LECTURE 6

Regular Expressions

Using string methods and regular expressions to work with textual data



Today's Roadmap

Why Work with Text?

Python String Methods

Regular Expressions (Regex) Basics

Regex Expanded

Convenient Regex

Regex in Python/Pandas (Regex groups)

Demo on Restaurant Data

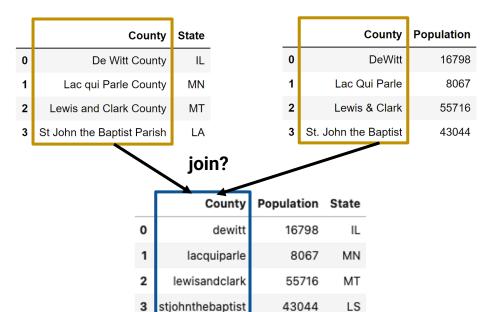
Bonus: Yes, More Regex Syntax



Why work with text? Two Main Goals

 Canonicalization: Convert data that has more than one possible presentation into a standard form.

<u>Ex</u> Join tables with mismatched labels





Why work with text? Two Main Goals

1. Canonicalization: Convert data that has more than one possible presentation into a standard form.

2. Extract information into a new feature.

Ex Extract dates and times from log files

<u>Ex</u> Join tables with mismatched labels

County

dewitt

lacquiparle

lewisandclark

stjohnthebaptist

0

2

Population State

16798

8067

55716

43044

	County	State			County	Population
0	De Witt County	IL		0	DeWitt	16798
1	Lac qui Parle County	MN		1	Lac Qui Parle	8067
2	Lewis and Clark County	MT		2	Lewis & Clark	55716
3	St John the Baptist Parish	LA		3	St. John the Baptist	43044
		join	?			

169.237.46.168 - -

day, month, year = "26", "Jan", "2014" hour, minute, seconds = "10", "47", "58"



Python String Methods

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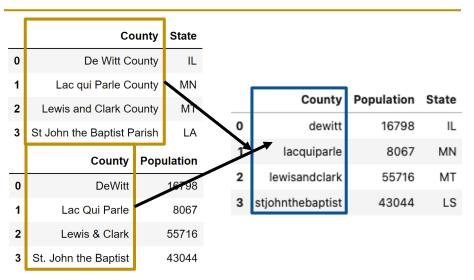
Demo on Restaurant Data

Bonus: Yes, More Regex Syntax



Demo Slides

1. Canonicalization



2. Extracting Date Information

```
169.237.46.168 - -
[26/Jan/2014:10:47:58 -0800] "GET
/stat141/Winter04/ HTTP/1.1" 200 2585
"http://anson.ucdavis.edu/courses/"
```



```
day, month, year = "26", "Jan", "2014"
hour, minute, seconds = "10", "47", "58"
```

One possible solution:

```
pertinent = line.split("[")[1].split(']')[0]
day, month, rest = rest.split('')
year, hour, minute, rest = rest.split(':')
seconds, time_zone = rest.split('')
```

Demo Slides



Summary: Python String Methods

Canonica	lization	and	Extraction
----------	----------	-----	-------------------

- Parse/replace/split substrings.
- Feels very "hacky," but messy problems often have messy solutions.

Python string functions:

- Are very brittle! Requires maintenance.
- Have limited flexibility.

operation	Python	pandas (Series)
transformation	<pre>s.lower() s.upper()</pre>	<pre>ser.str.lower() ser.str.upper()</pre>
replacement/ deletion	s.replace()	ser.str.replace()
split	s.split()	ser.str.split()
substring	s[1:4]	ser.str[1:4]
membership	'ab' in s	ser.str.contains()
lenath	len(s)	ser.str.len()

How would you extract all the **moon**-like patterns in this string?

