

@jerrywaller

CODE4LIB 2018 - JERRY WALLER
SYSTEMS LIBRARIAN, ELON UNIVERSITY

OPENREFINE

Begin.

OPENREFINE

Greetings, Earthlings!

I'm Jerry Waller

Systems Librarian Elon University, and I'd like to...

OPENREFINE

Thank you...

it's humbling :)

CODE4LIB 2018

WHY DO WE CLEAN DATA?

Begin.

“DATA COLLECTED BY STATISTICAL AGENCIES MAY CONTAIN MISTAKES MADE DURING THE ACQUISITION, TRANSCRIPTION AND CODING PROCESS.”

**Riera-Ledesma, J., & Salazar-González, J.-J. (2007).
A branch-and-cut algorithm for the continuous
error localization problem in data cleaning*.
Computers & Operations Research, 34(9), 2790.**

Take 7 seconds to read this.

We are neither consistently accurate nor consistently correct when it comes to entering data.

In short, we are imperfect.

OPENREFINE

Steve Lohr
New York Times
August, 2014

For Big-Data Scientists, 'Janitor Work' Is
Key Hurdle to Insights

By STEVE LOHR • AUG. 17, 2014



A sensational headline that underscores the amount of work that goes into data analysis.

I worked retail. I've cleaned my share of toilets.

PPD and biostats. my perspective on this is: Without good data, no good results.

I thought cleaning the data presented its own interesting set of challenges.

The photo features Monica Rogati, Vice President for Data Science at Jawbone

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WORDS OF WISDOM

"It's an absolute myth that you can send an algorithm over raw data and have insights pop up..."

Jeffrey Heer, University of Washington

Lohr, 2014

Hey Siri, clean this data for me.
Unsurprisingly, this will fail.
Turns out cleaning data is a lot of work.

OPENREFINE

WORDS OF WISDOM

“Data wrangling is a huge – and surprisingly so – part of the job... It’s something that is not appreciated by data civilians. At times, it feels like everything we do.”

Monica Rogati, Vice President for Data Science at Jawbone

Lohr, 2014

What this boils down to is that:



The data conform to a standard.

We need to do the best we can to ensure the data we analyze is as standardized as possible.
Cleaning, wrangling, or munging (whatever term you wish) the data is one of those steps.

Goals

goals of today's workshop:
foster a mindset of data stewardship.



Know your data.

In order to establish or conform to a standard, you must be familiar with your data.

Know what “good”
data look(s) like.

This does not mean memorizing every element

Malformed vs. Well-formed

what it means is knowing the difference between well-formed and malformed data



Learn basic steps that are
portable and replicable.

I'm going to talk through the steps needed to get going in openrefine.
this may not make any sense at first, but we'll practice.

Build a foundation.

It's my experience that you're better served learning how to do the basics.
We only have a few hours, and there's no way to cover everything.
I want you learn enough so that you feel confident to go back to it later.

- ▶ Strategies.
- ▶ It's a *lot* of work.

Fun work! And your boss will love you.

Ideally, I want you to take away a better idea of the strategies you can use and an understanding of the amount of work required for standardizing and cleaning datasets.

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GENERAL DATA PRACTICES

As we get started, there are some tips, caveats, and the like I'd like to get out of the way.

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BEST PRACTICE:

Always make a copy of your data.
Always work on the copy.

Good news everyone!
OpenRefine makes a copy of the data.

OPENREFINE



Good news everyone!
OpenRefine makes a copy of the data.

OPENREFINE

TIPS 'N TRICKS

- ▶ Deal with easy stuff first.
- ▶ Modify your process.

As you iterate through your data, you get to Know Your Data.
Deal with the easier stuff first, then
you can modify your process for more complicated aspects.

OPENREFINE

TIPS 'N TRICKS

- ▶ Split large files into more manageable pieces.

If a large file is slowing down the system...

large files should be split into more manageable pieces.

refine your process with smaller, or even sample datasets.



OpenRefine is a Java
application.

That said open refine is a java app. I have a general dislike of Java, but it is what it is.



