help, Format, and Data / Drill. The bottom status bar indicates 'Page 1 of 1' and a zoom level of 51%.

7. Click on "Top N" under "Filters" -> "distributor" -> "Basic filtering"

The screenshot displays the Power BI Desktop interface. The main visual is a bar chart titled 'Sum of number_of_pills by distributor'. The x-axis represents the 'distributor' and the y-axis represents the 'Sum of number_of_pills'. The chart shows a descending list of distributors based on the total number of pills. The 'Filters' pane on the right is open, showing the 'distributor' field selected under 'Filters on this visual'. The 'Filter type' is set to 'Basic filtering', and the 'Top N' option is selected. The 'Data' pane on the far right shows the 'output' table with various fields, including 'distributor' and 'number_of_pills'.

Untitled - Power BI Desktop

File Home Insert Modeling View Optimize Help Format Data / Drill

Paste Get data (Excel workbook, Data hub, SQL Server) Enter data (Dataverse, Recent sources) Transform data Refresh New visual Text box More visuals New measure Quick measure Sensitivity Publish

Clipboard Data Queries Insert Calculations Sensitivity Share

Visualizations

Filters

Search

Filters on this visual

distributor

is (All)

Filter type

Basic filtering

Advanced filtering

Basic filtering

Top N

Require single selection

Sum of number_of_pills is (All)

Add data fields here

Filters on this page

Add data fields here

Page 1

Page 1 of 1

38%

8. Enter "10" next to the "Top" dropdown and drag the "number_of_pills" field to the "By value" box.

The screenshot shows the Power BI Desktop interface. The main visual is a bar chart titled "Sum of number_of_pills by distributor". The x-axis lists various distributors, and the y-axis shows the sum of the number of pills. The chart is sorted in descending order. The 'Filters' pane on the right shows the following settings:

- Search: [Empty]
- Filters on this visual: distributor is (All)
- Filter type: Top N
- Show items: Top 10
- By value: Sum of number_of_pills
- Sum of number_of_pills is (All)
- Filters on this page: [Empty]
- Filters on all pages: [Empty]

The 'Data' pane on the right shows the following fields:

- output
 - ☐ addl_co_info
 - ☐ address1
 - ☐ address2
 - ☐ calc_base_wt_in...
 - ☐ city
 - ☐ county
 - ☐ dea_no
 - ☒ distributor
 - ☐ dos_str
 - ☐ drug_name
 - ☐ ingredient_name
 - ☐ manufacturer
 - ☒ Sum of number_of_pills
 - ☐ pharmacy
 - ☐ product_name
 - ☐ quantity
 - ☐ state
 - ☐ transaction_date
 - ☐ transaction_id
 - ☐ zip