"moon moo mooooon mon moooon"

String Extraction: An alternate approach

While we can hack together code that uses **replace/split**...

```
pertinent = line.split("[")[1].split(']')[0]
day, month, rest = pertinent.split('/')
year, hour, minute, rest = rest.split(':')
seconds, time_zone = rest.split('')
```

...An alternate approach is to use a **regular expression**:

- Implementation provided in the Python re library and the pandas str accessor.
- We'll spend some time today working up to expressions like this one:

```
import re pattern = r' \cdot [(\d+) \cdot (\d+) : (\
```



Regex Basics

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What Is a Regular Expression?

A **formal language** is a set of strings, typically described implicitly.

Example: "The set of all strings of length < 10 that contain 'data'"

A **regular language** is a formal language that can be described by a **regular expression**.

A **regular expression** ("**regex**") is a sequence of characters that specifies a search pattern.

Example: [0-9]{3}-[0-9]{2}-[0-9]{4}

3 of any digit, then a dash, then 2 of any digit, then a dash, then 4 of any digit.



Goals of Today's Lecture

The goal of today is:

- Understand what regex is capable of.
- 2. Parse and create regex, with a reference table.
- 1. Use vocabulary (closure, metacharacter, escape character, groups, etc.) to **describe regex** metacharacters.
- **2.** Differentiate between (), [], {}
- 3. Design your own character classes with \d, \w, \s, [...- ...], ^, etc.
- 4. Use Python and pandas regex methods.

details; hone with practice

References:

The official guide is good! https://docs.python.org/3/howto/regex.html





regex101.com (or the online tutorial regexone.com)

There are a ton of nice resources out there to experiment with regular expressions (e.g. regex101.com, regexone.com, sublime text, python, etc).

I recommend trying out regex101.com, which provides a visually appealing and easy to use platform for experimenting with regular expressions.

Example: https://regex101.com/r/1SREie/1





Basic Regex Syntax

The four basic operations for regular expressions.

You can technically do anything with just these basic four (albeit tediously).

I, *, () are **metacharacters**. They manipulate adjacent characters.

operation	order	example	matches	doesn't match
concatenation	3	AABAAB	AABAAB	every other string
or	4	AA BAAB	AA BAAB	every other string
closure (zero or more)	2	AB*A	AA ABBBBBBA	AB ABABA
group	1	A(A B)AAB	AAAAB ABAAB	every other string
(parenthesis)		(AB)*A	A ABABABABA	AA ABBA

AB*: A then zero or more copies of B: (AB)*: Zero or more copies of AB:

copies of B: A, AB, ABB, ABBB of AB: ABABABAB, ABAB, ABB, AB



matches the empty string!

ABBA

operation	order	example	matches	doesn't match
concatenation	3	AABAAB	AABAAB	every other string
or	4	AA BAAB	AA BAAB	every other string
closure (zero or more)	2	AB*A	AA ABBBBBBA	AB ABABA
group	1	A(A B)AAB	AAAAB ABAAB	every other string
(parenthesis)	1	(AB)*A	A ABABABABA	AA ABBA



Starting off: regex101.com/r/8tkQ23/1 ← Click to test on regex101.com! operation order example matches doesn't match

AABAAB

AA

AA

BAAB

ABBBBBBA

ABABABABA

AAAAB

ABAAB

Α

AABAAB

every other string

every other string

every other string

AB

AA

ABBA

ABABA

or	4	AA BAAB			
closure (zero or more)	2	AB*A			
group (parenthesis)	1	A(A B)AAB			
(parentnesis)		(AB)*A			
Give a regular expression that matches moon, moooon , etc. Your expression should match any even number of os except zero (i.e. don't match mn).					

