

GitHub Repository

https://github.com/sriramrao1/exercise_1/

This is a public repository. So you should be able to make Pull requests.
I have provided 'DwMclary' with access to contribute as well.

Data Source

In the load_data_lake.sh script, I am downloading the data from the CMS Hospital Compare website every time.

Files Used:

File Name	Description	Renamed file name
Hospital General Information.csv	General Hospital information	hospitals.csv
Timely and Effective Care - Hospital.csv	Procedure data	effective_care.csv
Readmissions and Deaths - Hospital.csv	Procedure data	readmissions.csv
Measure Dates.csv	Mapping of measures to codes	measures.csv
hvpb_hcahps_10_28_2015.csv	Example survey response data	surveys_responses.csv

Please note that one of the files listed in the exercise “**hvpb_hcahps_05_28_2015.csv**” has been replaced with “**hvpb_hcahps_10_28_2015.csv**”. My scripts use the updated file.

Query Processing Engine Used

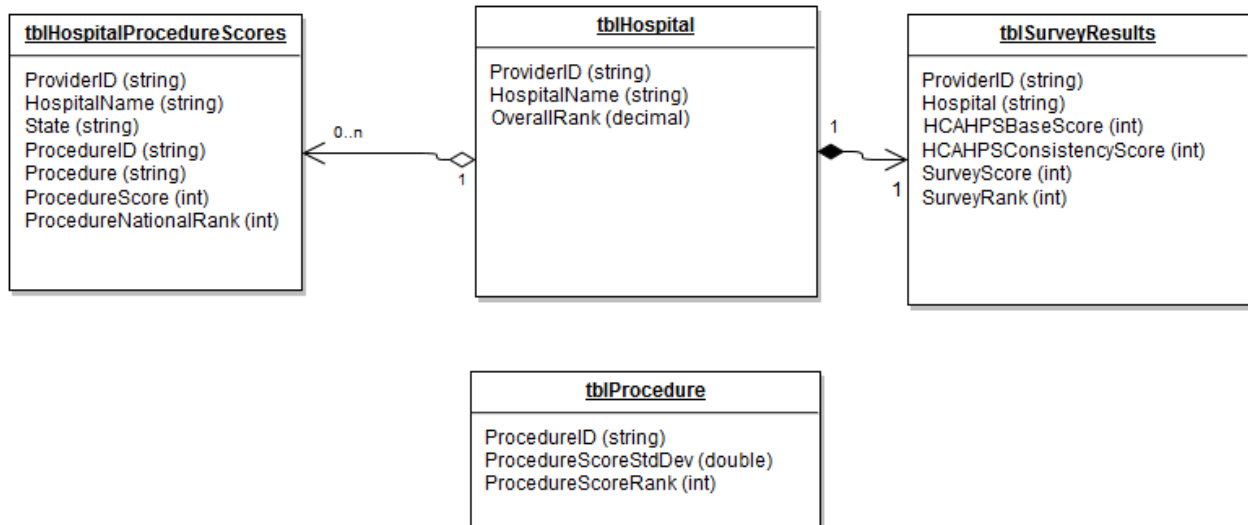
- I have used Hive as the processing engine, due to my familiarity with SQL.
- The queries take longer to execute than PySpark.

Instructions to run the Transformation Scripts

Run the files in this order:

1. tblHospitalProcedureScores.sql
2. tblProcedure.sql
3. tblSurveyResults.sql
4. tblHospital.sql

ERD for the Transformation Tables



Analytical Reasoning Logic

The Hospital Compare project provides several files with a number of measures to assess the quality of care at each of the hospitals assessed.

However for this exercise, I have chosen the “Effective Care” (**Timely and Effective Care - Hospital.csv**) set of measures and the “Readmission Death” (**Readmissions and Deaths - Hospital.csv**) set of measures to rank the hospitals.

However, the logic for scores provided for “Effective Care” measures is totally different from those for the “Readmission Death” measures. For example, an effective care measure is AMI_10 (**Statin at Discharge**) where the best practice is to prescribe statin during discharge of a patient with Heart Attack. So if Statin was prescribed to the patient at the time of discharge by the hospital, a high score is provided to the hospital. On the contrary, a high score for a “Readmission Death” measure such as Acute Myocardial Infarction (AMI) 30-Day Mortality Rate indicates that the hospital has a high mortality rate for patients admitted to the hospital for AMI.

Due to this, we cannot directly sum up scores for the Effective Care and Readmission Death measures and use them for the best hospitals assessment.