9. Click the "Apply filter" button

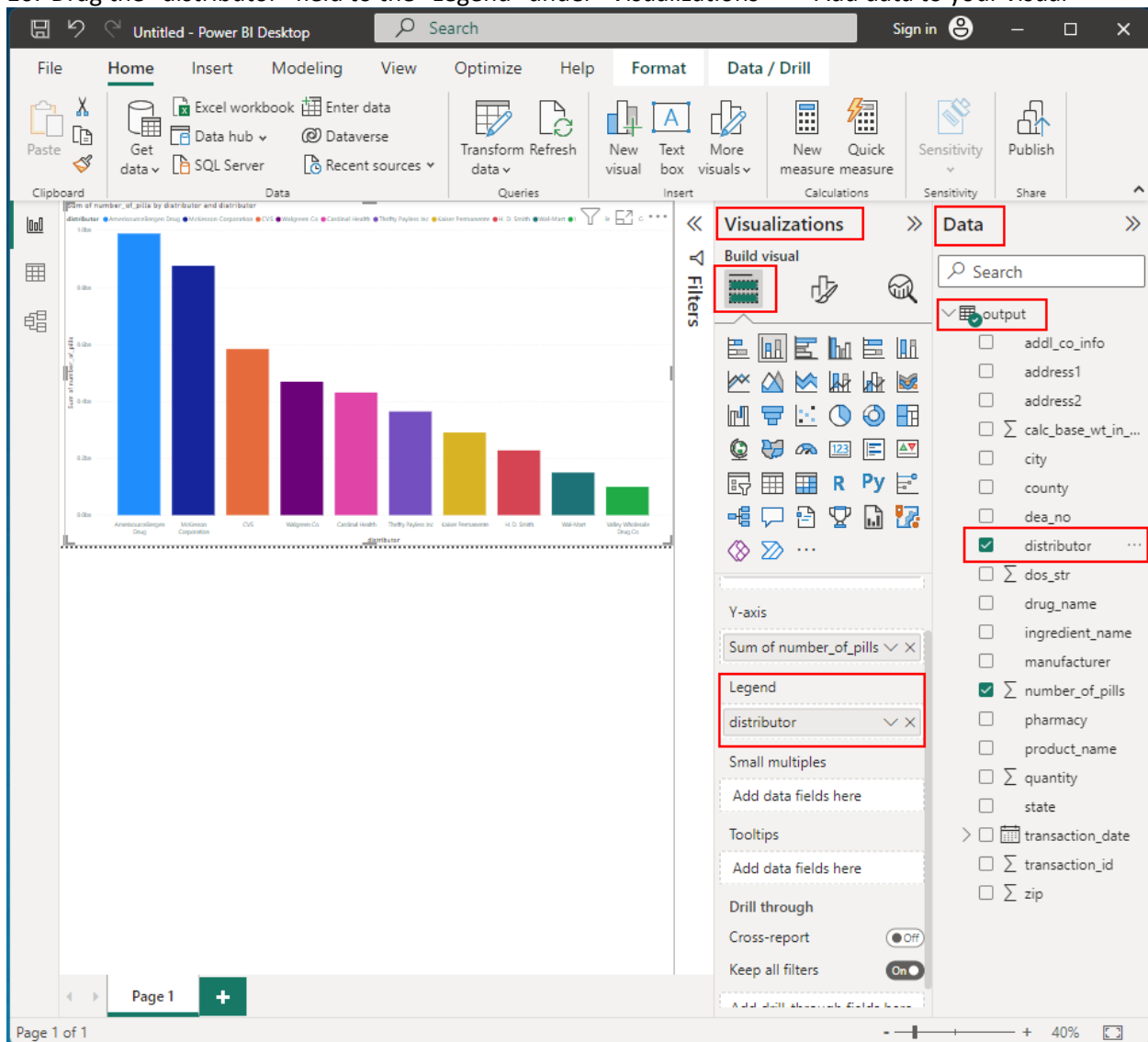
The screenshot displays the Microsoft Power BI Desktop interface. The main workspace shows a bar chart titled "Sum of number_of_pills by distributor". The x-axis is labeled "distributor" and lists various pharmaceutical companies. The y-axis is labeled "Sum of number_of_pills" and ranges from 0.00 to 1000. The chart shows a descending order of pill counts by distributor.

The right-hand pane is divided into two sections: "Filters" and "Data". The "Filters" section is active, showing a search bar and a list of filters. The first filter is "distributor is (All)" with a filter type of "Top N". The "Show items" dropdown is set to "Top" and the value is "10". The "By value" dropdown is set to "Sum of number_of_pills". The "Apply filter" button is highlighted with a red box.