3

concatenation

Puzzle

operation	order	example	matches	doesn't match
concatenation	3	AABAAB	AABAAB	every other string
or	4	AA BAAB	AA BAAB	every other string
closure (zero or more)	2	AB*A	AA ABBBBBBA	AB ABABA
group	1	A(A B)AAB	AAAAB ABAAB	every other string
(parenthesis)	ı	(AB)*A	A ABABABABA	AA ABBA

Solution

Answer: moo(oo)*n



or

closure

group

Puzzle



AABAAB

AA BAAB

A(A|B)AAB

(AB)*A

Give a regex that matches muun, muuuun, moon, **moooon**, etc. Your expression should match any

even number of us or os except zero

AB*A

AABAAB

AA

AA

BAAB

ABBBBBBA

ABABABABA

AAAAB

ABAAB

Α

3

4

concatenation

(zero or more)

(parenthesis)

(i.e. don't match mn).

doesn't match

every other string

every other string

every other string

AB

AA

ABBA

ABABA

operation	order	example	matches	doesn't match
concatenation	3	AABAAB	AABAAB	every other string
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closure (zero or more)	2	AB*A	AA ABBBBBBA	AB ABABA
group	Δ(ΔΙΒ)ΔΔΒ	AAAAB ABAAB	every other string	
(parenthesis)	I	(AB)*A	A	AA ABBA

ABABABABA

ABBA

Answer: m(uu(uu)*|oo(oo)*)n

Note: $m(uu(uu)^*|oo(oo)^*)n$ Note: $m(uu(uu)^*)|(oo(oo)^*)n$ is not correct! OR must be in parentheses!



Solution

m(uu(uu)*|oo(oo)*)n

Matches starting with m and ending with n, with either of the following in the middle:

- uu(uu)*
- 00(00)*

Match examples:

muun

muuuun

moon

moooon

m(uu(uu)*)|(oo(oo)*)n

Matches either of the following:

- m followed by uu(uu)*
- oo(oo)* followed by n

Concatenation precedes OR!

Match examples:

muu

muuuu

oon

oooon

Solution

Explanation

OR metacharacter | comes last in order of operations.



Regex Expanded

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Expanded Regex Syntax

	operation	example	matches	doesn't match
wildcard . Consider: .*	any character (except newline)	.U.U.U.	CUMULUS JUGULUM	SUCCUBUS TUMULTUOUS
character class: Match one character in []	character class	[A-Za-z][a- z]*	word Capitalized	camelCase 4illegal
Repeat preceding	repeated exactly a times: {a}	j[aeiou]{3}hn	jaoehn jooohn	jhn jaeiouhn
item {} times	repeated from a to b times: {a,b}	j[ou]{1,2}hn	john juohn	jhn jooohn
Compare/contrast: o*, o+, o?	at least one	jo+hn	john joooooohn	jhn jjohn
	zero or one	joh?n	jon john	any other string

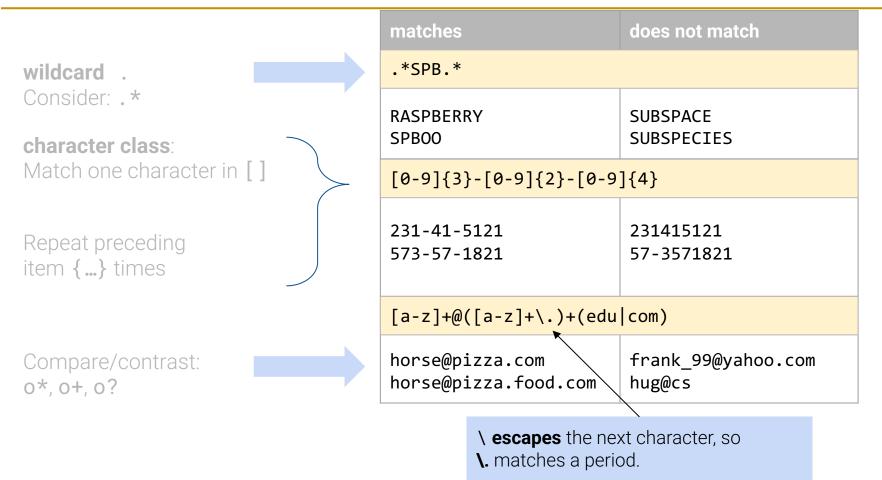


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item {} times	repeated from a to b times: {a,b}	j[ou]{1,2}hn	john juohn	jhn jooohn
Compare/contrast: o*, o+, o?	at least one	jo+hn	john joooooohn	jhn jjohn
	zero or one	joh?n	jon john	any other string