Therefore I have attempted to rank the hospitals separately for “Effective Care” measures and “Readmission Death” measures based on **high scores** for “Effective Care” measures and **low scores** for “Readmission Death” measures.

Effective Care

Please see attached screenshot. The last two columns provide the raw score and rank of the hospital for the procedure. As you can see as the raw score **increases**, the hospital receives a better rank

```
select providerid, hospitalname, state, procedureid, procedurescore, ProcedureNationalRank from
tblHospitalProcedureScores where procedureid like '%OP_21%' order by ProcedureNationalRank limit 20;
```

W205 – EXERCISE 1 – SRIRAM RAO

```
w205@ip-172-31-51-111:~/exercise1/exercise_1/investigations/hospitals_and_patients
2016-02-28 20:21:36,322 Stage-1 map = 100%, reduce = 100%, Cumulative CPU 5.75 sec
MapReduce Total cumulative CPU time: 5 seconds 750 msec
Ended Job = job_1456673649275_0066
MapReduce Jobs Launched:
Stage-Stage-1: Map: 1 Reduce: 1 Cumulative CPU: 5.75 sec HDFS Read: 14427028 HDFS Write: 986 SUCCESS
Total MapReduce CPU Time Spent: 5 seconds 750 msec
OK
90006 PROVIDENCE HOSPITAL DC OP_21 168 1
450289 HARRIS HEALTH SYSTEM TX OP_21 146 2
190098 UNIVERSITY HEALTH SHREVEPORT LA OP_21 142 3
110165 SOUTHERN REGIONAL MEDICAL CENTER GA OP_21 138 4
50104 SAINT FRANCIS MEDICAL CENTER CA OP_21 132 5
10095 HALE COUNTY HOSPITAL AL OP_21 132 5
330221 WYCKOFF HEIGHTS MEDICAL CENTER NY OP_21 131 7
440152 REGIONAL ONE HEALTH TN OP_21 130 8
140300 PROVIDENT HOSPITAL OF CHICAGO IL OP_21 129 9
50724 BAKERSFIELD HEART HOSPITAL CA OP_21 129 9
190006 UNIVERSITY HOSPITAL & CLINICS LA OP_21 128 11
30011 ST JOSEPH'S HOSPITAL AZ OP_21 124 12
450029 LAREDO MEDICAL CENTER TX OP_21 124 12
330201 KINGSBROOK JEWISH MEDICAL CENTER NY OP_21 124 12
50390 HEMET VALLEY MEDICAL CENTER CA OP_21 121 15
180067 UNIVERSITY OF KENTUCKY HOSPITAL KY OP_21 121 15
100030 HEALTH CENTRAL FL OP_21 120 17
50438 HUNTINGTON MEMORIAL HOSPITAL CA OP_21 119 18
220086 BETH ISRAEL DEACONESS MEDICAL CENTER MA OP_21 116 19
380002 ASANTE THREE RIVERS MEDICAL CENTER OR OP_21 114 20
Time taken: 23.776 seconds, Fetched: 20 row(s)
hive>
```

Readmission Death

Please see attached screenshot. The last two columns provide the raw score and rank of the hospital for the procedure. As you can see as the raw score [decreases](#), the hospital receives a better rank