- ▶ Limited Memory Resources

A downside to this java implementation is ^^

Remember those large files I mentioned a moment ago

OPENREFINE

META

- ▶ OpenRefine's interface is consistent across platforms.

On the plus side:^^^

Regardless of what operating system you use, OpenRefine provides a consistent interface. We'll be toggling back and forth between an interactive session and the slides when it's best to do so.

OPENREFINE

META

- ▶ This includes its user interface inconsistencies.

:(

Unfortunately there are several UX inconsistencies, some of which we will cover.

delete or move?

Iterate.

Wash, rinse, repeat.

OPENREFINE
META

Ready, Player One?

Wash, rinse, repeat.

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EXERCISE 1

OPENREFINE

EXERCISE 1

Create a project folder for your exercises.

Create the first project.
Discuss the options.

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EXERCISE 1



OpenRefine's Gemstone Icon

It's a gem! The crown jewel!

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EXERCISE 1

There's no place like

127.0.0.1:3333

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EXERCISE 1

The Interface.

Even small, well-formed datasets can be wrangled.

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EXERCISE 1



This is the opening screen, where you declare the “intent”, whether opening or creating or importing.

OPENREFINE

EXERCISE 1



1. Click “Choose Files”
2. From your project directory select 01-exercise.tsv
3. Click—of course—“Next”

OPENREFINE

EXERCISE 1

1. Click "Choose Files"
2. From your project directory select 01.tsv
3. Click "Next"

OPENREFINE

EXERCISE 1

Parse data as

CSV / TSV / separator-based files

Line-based text files

Fixed-width field text files

PC-Axis text files

JSON files

MARC files

RDF/NS files

XML files

Open Document Format spreadsheets (.ods)

RDF/XML files

Excel files

Character encoding: UTF-8

Columns are separated by:
☐ commas (CSV)
☒ tabs (TSV)
☐ custom:

Escape special characters with: \

☐ Ignore first: line(s) at beginning of file
☒ Parse next: line(s) as column headers
☐ Discard initial: row(s) of data
☐ Load at most: row(s) of data

☐ Parse cell text into numbers, dates, ...
☒ Quotation marks are used to enclose cells containing column separators
☒ Store blank rows
☒ Store blank cells as nulls
☐ Store file source (file names, URLs) in each row

Update Preview

A Note on the “Parse Data As...” column:

Some formats are obvious; they're either explicitly named or formatted in a way that you recognize. In other, less obvious, cases try out other options to see if they provide you with a preview that makes sense to you. You're not going to destroy the original dataset. The worst thing that can happen is that you crash OpenRefine and have to restart it.

OPENREFINE

EXERCISE 1

Parse data as

CSV / TSV / separator-based files

Line-based text files

Fixed-width field text files

PC-Axis text files

JSON files

MARC files

RDF/NS files

XML files

Open Document Format spreadsheets (.ods)

RDF/XML files

Excel files

Character encoding:

Columns are separated by:

☐ commas (CSV)

☒ tabs (TSV) ←

☐ custom:

Escape special characters with:

☐ Ignore first line(s) at beginning of file

☒ Parse next line(s) as column headers

☐ Discard initial row(s) of data

☐ Load at most row(s) of data

☐ Parse cell text into numbers, dates, ...

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OpenRefine is pretty good at guessing the delimiters. In this case, it has correctly chosen tabs for a tab-delimited file with an extension of .TSV

OPENREFINE

EXERCISE 1

THIS IS NOT A TEXT BOX.
CECI N'EST PAS UNE PIPE BOÎTE DE TEXTE.

Parse data as

CSV / TSV / separator-based files

Line-based text files

Fixed width field text files

PC-Axis text files

JSON files

MARC files

RDF/N3 files

XML files

Open Document Format spreadsheets (.ods)

RDF/XML files

Excel files

Character encoding: UTF-8

Columns are separated by:

☐ commas (CSV)

☒ tabs (TSV)

☐ custom:

Escape special characters with \:

☐ ignore first: line(s) at beginning of file

☒ Parse next: line(s) as column headers

☐ Discard initial: row(s) of data

☐ Load at most: row(s) of data

☐ Parse cell text into numbers, dates, ...