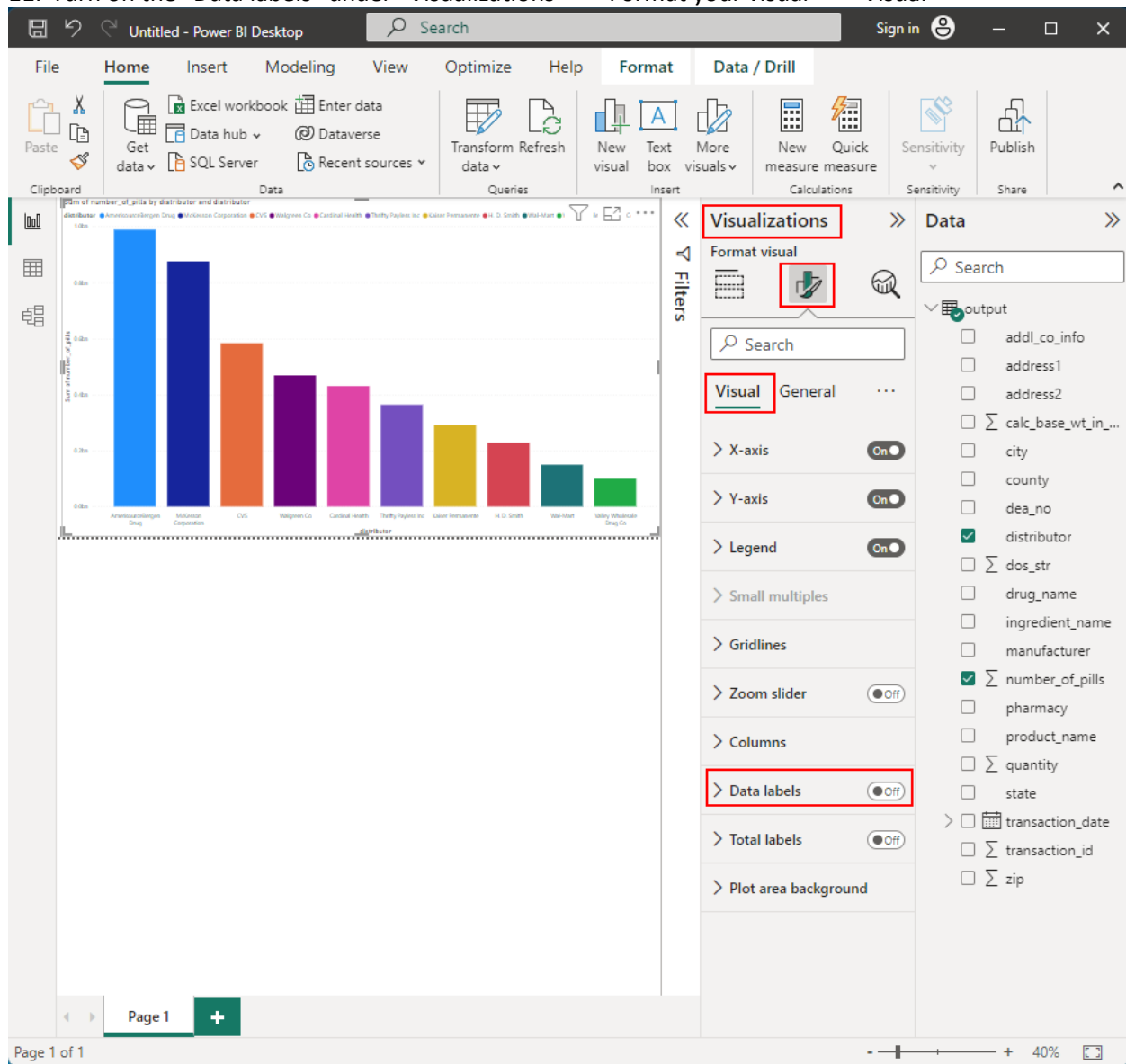
The "Data" section shows a list of data fields under the "output" table. The fields are: addl_co_info, address1, address2, calc_base_wt_in..., city, county, dea_no, distributor (checked), dos_str, drug_name, ingredient_name, manufacturer, number_of_pi... (checked), pharmacy, product_name, quantity, state, transaction_date, transaction_id, and zip.

The bottom status bar indicates "Page 1 of 1" and a zoom level of 38%.