Expanded Regex examples





Expanded Regex Puzzle 1: regex101.com/r/g0tP0I/1

operation	example	matches	doesn't match
any character (except newline)	.U.U.U.	CUMULUS JUGULUM	SUCCUBUS TUMULTUOUS
character class	[A-Za-z][a- z]*	word Capitalized	camelCase 4illegal
repeated exactly a times: {a}	j[aeiou]{3}hn	jaoehn jooohn	jhn jaeiouhn
repeated from a to b times: {a,b}	j[ou]{1,2}hn	john juohn	jhn jooohn
at least one	jo+hn	john joooooohn	jhn jjohn
zero or one	joh?n	jon john	any other string

repeated vowel (noon, peel, festoon, loop, oodles, etc).



Puzzle

Expanded Regex Puzzle 1

operation	example	matches	doesn't match
any character (except newline)	.U.U.U.	CUMULUS JUGULUM	SUCCUBUS TUMULTUOUS
character class	[A-Za-z][a- z]*	word Capitalized	camelCase 4illegal
repeated exactly a times: {a}	j[aeiou]{3}hn	jaoehn jooohn	jhn jaeiouhn
repeated from a to b times: {a,b}	j[ou]{1,2}hn	john juohn	jhn jooohn
at least one	io+hn	john	jhn

Solution

john at least one jo+hn joooooohn jon

joh?n zero or one john string 26 Answer: [a-z]*(aa|ee|ii|oo|uu)[a-z]*

jjohn

any other

Puzzle

Expanded Regex Puzzle 2: https://regex101.com/r/aKyP2r/3

operation

(except newline)

character class

repeated exactly

repeated from a

to b times: {a,b}

at least one

zero or one

a times: {a}

example

[A-Za-z][a-

j[aeiou]{3}hn

 $j[ou]{1,2}hn$

jo+hn

joh?n

Give a regular expression for any string that contains both a lowercase letter and a number.

z]*

.U.U.U.

CUMULUS

JUGULUM

matches

word Capitalized

jaoehn

jooohn

john

juohn

john

jon

john

joooooohn







jhn

any other

string

jooohn

jjohn

doesn't match

SUCCUBUS

TUMULTUOUS

camelCase

jaeiouhn

Expanded Regex Puzzle 2

operation	example	matches	doesn't match
any character (except newline)	.U.U.U.	CUMULUS JUGULUM	SUCCUBUS TUMULTUOUS
character class	[A-Za-z][a- z]*	word Capitalized	camelCase 4illegal
repeated exactly a times: {a}	j[aeiou]{3}hn	jaoehn jooohn	jhn jaeiouhn
repeated from a to b times: {a,b}	j[ou]{1,2}hn	john juohn	jhn jooohn

Solution

john jhn jo+hn jjohn

at least one joooooohn jon

any other joh?n zero or one john string



https://alf.nu/RegexGolf

Interlude



Email Address Regular Expression (probably a bad idea)

The regular expression for **email addresses** (for the Perl programming language):