select providerid, hospitalname, state, procedureid, procedurescore, ProcedureNationalRank from tblHospitalProcedureScores where procedureid like '%MORT_30_AMI%' order by ProcedureNationalRank limit 20;

```
w205@ip-172-31-51-111:~/exercise1/exercise_1/investigations/hospitals_and_patients
2016-02-28 20:43:34,247 Stage-1 map = 100%, reduce = 100%, Cumulative CPU 5.43 sec
MapReduce Total cumulative CPU time: 5 seconds 430 msec
Ended Job = job_1456673649275_0067
MapReduce Jobs Launched:
Stage-Stage-1: Map: 1 Reduce: 1 Cumulative CPU: 5.43 sec HDFS Read: 14427040 HDFS Write: 1078 SUCCESS
Total MapReduce CPU Time Spent: 5 seconds 430 msec
OK
50755 SHERMAN OAKS HOSPITAL CA MORT_30_AMI 9 1
140281 NORTHWESTERN MEMORIAL HOSPITAL IL MORT_30_AMI 10 2
230269 BEAUMONT HOSPITAL, TROY MI MORT_30_AMI 10 2
520089 MERITER HOSPITAL WI MORT_30_AMI 10 2
230156 ST JOSEPH MERCY HOSPITAL MI MORT_30_AMI 10 2
510007 ST MARY'S MEDICAL CENTER WV MORT_30_AMI 10 2
50739 CENTINELA HOSPITAL MEDICAL CENTER CA MORT_30_AMI 10 2
330214 NYU HOSPITALS CENTER NY MORT_30_AMI 10 2
390258 ST MARY MEDICAL CENTER PA MORT_30_AMI 10 2
260138 ST LUKES HOSPITAL OF KANSAS CITY MO MORT_30_AMI 10 2
310001 HACKENSACK UNIVERSITY MEDICAL CENTER NJ MORT_30_AMI 10 2
390080 JEANES HOSPITAL PA MORT_30_AMI 11 12
140290 ST ALEXIUS MEDICAL CENTER IL MORT_30_AMI 11 12
450040 COVENANT MEDICAL CENTER TX MORT_30_AMI 11 12
330169 BETH ISRAEL MEDICAL CENTER NY MORT_30_AMI 11 12
50099 SAN ANTONIO REGIONAL HOSPITAL CA MORT_30_AMI 11 12
100087 SARASOTA MEMORIAL HOSPITAL FL MORT_30_AMI 11 12
360077 FAIRVIEW HOSPITAL OH MORT_30_AMI 11 12
50625 CEDARS-SINAI MEDICAL CENTER CA MORT_30_AMI 11 12
520070 MAYO CLINIC HEALTH SYSTEM EAU CLAIRE HOSPITAL WI MORT_30_AMI 11 12
Time taken: 23.667 seconds, Fetched: 20 row(s)
hive>
```

Best Hospitals - Overall Ranking of the hospital

What hospitals are models of high-quality care? That is, which hospitals have the most consistently high scores for a variety of procedures.

To assess the best quality hospital, we obtain a mean of the ranks obtained by the hospital for each of the procedures it performs. The overall mean rank of the hospitals are stored in the tblHospital table.

There are several items to note with this ranking mechanism:

- All procedures are weighted equally. So a hospital that receives first rank in a complex procedure such as heart surgery, is weighted the same as another hospital that receives first rank for flu treatment
- With the overall mean rank being derived as an average over the ranks of all procedures performed, a specialty hospital that performs one procedure exceptionally well will receive a higher overall rank than a general hospital that provides several procedures. In our analysis, the Children's Hospitals and Surgical Specialty hospitals ranked high overall compared to other general hospitals.
- The ranking just accounts for the raw scores for the procedure and does not account for the complexity and number of procedures being performed. So a hospital that handles more complicated procedures or handles a large number of cases, does not deserve any special treatment.

Best States

What states are models of high-quality care?

I utilize the average of the rank of the hospitals in the State to derive the States that provide the best quality of care in the nation. That is a State with a group of high quality hospitals must provide a higher quality of care overall.

Hospital Variability

Which procedures have the greatest variability between hospitals?

Here I use the Standard Deviation of the raw scores of each measure or procedure to assess the variability in the scores for the same procedures performed at different hospitals.

I could not locate the exact range of the scores in the data dictionary. Hence I made an assumption that the raw scores provided across several procedures are over the same range of scores. The standard deviation values are then comparable across procedures.

Based on ordering the procedures with the top 10 standard deviation values, we get the 10 procedures with the most variability between hospitals.

Hospitals and Patients

Are average scores for hospital quality or procedural variability correlated with patient survey responses?

The two parameters that we correlate to answer this question are:

1. The hospital evaluation scores provided by the evaluators by procedure.

2. The survey result scores provided by the patients.

For the hospital evaluation ranking - we have already ranked the hospitals based on the procedure level scores. This is stored in the tblHospital table.

To derive the survey ranking, we use the HCAHPS Base Score, HCAHPS Consistency Scores. The combined HCAHPS Base Score, HCAHPS Consistency Score is used by CMS to determine the Patient Experience of Care domain portion of the Medicare reimbursement. So we use that as the model to assess the survey responses. We rank the hospitals based on the combined survey score. This is stored in the tblSurveyResults.sql table.

Please note that the survey results file (**hvbp_hcahps_10_28_2015.csv**) only provides data for 3041 hospitals as opposed to 4500+ hospital records in the “Timely and Effective Care - Hospital.csv” and “Readmissions and Deaths - Hospital.csv” files. Hence the correlation coefficient is being derived only for 3041 hospitals.

The correlation coefficient is 0.10767957813957273.

This low value of the correlation coefficient indicates **low positive correlation** between hospital quality scores and patient survey responses.