

SIIM Data Mining Lab Draft
SIIM 2016 v 20160621

Friday, July 1 | 12:45 pm – 2:45 pm Meeting Room E145-146

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Idea: Give Students real world experience using data mining tools with messy data

Materials:

- Laptop
- Internet
- Software: Open Refine version 2.5
- Data file named: SIIM2016_Messy_Fake_EMRdata.csv

Downloading Open Refine - Prerequisite steps:

1. Go to <http://www.openrefine.org>
2. Scroll down to Download Open Refine
3. Select the appropriate operating system for your computer and download and install the latest version (Last stable release is Refine v 2.5).
4. Open "Refine" and verify installation was successful:

Note about information security:

Please observe and follow all institutional, state and national security precautions and legal requirements when working with patient data.

All data from Open Refine is stored on your own computer in the workspace directory. To open it, click "Browse workspace directory" on your OpenRefine application home page, by default at <http://127.0.0.1:3333/>

MacOSX:

~/Library/Application Support/Google/Refine/

Logging is to /var/log/daemon.log - grep for com.google.refine.Refine

Windows: Depending on OS version, stored in one of these directories:

C:\Documents and Settings\{user id}\Local Settings\Application Data\Google\Refine

C:\Users\{user id}\AppData\Roaming\Google\Refine

C:\Users\{user id}\Google\Refine

Linux:

~/local/share/google/refine/

Open Refine Documentation: <http://openrefine.org/OpenRefine/documentation>

Lab #1: Introduction to open refine (formerly Google Refine)

Scenario: You are a data analyst at the Southern Immediate Innovation Medical System (SIIM). You have been asked to provide volume data across several sites including an academic medical center, a private practice site and a community hospital that are a part of the SIIM system. The hospital system shares the same registration system (so patients have a unique MRN) and the same RIS (so individually unique accession numbers), however they have a mixture of resource names and modality type has been excluded from your report.

As an analyst, you are presented with multi-institution data dump from ACME RIS.

Goal #1: Normalize data dump with Google refine tools.

Goal #2: Figure out what the annual volumes are per modality per site to send back to your administrative team.

Lab Steps:

1. Before you start, make sure you have downloaded Refine tools as described in the lab prerequisites. If you have Refine installed, move to the next step.
2. Download a file named SIIM2016_Messy_Fake_EMRdata.csv and save to your desktop.
3. Load the data into Refine by selecting: “Create a project”, and “get data from This Computer” and Choose the location of the file (your desktop).
4. Hit Next (the system will upload the data and show you a preview).
5. In the “Project Name” field, rename the project to SIIM Lab 1 and hit Create Project.
6. You should now see a view of your project sorted by various column headers. (see sample image below).