](?:(?:\r\n)?[\t])*)(?:\.(?:(?:\r\n)?[\t])*(?:[^()<>@,;:\\".\[]\000-\031]+(?:(?:(?:\r\n)?[\t])+|\Z|(?=[\["()<>@,;:\\".\[\]]))\[([^\[\]\r\\]\\.)*\](?: (?:\r\n)?[\t])*))*|(?:[^()<>@,;;\\".\[\] \000-\031]+(?:(?:(?:\r\n)?[\t])+|\Z|(?=[\["()<>@,;;\\".\[\]]))|"(?:[^\\\\|[?:(?:\r\n)?[\t]))*"(?:(?:\r\n)? ?[\t])*)*\<{?:{?:\r\n}?[\t])*|*(?:@(?:[^\[\]\r\\]\r\)]\(?:(?:\r\n)?[\t])+|\Z|(?=[\["\]\<@,;:\\".\[\]]))|\[([^\[\]\r\\]|\\.)*\](?:(?:\r\n)?[\t])*\(?:\(?:\r\n)?[\t])*\(?:[^(\>\e,;:\\".\[\]\000-\031]+(?:(?:\r\n)?[\t])+\\Z|(?=[\["(\>\e,;:\\".\[\]]))\\[([^\\]\\.)*\](?:\r\n)?[\t])*\)?:\(?:\r\n)?[\t])+\\Z|(?=[\["(\>\e,;:\\".\[\]]))\\[([^\\]\\.)*\](?:\r\n)?[\t])(?:\.(?:(?:\r\n)?[\t])*(?:[^()<>@,;:\\".\[\]\000-\031]+(?:(?:(?:\r\n)?[\t])+\\Z|(?=[\["()<>@,;:\\".\[\]]))\\[([^\[\]\r\\]|\\.)*\](?:(?:\r\n)?[\t])*)) *:(?:(?:\r\n)?[\t])*)?(?:[^\\,,)(\;\,)(\]\\.\[\]\000-\031]+(?:(?:\r\n)?[\t])+\\Z|(?=[\["()<>@,;:\\".\[]]))|"(?:[^\\\\]|\\.|(?:(?:\r\n)?[\t]))*"(?:(?:\r\n)?[\t]) \n)?[`\t])*)(?:\.`(?:(?:\r\n)?[`\t])*(?:[?\)%;@;;:\\".\[\] \\\\\n)!\\.[\?:(?:\r\n)?[`\t])#[\?!(?:\r\n)?[`\t])#[\?!(?:\r\n)?[`\t])#[\?!(?:\r\n)?[`\t]]))*"(?:(?:\r\n)?[\t])*))*@(?:(?:\r\n)?[\t]))*(?:(?:\r\n)?[\t]))*(?:(?:\r\n)?[\t])))\[([\r\[\]\r\])\r\])\[\] ?:´(?:\r\n)?[\t])*)(?:´\.´(?:\?:\\n)?[\t]))]\[´([^\[\])*(?:[\])\()*(?:[\])\()\[\])\[\]\()\[\])\[\] :\r\n)?[\t])*\>(?:(?:\r\n)?[\t])*\|(?:[^\\-\n)?[\t])\|(?:(?:\r\n)?[\t])+\\Z|(?=[\["()<>@,;:\\".\[\]]))\|"(?:[^\\\\.|(?:(?:\r\n)?[\t])+\\Z|(?=[\["()<>@,;:\\".\[\]]))\|"(?:[^\\\.|(?:(?:\r\n)?[\t])+\\Z|(?=[\["()<>@,;:\\".\[\]]))\|"(?:[^\\\.|(?:(?:\r\n)?[\t])+\\Z|(?=[\["()<>@,;:\\".\[\]]))\|"(?:[^\\\.|(?:(?:\r\n)?[\t])+\\Z|(?=[\["()<>@,;:\\".\[\]]))\|"(?:[^\\\.|(?:(?:\r\n)?[\t])+\\Z|(?=[\["()<>@,;:\\".\[\]]))\|"(?:[^\\\.|(?:(?:\r\n)?[\t])+\\Z|(?