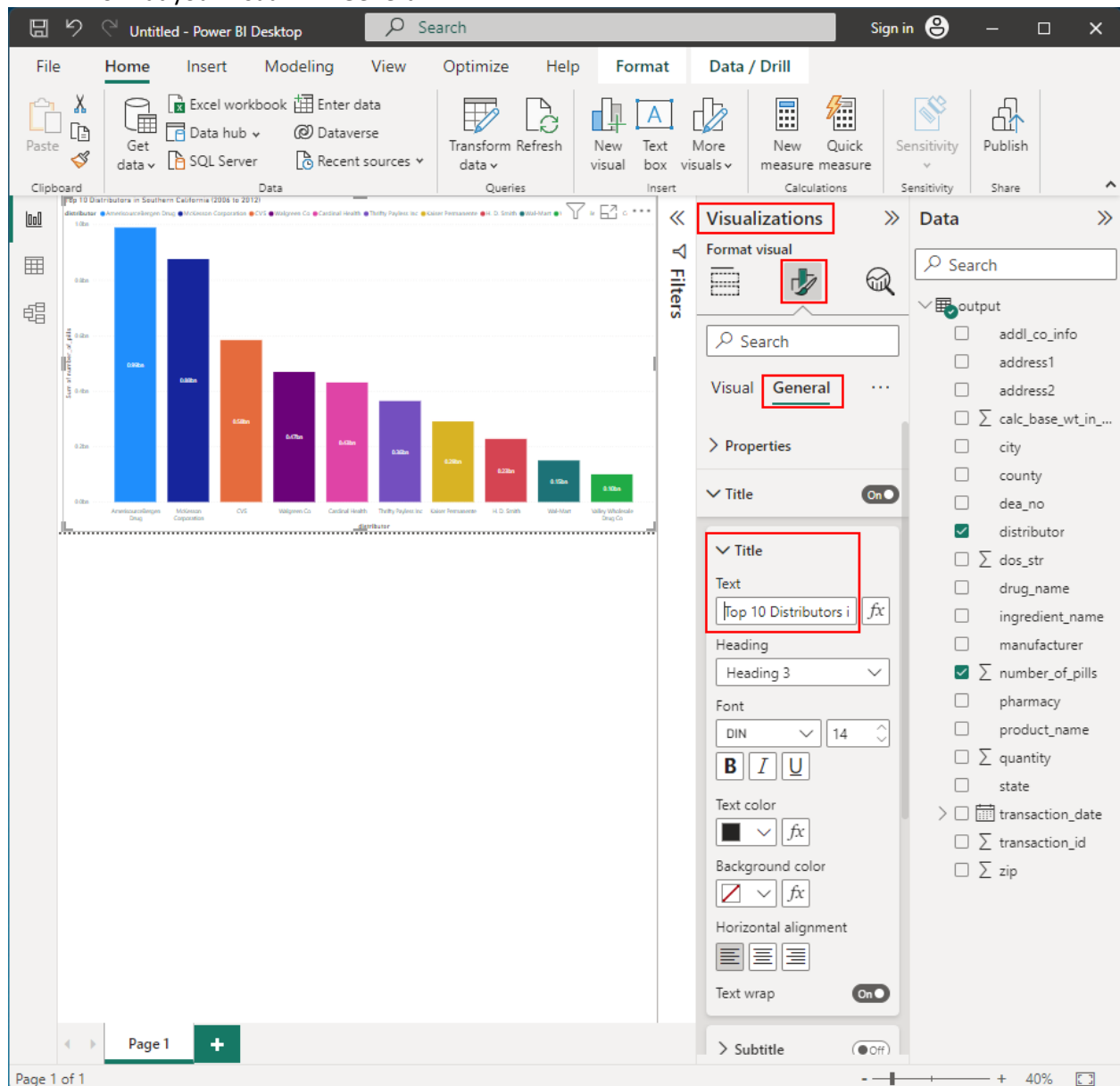
10. Drag the "distributor" field to the "Legend" under "Visualizations" -> "Add data to your visual"