	id	resource	accession	MRN	dob	patient_name	arrival_time	complete_time	patient_gender	procedure_code	first_image_time	first_final_time	procedure_description
1.	32988	BRCTRMG	32765	32783	1944-07-11	Keller*Ormin*O'Donna**	2011-02-03T10:37:33Z	2011-02-03T12:03:00Z	F	MG-3402	2011-02-03T11:00:00Z	2011-02-05T21:39:00Z	Stereotact guide for brst bx
2.	32989	BRCTRMG	32766	32784	1952-07-21	Rosler*Verlone*Orliff**	2011-02-03T11:57:27Z	2011-02-03T12:38:30Z	M	MG-3399	2011-02-03T12:10:00Z	2011-02-05T03:02:30Z	Diagnosticmammarydigital
3.	32870	BRCTRMG	32767	32785	1981-08-21	HayDon*VerNon*Brode**	2011-02-03T12:42:57Z	2011-02-03T13:32:00Z	M	MG-3407	2011-02-03T13:00:30Z	2011-02-05T23:08:00Z	Diagnosticmammarydigital
4.	32871	BRCTRMG	32768	32786	1933-01-14	Magern*Dejan*TrinityMichaelJose**	2011-02-03T13:32:27Z	2011-02-03T14:21:30Z	M	MG-3400	2011-02-03T13:50:00Z	2011-02-05T04:49:30Z	Diagnosticmammarydigital
5.	32872	BRCTRMG	32769	32787	1963-08-08	Zander*Levin*Sadler**	2011-02-03T14:27:52Z	2011-02-03T15:14:00Z	M	MG-3407	2011-02-03T14:48:30Z	2011-02-05T05:50:00Z	Diagnosticmammarydigital
6.	32873	BRCTRMG	32770	32788	1970-03-14	Elton*Lenore*DeRuff**	2011-02-03T15:03:27Z	2011-02-03T16:18:00Z	M	MG-3403	2011-02-03T15:21:00Z	2011-02-05T06:42:00Z	Stereotact guide for brst bx
7.	32874	BRCTRMG	32771	32789	1952-09-29	Joyane*Rae*Jeanne*Ambrose**	2011-02-03T16:21:27Z	2011-02-03T17:05:30Z	F	MG-3400	2011-02-03T16:34:00Z	2011-02-05T07:29:30Z	Diagnosticmammarydigital
8.	32875	BRCTRMG	32772	32790	1926-08-11	Murray*Kath*Marina**	2011-02-03T17:05:57Z	2011-02-03T17:34:15Z	M	MG-2869	2011-02-03T17:18:30Z	2011-02-05T07:58:15Z	Cad breast mri
9.	32876	BRCTRMG	32773	32791	1959-09-11	Marva Dawn*Hanna*Markelou**	2011-02-03T17:39:43Z	2011-02-03T18:00:15Z	F	MG-3402	2011-02-03T17:57:15Z	2011-02-05T04:36:15Z	Stereotact guide for brst bx
10.	32877	BRCTRMG	32774	32792	1965-11-28	Lary*Rinda*DeNorris**	2011-02-03T18:56:43Z	2011-02-03T19:37:45Z	M	MG-3407	2011-02-03T18:08:15Z	2011-02-05T05:13:45Z	Diagnosticmammarydigital

7. Remember, your goal is to determine modality volumes. Start by looking at the Resource column. You can look through many different views of your data by a) selecting number of rows to display and b) looking through each sheet by selecting “next” on the upper right hand side.

8. Reviewing your data shows a variety of resource names
9. Select the drop down arrow next to “resource” and choose “facet” then “text facet”.
10. You should now see the resources broken down by resource name and number sorted by frequency. Note now you also see the number of resource names (Qty. 12). (see image below)

Google refine SIIM Lab 1 Permalink

Facet / Filter		Undo / Redo		17629 rows					
Refresh		Reset All		Remove All		Show as: rows records Show: 5 10 25 50 rows			
resource change 12 choices Sort by: name count Cluster				All id resource accession MRN dob					
BRCTRMG 1098				1.	32668	BRCTRMG	32765	32783	1944-07-11
CT_MAIN 1057				2.	32669	BRCTRMG	32766	32784	1952-07-21
FAST_CT 1079				3.	32670	BRCTRMG	32767	32785	1981-08-21
FAST_MR 813				4.	32671	BRCTRMG	32768	32786	1933-01-14
MAINCR 2534				5.	32672	BRCTRMG	32769	32787	1963-08-06
Mammo-2 1113				6.	32673	BRCTRMG	32770	32788	1970-03-14
MRI_MAIN 822				7.	32674	BRCTRMG	32771	32789	1952-09-29
newCT 1087				8.	32675	BRCTRMG	32772	32790	1926-09-08
newMRI 815				9.	32676	BRCTRMG	32773	32791	1959-09-11
TRCT1 2347				10.	32677	BRCTRMG	32774	32792	1965-11-28
TRCT2 2376				11.	32678	BRCTRMG	32775	32793	2000-02-01
				12.	32679	BRCTRMG	32776	32794	1969-10-17

11. Clicking on each facet on the left hand side will take you to the related data for each facet. Click on TRCT1. Look at the procedure description on the right hand side. This is clearly a CT scanner!
12. What kind of resource is BRCTRMG? Click on the facet name BRCTRMG and the related data for the facet will appear.
13. The resource names are messy. Let's try something more readable. You call your friendly neighborhood PACS Administrator who knows the resource names and where they are located. Highlight the resource name over BRCTRMG and click “edit”. Rename this to UMG1. (see figure below)