=[\["()<>@,;:\\".\[\]]))\|"(?:[^\\\.\])\|"(?:(?:\r\n)?[\t])\|"(?:(?:\r\n)?[\t])\|"(?:(?:\r\n)?[\t])\|"(?:(?:\r\n)?[\t])\|"(?:(?:\r\n)?[\t])\|"(?:(?:\r\n)?[\t])\|"(?:(?:\r\n)?[\t])\|"(?:(?:\r\n)?[\t])\|"(?:(?:\r\n)?[\t])\|"(?:(?:\r\n)?[\t])\|"(?:(?:\r\n)?[\t])\|"(?:(?:\r\n)?[\t])\|"(?:(?:\r\n)?[\t])\|"(?:(?:\r\n)?[\t])\|"(?:(?:\r\n)?[\t])\|"(?:(?:\r\n)?[\t])\|"(?:(?:\r\n)?[\t])\|"(?:(?:\r\n)?[\t])\|"(?:(?:\r\n)?[\t])\|"(?:(?:\r\n)?[\t])\|"(?:(?:\r\n)?[\t])\|"(?:(?:\r\n)?[\t])\|"(?:(?:\r\n)?[\t])\|"(?:(?:\r\n)?[\t])\|"(?:(?:\r\n)?[\t])\|"(?:(?:\r\n)?[\t])\|"(?:(?:\r\n)?[\t])\|"(?:(?:\r\n)?[\t])\|"(?:(?:\r\n)?[\t])\|"(?:(?:\r\n)?[\t])\|"(?:(?:\r\n)?[\t])\|"(?:(?:\r\n)?[\t])\|"(?:(?:\r\n)?[\t])\|"(?:(?:\r\n)?[\t])\|"(?:(?:\r\n)?[\t])\|"(?:(?:\r\n)?[\t])\|"(?:(?:\r\n)?[\t])\|"(?:(?:\r\n)?[\t])\|"(?:(?:\r\n)?[\t])\|"(?:(?:\r\n)?[\t])\|"(?:(?:\r\n)?[\t])\|"(?:(?:\r\n)?[\t])\|"(?:(?:\r\n)?[\t])\|"(?:(?:\r\n)?[\t])\|"(?:(?:\r\n)?[\t])\|"(?:(?:\r\n)?[\t])\"(?:(?:\r\n)?[(?:(?:\r\n)?[\t])*)*:(?:(?:\r\n)?[\t])*(?:(?:\r\n)?[\t])*(?:(?:\r\n)?[\t])*(?:(?:\r\n)?[\t])*(?:(?:\r\n)?[\t])*(?:(?:\r\n))["(?:[^\"\r\\]) \\.[\[?:(?:\r\n)?[\t]))*"(?:(?:\r\n)?[\t]))*)(?:\.(?:(?:\r\n)?[\t])*)?:\.(?:(?:\r\n)?[\t]))*(?:(?:\r\n)?[\t]))* '\r\\]|\\.|(?:(?:\r\n)?[\t]))*"(?:(?:\r\n)?[\t])*))*@(?:(?:\r\n)?[\t])*(?:[^()<>@,;:\\".\[\] \000-\031]+(?:(?:(r\n)?[\t])+|\Z|(?=[\["()<>@,;:\\ \]]))|\[([^\[\]\r\)]|\\.)*\](?:(?:\r\n)?[\t])*))*|(?:[^()<>@,;:\\".\[\] \000-\031]+(?:(?:\r\n)?[\t])+|\Z|(?=[\["()<>@,;:\\".\[\]]))|"(?:[^\"\r\\]|\\.|(?:(?:\r\n)?[\t]))*"(?:(?:\r\n)?[\t])*\<(?:(?:\r\n)?[\t])*\(?:(?:\r\n)?(\t])*\(?:(?:\r\n)?(\t])*\(?:(?:\r\n)?(\t])*\(?:(?:\r\n)?(\t])*\(?:(?:\r\n)?(\t])*\(?:(?:\r\n)?(\t])*\(?:(?:\r\n)?(\t])*\(?:(?:\r\n)?(\t])*\(?:(?:\r\n)?(\t])*\(?:(?:\r\n)?