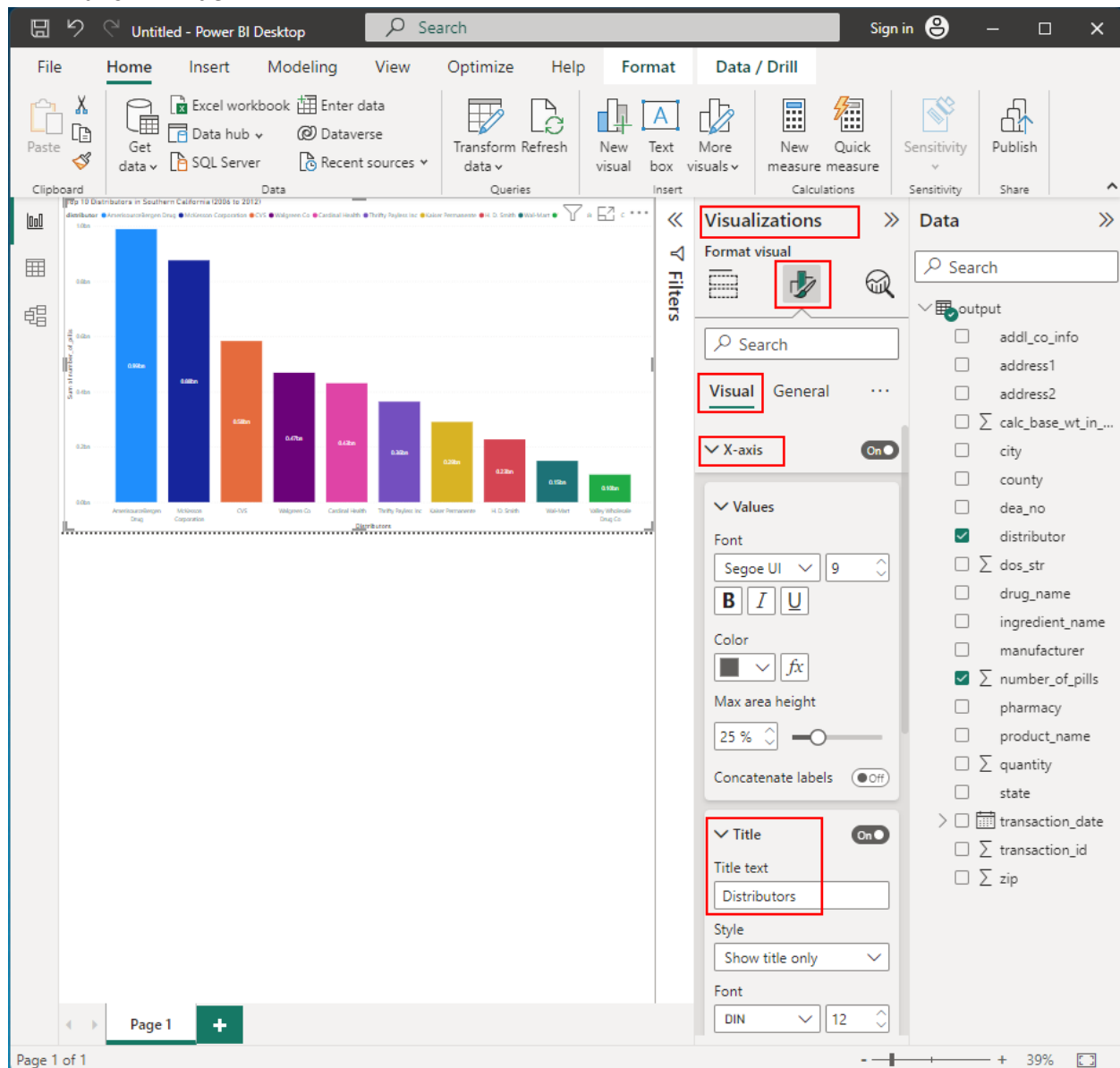
11. Turn on the "Data labels" under "Visualizations" -> "Format your visual" -> "Visual"