Google refine SIIM Lab 1 Permalink

Facet / Filter Undo / Redo 0

Refresh Reset All Remove All

17629 rows

Show as: rows records Show: 5 10 25 50 rows

resource change

12 choices Sort by: name count Cluster

BRCTRMG 1098
CT_MAIN 1057
FAST_CT 1079
FAST_MR 813
MAINCR 2534
Mammo-2 1113
MRI_MAIN 822
newCT 1087

UMammo1

Apply Cancel

Enter Esc

		id	resource	accession	MRN	dob
1.	32668	BRCTRMG	32765	32783	1944-07-11	
2.	32669	BRCTRMG	32766	32784	1952-07-21	
7.	32674	BRCTRMG	32771	32789	1952-09-29	
8.	32675	BRCTRMG	32772	32790	1926-09-08	
9.	32676	BRCTRMG	32773	32791	1950-09-11	

14. Let's use a convention to name resources:

Location: One or two letter location U,C,P,TR

Modality: Two letter modality description (CR, MR)

Number: In order of progression. Rename the rest of your resources to friendly names (and buy the PACS administrator lunch) as follows:

- Mammo-2 -> CMG1
- XRAY -> UCR1
- MAINCR -> CCR1
- MRI_MAIN -> UMR1
- newMRI -> CMR1
- FAST_MR -> PMR1
- TRCT1 -> TCT1
- TRCT2 -> TCT2
- CT_MAIN -> UCT1
- newCT -> CCT1
- FAST_CT -> PCT1

Now that we have the resource data in a more reasonable format, it's easy to see volumes per site per modality. When you are done, your resource facet should look like this:

Google refine SIIM Lab 1 [Permalink](#)

Facet / Filter Undo / Redo 23

Refresh Reset All Remove All

☒ resource change invert reset

12 choices Sort by: name count Cluster

CCR1 2534 exclude

CCT1 1087

CMG1 1113

CMR1 815

PCT1 1079

PMR1 813

TCT1 2347

TCT2 2376

UCR1 2488

UCT1 1057

UMG1 1098

UMR1 822

Facet by choice counts

2534 matching rows (17629 total)

Show as: rows records Show: 5 10 25

<input type="checkbox"/> All	<input type="checkbox"/> id	<input type="checkbox"/> resource	<input type="checkbox"/> loc
<input type="checkbox"/> 4700.	37367	CCR1	true
<input type="checkbox"/> 4701.	37368	CCR1	true
<input type="checkbox"/> 4702.	37369	CCR1	true
<input type="checkbox"/> 4703.	37370	CCR1	true
<input type="checkbox"/> 4704.	37371	CCR1	true
<input type="checkbox"/> 4705.	37372	CCR1	true
<input type="checkbox"/> 4706.	37373	CCR1	true
<input type="checkbox"/> 4707.	37374	CCR1	true
<input type="checkbox"/> 4708.	37375	CCR1	true
<input type="checkbox"/> 4709.	37376	CCR1	true


15. Let's clean up the data a bit more. Click the "x" on the resource facet. The left hand side of your refine lab should be blank now (no facets or filters showing).

16. Click on the drop down arrow next to the resource column, choose "edit column", then "Split into several columns". This will give us a number of ways to split up the data. We are going to select "by field lengths" and enter 1, 2. Before you press OK, be sure to unselect the "remove this column" button in the "After Splitting" section of the window. You should now see two new columns (resource 1, and resource 2).

Facet / Filter

Undo / Redo 37

Using facets and filters












Use facets and filters to select subsets of your data to act on. Choose facet and filter methods from the menus at the top of each data column.