(\t])*\(?:(?:\r\n)?(\t])*\(?:(?:\r\n)?(\t])*\(?:(?:\r\n)?]\r\\]\\.)*\](?:(?:\r\n)?[\t])*))*(?:,@(?:(?:\r\n)?[\t])*(?:[^\()<>@,;:\\".\[\]\000-\031]+(?:(?:(?:\r\n)?[\t])+\\Z|(?=[\["()<>@,;:\\".\[\]))\|\[([^\[\]\ r\\]|\\.)*\]{?:(?:\r\n)?[\t])*\)(?:\?:\?:\?:\r\n)?[\t])*\)([:\.(?:\?:\r\n)?[\t])*\]([([\r\]))]\[([\r\])]\] .|(?:(?:\r\n)?[\t]))*"(?:(?:\r\n)?[\t])*)(?:\.(?:(?:\r\n)?[\t])(?:\.(?:(?:\r\n)?[\t])*)(?:\.(?:(?:\r\n)?[\t])(?:\.(?:(?:\r\n)?[\t])*)(?:\.(?:(?:\r\n)?[\t])*)(?:\.(?:(?:\r\n)?[\t])*)(?:\.(?:(?:\r\n)?[\t])*)(?:\.(?:(?:\r\n)?[\t])*)(?:\.(?:(?:\r\n)?[\t])*)(?:\.(?:(?:\r\n)?[\t])*)(?:\.(?:(?:(?:\r\n)?[\t])*)(?:\.(?:(?:\r\n)?[\t])*)(?:\.(?:(?:(r\n)?[\t])*)(?:\ :[^\\n\r\\][\\.[{?:(?:\r\n)?[\t]))*"(?:[?:(r\n)?[\t])*)*@(?:(?:\r\n)?[\t])*"(?:(?:\r\n)?[$$$ \sum_{i=1,\dots,i} |([([^{i],\cdot]}^{i}](?:(?:\cdot,\cdot)?[^i)^{?:(?:\cdot,\cdot)?[^i)^{?:(...)?[^i)^{:(...)?[^i)^{:(...)?[^i)^{:(...)?[^i)^{:(...)?[^i)^{:(...)?[^i)^{:(...)?[^i)^{:(...)?[^$ ".\[\]]))|"(?:[^\"\r\\]|\\.|(?:(?:\r\n)?[\t]))*"(?:(?:\r\n)?[\t])*)(?:\.(?:(?:\r\n)?[\t])*(?:[?:\r\n)?[\t])*(?:(?:\r\n)?[\ \Z|(?=[\["()<>@,;:\\".\[\]]))\\[([^\\]\\.)*\\](?:(?:\r\n)?[\t])*))*\|(?:[^()<>@,;:\\".\[\]\\.000-\031]+(?:(?:\r\n)?[\t])+\|\Z|(?=[\["()<>@,;:\\".\[\]]]))|"{?:[^\"\r\\]|\\.|{?:(?:\r\n)?[\t]))*"(?:(?:\r\n)?[\t])*\<??(?:(?:\r\n)?[\t])*(?:[\t])*(?:[\t])*(?:[\t])* \]]))|\[([^\[\]\r\\]|\\.)*\](?:(?:\r\n)?[\t])*))*(?:,@(?:(?:\r\n)?[\t])*(?:[^()<>@,;:\\".\[\] \000-\031]+(?:(?:(r\n)?[\t])+|\Z|(?=[\["()<>@, ;:\\".\[\]])))\[([^\[\]\r\\)|\(\.)*\](?:\r\n)?[\\t])*\(?:\r\n)?[\\t])*(?:\r\n)?[\\t])*(?:\r\n)?[\\t])*(?:[\(\)\"\)(]\(\)\"\(\)\"\(\)[\\\"\)[\\\"\\] ".\[\]]))|\[([^\[\]\\.)*\](?:(?:\r\n)?[\t])*))*)*:(?:(r\n)?[\t])*)?(?:[^()<>@,;:\\".\[\] \000-\031]+(?:(?:(?:\r\n)?[\t])+|\Z|(?