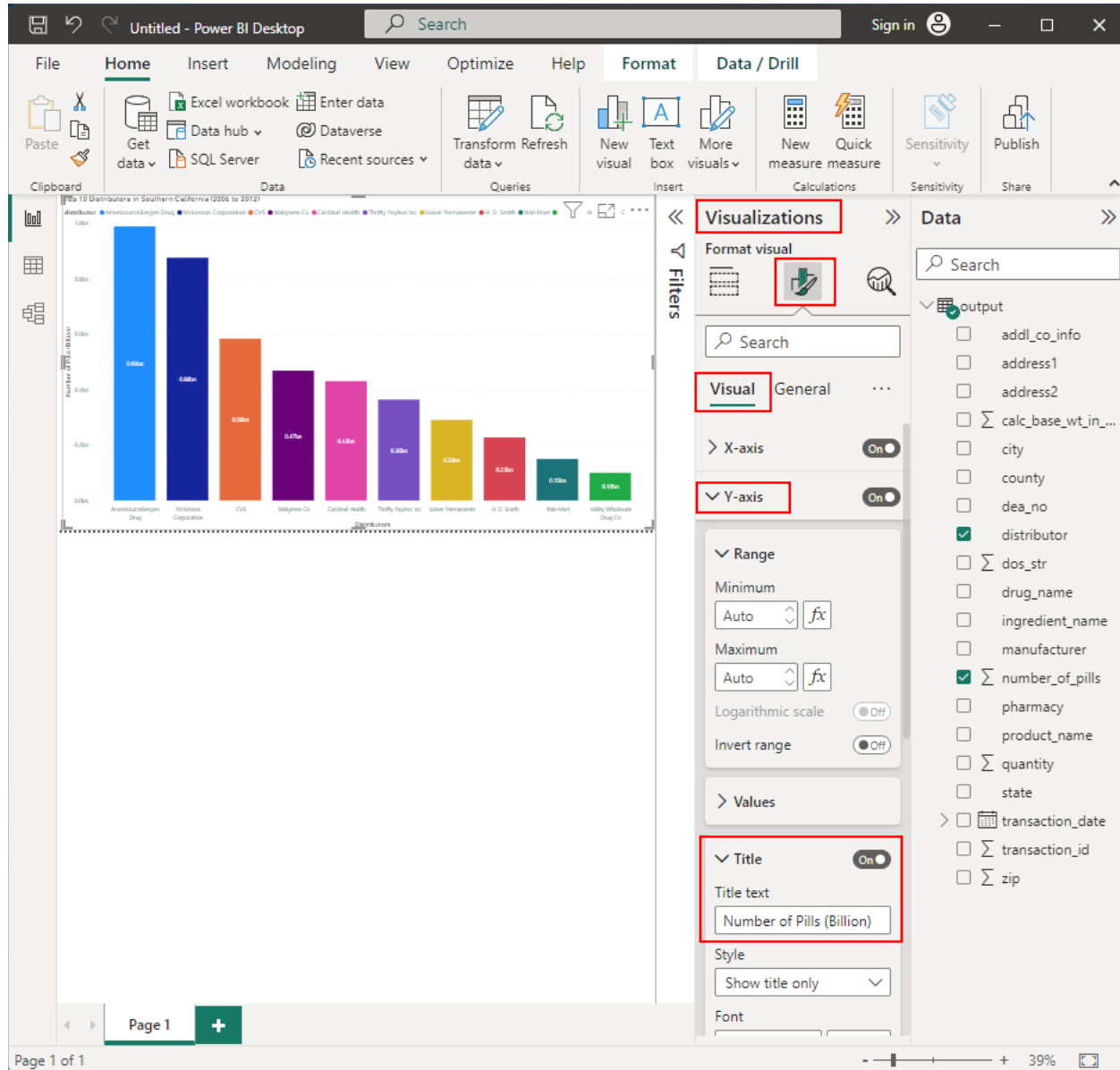
12. Change the title to "Top 10 Distributors in Southern California (2006 to 2012)" under "Visualizations"
 -> "Format your visual" -> "General"



13. Change the X-axis title to "Distributors" under "Visualizations" -> "Format your visual" -> "Visual" -> "X-axis" -> "Title"



14. Change the Y-axis title to "Number of Pills (Billion)" under "Visualizations" -> "Format your visual" -> "Visual" -> "Y-axis" -> "Title"



15. Repeat steps 6 to 14 to create a Top 10 chart for manufacturers, pharmacies, and products.

References

16. Data Source: <https://www.washingtonpost.com/graphics/2019/investigations/dea-pain-pill-database/>
17. Github: <https://github.com/vcheung621/cis4560>
18. References: <https://www.kaggle.com/datasets/paultimothymooney/pain-pills-in-the-usa>