Not sure how to get started?
[Watch these screencasts](#)

17629 rows

Show as: rows records Show: 5 10 25 50 rows

▼ All	▼ id	▼ resource	▼ resource 1	▼ resource 2	▼ accession	▼ MRN	▼ dob	▼ patient_name	
☆ 	1.	32668	UMG1	U	MG	32765	32783	1944-07-11	Kellee*Orminta*Odonna^^
☆ 	2.	32669	UMG1	U	MG	32766	32784	1952-07-21	Rosster*Verlane*Orgill^^
☆ 	3.	32670	UMG1	U	MG	32767	32785	1981-08-21	HayDon*VerNon*Brodie^^
☆ 	4.	32671	UMG1	U	MG	32768	32786	1933-01-14	Magarren*Dejan*TrinityMichaelJosef^^
☆ 	5.	32672	UMG1	U	MG	32769	32787	1963-08-06	Zaquen*LaVon*Seattle^^
☆ 	6.	32673	UMG1	U	MG	32770	32788	1970-03-14	Eldon*Lenace*DeRel^^
☆ 	7.	32674	UMG1	U	MG	32771	32789	1952-09-29	Jorjeane*RaeJeanne*Ambree^^
☆ 	8.	32675	UMG1	U	MG	32772	32790	1926-09-08	Mavrry*Krehl*Marinus^^
☆ 	9.	32676	UMG1	U	MG	32773	32791	1959-09-11	Marva Dawn*Harma*Markielou^^

HELP! - What if I forgot to select “remove this column ?!? – It’s OK, simply select the “undo” tab and select the last step that you performed. Refine keeps a running log of changes so you can easily go backwards!

Facet / Filter
Undo / Redo 13

Extract...
Apply...

filter:

- Create project
- Mass edit 1098 cells in column resource
- Mass edit 1113 cells in column resource
- Mass edit 2488 cells in column resource
- Mass edit 2534 cells in column resource
- Mass edit 822 cells in column resource
- Mass edit 815 cells in column resource
- Mass edit 813 cells in column resource
- Mass edit 2347 cells in column resource
- Mass edit 2376 cells in column resource
- Mass edit 1057 cells in column resource
- Mass edit 1087 cells in column resource
- Mass edit 1079 cells in column resource
- Split 17629 cell(s) in column resource into several columns by field lengths

The Undo-feature!

17. Let's rename these columns. Click on the drop down box next to the "Resource 1" Column, select Edit Column, Rename this Column and rename the column to "Location". Click on the drop down box next to the "Resource 2" Column, select Edit Column, Rename this Column and rename the column to "Modality".

When you are done, your refine window should look like this:

The screenshot shows the Google Refine interface. The top bar indicates the URL: 127.0.0.1:3333/project?project=1747582598813. The main header shows 'Google refine' and 'SIIM Lab 1'. Below the header, there's a 'Facet / Filter' section with 'Undo / Redo 39'. The main table displays 17629 rows. The table has columns: id, resource, location, modality, and accession. The 'location' column is set to 'UMG1' and the 'modality' column is set to 'MG'. A sidebar on the left provides instructions on using facets and filters.

	id	resource	location	modality	accession
1.	32668	UMG1	U	MG	32765
2.	32669	UMG1	U	MG	32766
3.	32670	UMG1	U	MG	32767
4.	32671	UMG1	U	MG	32768
5.	32672	UMG1	U	MG	32769
6.	32673	UMG1	U	MG	32770

18. Now we can create a facet to easily look at global modality volumes, choose the modality column, select facet, text facet and you can now see the total modality volumes across all sites for the period selected.
19. Let's try to look at dates now. The date format is not quite what we need as it's currently a combination of date and time jammed together (e.g 2011-02-03-T10:37:33Z). Let's change the format to something more readable. Let's pretend that we don't care about the time for this report, and we just want to look at arrival date. Click on the arrow next to arrival time, and choose "column, add column based on this column". Let's name this new column arrival_date. In the expression field, let's enter the following expression:

```
value.slice(5, 7) + '/' + value.slice(8, 10) + '/' + value.slice(0, 4)
```

It should look like this (notice if you have it right, refine reports NO SYNTAX ERROR:

Press OK!

Add column based on column arrival_time

New column name

On error ☒ set to blank ☐ store error ☐ copy value from original column

Expression Language Google Refine Expression Language (GREL) ▾

No syntax error.