☒ Quotation marks are used to enclose cells containing column separators

☒ Store blank rows

☒ Store blank cells as nulls

☐ Store file source (file names, URLs) in each row

Update Preview

You should almost always click in the “Character Encoding” box (which is really a button) and choose UTF-8.

OPENREFINE

EXERCISE 1

UTF-8

When importing, define your encoding as utf-8
Because diacritics!

OPENREFINE

EXERCISE 1

bêçãüsé dĵăčřìćš

Because diacritics! Interdisciplinary, multi-linguistic.

OPENREFINE

EXERCISE 1

コーヒー قهوة

Because non-Roman characters

OPENREFINE

EXERCISE 1

Parse data as

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RDF/NS files

XML files

Open Document Format spreadsheets (.ods)

RDF/XML files

Excel files

Character encoding:

Columns are separated by:

☐ commas (CSV)

☒ tabs (TSV)

☐ custom:

Escape special characters with:

☐ Ignore first line(s) at beginning of file

☒ Parse next line(s) as column headers

☐ Discard initial row(s) of data

☐ Load at most row(s) of data

☐ Parse cell text into numbers, dates, ...

☒ Quotation marks are used to enclose cells containing column separators

☒ Store blank rows

☒ Store blank cells as nulls

☐ Store file source (file names, URLs) in each row

OpenRefine typically defaults to parsing the first line as column headers, which will work in Exercise 1. This will not always be the case.

OPENREFINE

EXERCISE 1

Parse data as

CSV / TSV / separator-based files

Line-based text files

Fixed-width field text files

PC-Axis text files

JSON files

WARG files

RDF/NS files

XML files

Open Document Format spreadsheets (.ods)

RDF/XML files

Excel files

Character encoding: UTF-8

Columns are separated by:
☐ commas (CSV)
☒ tabs (TSV)
☐ custom:

Escape special characters with:
☐ Parse cell text into numbers, dates, ...
☒ Quotation marks are used to enclose cells containing column separators

Update Preview

☐ ignore first: 0 line(s) at beginning of file
☒ Parse next: 1 line(s) as column headers
☐ Discard initial: 0 row(s) of data
☐ Load at most: 0 row(s) of data

☒ Store blank rows
☒ Store blank cells as nulls
☐ Store file source (file names, URLs) in each row

OpenRefine typically defaults assuming that quotation marks are used to contain column separators.

I don't like to use this option unless I know it won't break the data.

In the case of Exercise 1, we will turn this option off.

OPENREFINE

EXERCISE 1

Parse data as

CSV / TSV / separator-based files

Line-based text files

Fixed-width field text files

PC-Axis text files

JSON files

WARG files

RDF/NS files

XML files

Open Document Format spreadsheets (.ods)

RDF/XML files

Excel files

Character encoding: UTF-8

Columns are separated by:
☐ commas (CSV)
☒ tabs (TSV)
☐ custom:

Escape special characters with: \

Update Preview

☐ Ignore first: line(s) at beginning of file
☒ Parse next: line(s) as column headers
☐ Discard initial: row(s) of data
☐ Load at most: row(s) of data

☐ Parse cell text into numbers, dates, ...
☒ Quotation marks are used to enclose cells containing column separators

☒ Store blank rows
☒ Store blank cells as nulls
☐ Store file source (file names, URLs) in each row

Storing blank rows is, in my personal experience, seldom used.
The possible exception is when a blank row separates individual records.
we'll get to that later, but for now we'll turn it off.

OPENREFINE

EXERCISE 1

Parse data as

CSV / TSV / separator-based files

Line-based text files

Fixed-width field text files

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JSON files

MARC files

RDF/N3 files

XML files

Open Document Format spreadsheets (.ods)

RDF/XML files

Excel files

Character encoding:

Columns are separated by:

☐ commas (CSV)

☒ tabs (TSV)

☐ custom:

Escape special characters with:

☐ Ignore first line(s) at beginning of file

☒ Parse next line(s) as column headers

☐ Discard initial row(s) of data

☐ Load at most row(s) of data

☐ Parse cell text into numbers, dates, ...