Preview History Starred Help

row	value	value.slice(5,7)+'/'+value.slice(8,10)+'/'+value.slice(0,4)
1.	2011-02-03T10:37:33Z	02/03/2011
2.	2011-02-03T11:57:27Z	02/03/2011
3.	2011-02-03T12:42:57Z	02/03/2011
4.	2011-02-03T13:32:27Z	02/03/2011
5.	2011-02-03T14:27:57Z	02/03/2011
6.	2011-02-03T15:03:27Z	02/03/2011
7.	2011-02-03T16:04:07Z	02/03/2011

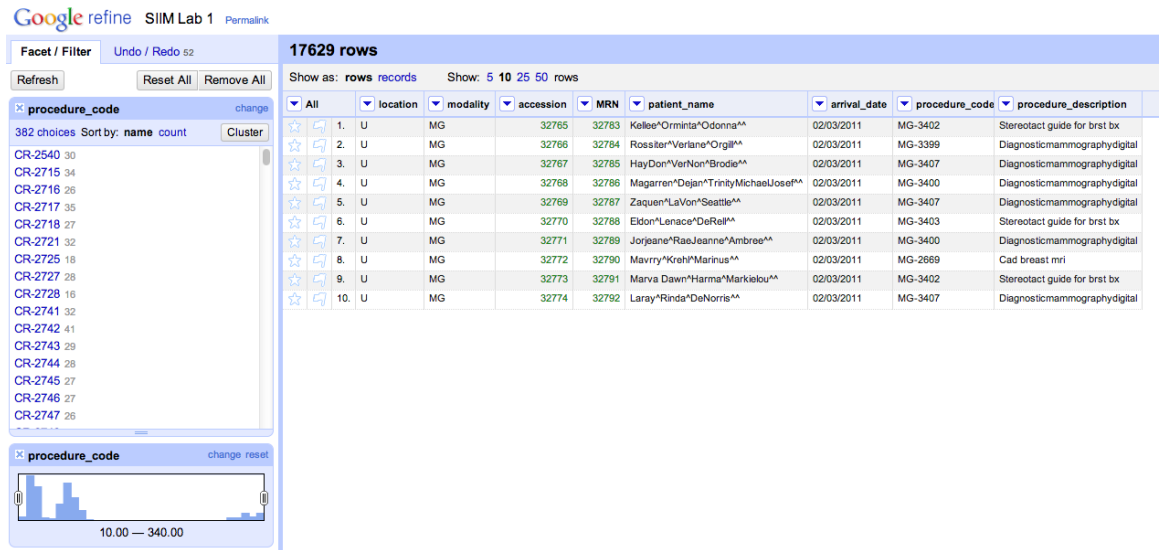
OK Cancel

20. Let's clean up our data display now by getting rid of a few columns. Lets remove a few columns by clicking on Edit Column and remove this column. Remove the following columns:

remove -> first final time
 remove -> first image time
 remove -> complete_time
 remove -> patient gender
 remove -> arrival_time
 remove -> DOB
 remove -> id
 remove -> resource

The list looks much cleaner now, and is broken down by location, modality type, acc#, MRN, name, date, procedure code and procedure description.

21. For fun, lets facet on the procedure code column, select facet and text facet. Scroll to the very bottom of the facet and select "facet by choice counts". You should see a very nice histogram of the frequency of your procedure codes volumes.



- What patterns do you see in your volumes? Clearly there are many procedures that you do a small number of, and a few procedures that you do a high volume of. Drag the slider bars around the histogram to explore the data volumes. What happens if you set the procedure code slider to 110-290? What's happening?
22. Remove all existing facets by clicking on the x. Let's look at the most frequently occurring procedure description. Click on the procedure_description column, then facet, text facet. Click sort by count on the facet to see the most frequently occurring procedure description (what is it?).
 23. Let's see how clean our procedure description names are as they relate to the procedure codes and make sure they match and are unique (e.g. sometimes if you are looking at data from multiple RIS in one report, you may see different descriptions for the same procedure codes). Looking at the procedure description facet you created in step 21, click the cluster button. Then select the metaphone3 method under "Keying Function".
 24. This is essentially refine's function looking for procedure descriptions that may be different words for the same thing. Scroll down to the very bottom, and you will see two fluoroscopy exams. Hover over the two exams and select "browse this cluster". (What do you see? Are these really the same thing?). Close the facet to exit.

- ### References:

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