☒ Quotation marks are used to enclose cells containing column separators

☒ Store blank rows

☒ Store blank cells as nulls

☐ Store file source (file names, URLs) in each row

Storing blank cells as nulls may be an option if you're going to export the data into a relational database management system like MySQL. Otherwise, it shouldn't hurt to turn it off.

OPENREFINE

EXERCISE 1

Refine A power tool for working with messy data.

Create Project **Start Over** Configure Parsed Options Project name: **Create Project »**

Open Project
Import Project
Language Settings

	Item Barcode	Item Call Number	Item Sort Title	Event Count	Items Checked Out	Items Dispatched	Item Permanent Shelving Location
1.	0292703405210	V4S 361 F118cu	FACES OF CULTURE	6	3	0	Information Desk
2.	2728004022259	DvD 791.4352 G228n2	GATTACA	3	1	0	Information Desk
3.	2728004024067	DvD 313.1136 E736ha	EYES ON THE PRIZE /	2	1	0	Information Desk
4.	2728004024065	DvD 313.1136 E736ha	EYES ON THE PRIZE /	2	1	0	Information Desk
5.	2728004024073	DvD 313.1136 E736ha	EYES ON THE PRIZE /	2	1	0	Information Desk
6.	2728004024081	DvD 313.1136 E736ha	EYES ON THE PRIZE /	2	1	0	Information Desk
7.	2728004024099	DvD 313.1136 E736ha	EYES ON THE PRIZE /	2	1	0	Information Desk
8.	2728004024107	DvD 313.1136 E736ha	EYES ON THE PRIZE /	2	1	0	Information Desk
9.	2728004024115	DvD 313.1136 E736ha	EYES ON THE PRIZE /	3	1	0	Information Desk

The preview looks good. The headers look good.

The data in the preview looks well-formed and consistent.

By default, OpenRefine keeps the filename as project name, including the extension minus punctuation, but you can call it whatever makes sense to you.

OPENREFINE

EXERCISE 1

Objectives:

- ▶ create a column of formats based on Item Call Number
- ▶ change "Event Count" from a character string to a numeric value.
- ▶ create facets for location and format.
- ▶ sort by number of events.

Bonus: change the case of Item Sort Title from all-caps to Title Case.

```
substring(value,0,4)
```

Close this tab when done.

OPENREFINE

EXERCISE 1

GREL

1. Google Regular Expression Language.
2. General Regular Expression Language.

Question for class: how many of you have used regular expressions?

Don't sweat it if you don't know it. They are a powerful tool, but they don't always make sense.

For the sake of consistency, going to try to use "expression" throughout the workshop.

OPENREFINE

EXERCISE 1

EXPRESSION SYNTAX:

“Value” is a variable that is the placeholder
for the cell’s content.

Source: <https://github.com/OpenRefine/OpenRefine/wiki/Understanding-Expressions>

the literal string “value” in an expression is always shorthand for the actual value in the cell.

OPENREFINE

EXERCISE 1

Expressions use camelCase

case sensitive, and camel case sensitive :)

OPENREFINE

EXERCISE 1

“substring” requires two or three variables,
separated by commas and wrapped in
parentheses.

```
substring(value,0,3)
```

case sensitive, and camel case sensitive :)

A positive number for the third variable tells open refine to capture the string from the start variable through that number of characters.

A negative number for the third variable counts backwards from the end of the string.

OPENREFINE

EXERCISE 1

Change “Event Count” from a character string to a numeric value.

Two ways to do it.

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EXERCISE 1

What determines whether or not a value should be numeric?

What determines whether a value is numeric or not?

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EXERCISE 1

Are you going to perform
any mathematical
functions on it?

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TIPS 'N TRICKS

Avoid leading and trailing whitespace.

It can muck with your data.

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EXERCISE 1

- ▶ create facets for location and format.
- ▶ sort by number of events.

A facet lets you view and edit a subset of the data without affecting the entire dataset.

OPENREFINE

EXERCISE 1

- ▶ Change **Item Sort Title** from All-Caps to Title Case
- ▶ Remove trailing slashes.

OpenRefine doesn't know what prepositions and articles are, so those will get the title case treatment as well.

By creating a filter on "Item Sort Title" for '/', we can Transform the cells to delete the trailing slash.

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EXERCISE 1

Bonus Level!

Create a column with the Call Number *sans* format.

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EXERCISE 2

MARC records are some of the craziest data conglomerations that I've ever seen. Even if you are not a cataloger (I am not), there is much to be learned from the manipulation of MARC records in OpenRefine.

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EXERCISE 2

Rows? Records?

develop an awareness of which view you are in.

OpenRefine typically defaults to rows

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EXERCISE 2

Start a new project with

`marc.tsv`

try it on your own or in groups, but DON'T click "create"

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EXERCISE 2

Challenge:

- ▶ define individual *records*.

This is a little tricky, but isn't so bad once you get the gist.

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EXERCISE 2

Take me to
your LDR.

(I'm so, so sorry)



Copyright 20th Century Fox

Next, since the leader marks the beginning of an individual marc record...

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EXERCISE 2

Facet the first column for “LDR”.

we’re going to facet the first column and isolate the rows that start with “LDR”

This brings up the point: what if you’re not familiar with a dataset that you’ve been asked to clean? Remember “Know your Data”: this includes asking someone who might know more about the format.

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EXERCISE 2

Star or Flag those rows.

then star those rows.

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EXERCISE 2

Add a column based on Column 1.

I'll add a new column based on the col containing the "LDR" value.

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EXERCISE 2

Name it “index”.

I’m going to name the new column.
I like to call mine “index”.

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EXERCISE 2

rowIndex+1

We use the formula aka GREL syntax `rowIndex+1` to create cell values

Why +1? because OpenRefine, like many programs (and programming languages) is zero-based

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EXERCISE 2

Close the Column1 facet

Once that's complete, close the facets dialog to show all the rows.

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EXERCISE 2

Move the new column to the beginning

We'll make the new column "key" the first column in the dataset.

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EXERCISE 2

Click into *"records"* view

to verify that OpenRefine identifies individual marc records,
click into the records view.

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EXERCISE 2

You've got distinct records.

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EXERCISE 2

Bonus! How might you break up the 998 field into discrete subfields?

Tell the ILS migration story. Explain that the 998 has “special data” useful for migrations.

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EXERCISE 3

Something a bit more complicated. Perhaps even a little scary. It's okay, I'm the Virgil to your Dante.

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EXERCISE 3

Create a new OpenRefine project with
ezproxy.log

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EXERCISE 3

Get to know the data.

Let's take a moment to scroll through the data. We're not looking for any specific thing; we're looking at the overall pattern and format of the data. We're checking its consistency and its structure.

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EXERCISE 3

Generally speaking, what are the components of each line?

What are the components of each line? The headers are there to help you.

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EXERCISE 3

- ▶ Cleaning data is first about *knowing* the data.
- ▶ Understand the format of the data. Learn how to break it up into distinct components.
- ▶ Iterate the process on each component, refining it.
- ▶ When practical, nest individual steps into one expression.

To reiterate:

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EXERCISE 3

For our data parsing options, what do you—as a group—recommend?

Talk amongst yourselves.

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EXERCISE 3

OBJECTIVES:

- ▶ Parse the URL to identify filetypes, specifically to identify documents/resources.
- ▶ Transform columns 4 and 5 into a numeric date/time value.
- ▶ Get rid of superfluous rows and columns.

read objectives.

what document/resource is the ultimate goal of a patron's completed query/search.

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EXERCISE 3

OBJECTIVE:

Parse the URL to identify filetypes:

- ▶ How many characters long are most file extensions?

Most file extensions are three characters, preceded by a period or dot.

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EXERCISE 3

OBJECTIVE 1:

THESE WILL HELP

- ▶ length
- ▶ substring

1. `length(value)` to get the number of characters in the url.
2. `substring(value,(length(value)-4))` to get the last four characters of the URL.
2. create a filter on the new column, using a regular expression to suss out those values that start with a ‘.’

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HERE

EXERCISE 3

OBJECTIVE 3:

Filter out the URLs that end in the following extensions:

- ▶ .jpg
- ▶ .gif
- ▶ .css
- ▶ .png
- ▶ .js
- ▶ .ico
- ▶ .tiff
- ▶ .ttf
- ▶ .woff

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EXERCISE 3

OBJECTIVE 2:

Transform columns 4 and 5 into a numeric date/
time value.

I'll guide you through this one, as well.

First we have to merge, or concatenate the values.

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EXERCISE 3

OBJECTIVE 2:

▼ Column 4	▼ datetime	▼ Column 5	▼ Column 6
Facet	2016-03-01T19:45:06Z	-0500]	GET http://www.js
Text filter	2016-03-01T19:45:08Z	-0500]	POST http://www.js
Edit cells	2016-03-01T19:45:08Z	-0500]	GET http://www.js
Edit column	Split into several columns...		
Transpose	Add column based on this column...		
Sort...	Add column(s) from other projects...		
View	Add column by fetching URLs...		

Add column based on this column.

Yours will probably look different because I have plugins enabled.

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EXERCISE 3

ITERATION 1

(value + cells["Column 5"].value)



Combines primary column value with a secondary column value.

Explain the Expression.

Congratulations! You've just learned how to access values from other cells.

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EXERCISE 3

ITERATION 1

New value:

[01/Mar/2016:00:00:00-0500]

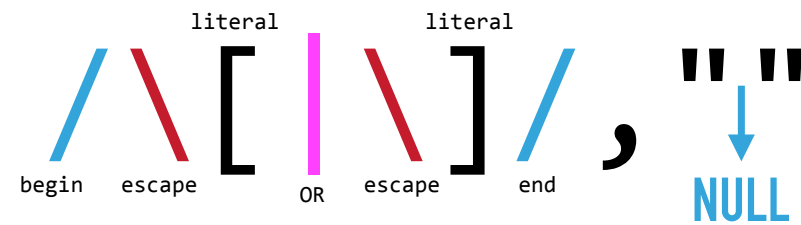
The new column now has this new value.

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EXERCISE 3

ITERATION 2

```
replace((value), /\[|\]/, "")
```



Shield your eyes!

OPENREFINE

EXERCISE 3

ITERATION 2

```
replace((value + cells["Column 5"].value),/\[|\]/,"")
```

A NESTED GREL

Instead of adding another column, you can nest the GREL.
(The GREL, with the previous two operations nested.)

OPENREFINE

EXERCISE 3

ITERATION 3

```
toDate(value, "dd/MMM/yyyy:HH:mm:ss")
```

Do you want to try this one on your own?
Again, *value* is the previous expression.

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EXERCISE 3

```
toDate((replace((value + cells["Column 5"].value),/\[|\]/,"")), "dd/MMM/yyyy:HH:mm:ss")
```

Regular expressions don't look good on slides.

¯_(ツ)_/¯

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EXERCISE 3

QUESTION:

Is there a way to automate that last objective?

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EXERCISE 3

Save as .json



OpenRefine lets you extract JSON for reuse in future projects.

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CONCLUSION

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rowIndex+1

use rowIndex+1 to create cell values, because of zero-based numbering.

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Facets let you view and edit a subset of the data without affecting the entire dataset.

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Questions?

email: jwaller7@elon.edu

slack: @jerrywaller

github: <https://github.com/jerrywaller>

know your data :)

Any questions?

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References

- ▶ <https://github.com/OpenRefine/OpenRefine/wiki/GREL-String-Functions>
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- ▶ http://www.meanboyfriend.com/overdue_ideas/2014/11/working-with-data-using-openrefine/
- ▶ <https://github.com/OpenRefine/OpenRefine/wiki/Recipes>

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References

- ▶ Verborgh, R., & De Wilde, M. (2013). Using OpenRefine : The essential openRefine guide that takes you from data analysis and error fixing to linking your dataset to the web (Community experience distilled). Birmingham, England: Packt Publishing.
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THANK YOU