=[\["()<>@,;:\\". `(?:[^\"\r\\]|\\.|(?:(?:\r\n)?[\t]))*"(?:(?:\r\n)?[\t])*)(?:\.[?:(r\n)?[\t])*|(?:(?:\r\n)?[\t])*|(?:(?:\r\n)?[\t])*|(?:(?:\r\n)?[\t])*|(?:(?:\r\n)?[\t])*|(?:(?:\r\n)?[\t])*|(?:(?:\r\n)?[\t])*|(?:(?:\r\n)?[\t])*|(?:(?:\r\n)?[\t])*|(?:(?:\r\n)?[\t])*|(?:(?:\r\n)?[\t])*|(?:(?:\r\n)?[\t])*|(?:(?:\r\n)?[\t])*|(?:(?:\r\n)?[\t])*|(?:(?:\r\n)?[\t])*|(?:(?:\r\n)?[\t])*|(?:(?:\r\n)?[\t])*|(?:(?:\r\n)?[\t])*|(?:(?:\r\n)?[\t])*|(?:(?:\r\n)?[\t])*|(?:(?:\r\n)?[\t])*|(?:(?:\r\n)?[\t])*|(?:(?:(?:\r\n)?[\t])*|(?:(?:(r\n)?[\t])*|(?:(?:(r\n)?[\t])*|(?:(r\n)?[\t])*|(?:(r\n)?[\t])*|(?:(r\n)?[\t])*|(?:(r\n)?[\t])*|(?:(r\n)?[\t])*|(?:(r\n)?[\t])*|(?:(r\n)?[\t])*|(?:(r\n)?[\t])*|(?:(r\n)?[\t])*|(?:(r\n)?[\t])*|(?:(r\n)?[\t])*|(?:(r\n)?[\t])*|(?:(r\n)?[\t])*|(?:(r\n)?[\t])*|(?:(r\n)?[\t])*|(?:(r\n)?[\t])*|(?:(r\n)?[\t])*|(?:(r\n)?[\t])*|(?:(r\n)?[\t])*|(?:(r\n)?[\t])*|(?:(r\n)?[\t])*|(?:(r\n)?[\t])*|(?:(r\n)?[\t])*|(?:(r\n)?[\t])*|(?:(r\n)?[\t])*|(?:(r\n)?[\t])*|(?:(r\n)?[\t])*|(?:(r\n)?[\t])*|(?:(r\n)?[\t])*|(?:(r\n)?[\t])*|(?:(r\n)?[\t])*|(?:(r\n)?[\t])*|(?:(r\n)?[\t])*|(?:(r\n)?[\t])*|(?:(r\n)?[\t])*|(?:(r\n)?[\t])*|(?:(r\n)?[\t])*|(?:(r\n)?[\t])*|(?:(r\n)?[\t])*|(?:(r\n)?[\t])*|(?:(r\n)?[\t])*|(?:(r\n)?[\t])*|(?:(r\n)?[\t])*|(?:(r\n)?[\t])*|(?:(r\n)?[\t])*|(?:(r\n)?[\t])*|(?:(r\n)?[\t])*|(?:(r\n)?[\t])*|(?:(r\n)?[\t])*|(?:(r\n)?[\t])*|(?:(r\n)?[\t])*|(?:(r\n)?[\t])*|(?:(r\n)?[\t])*|(?:(r\n)?[\t])*|(?:(r\n)?[\t])*|(?:(r\n)?[\t])*|(?:(r\n)?[\t])*|(?:(r\n)?[\t])*|(?:(r\n)?[\t])*|(?:(r\n)?[\t])*|(?:(r\n)?[\t])*|(?:(r\n)?[\t])*|(?:(r\n)?[\t])*|(?:(r\n)?[\t])*|(?:(r\n)?[\t])*|(?:(r\n)?[\t])*|(?:(r\n)?[\t])*|(?:(r\n)?[\t])*|(?:(r\n)?[\t])*|(?:(r\n)?[\t])*|(?:(r\n)?[\t])*|(?:(r\n)?[\t])*|(?:(r\n)?[\t])*|(?:(r\n)?[\t])*|(?:(r\n)?[\t])*|(?:(r\n)?[\t])*|(?:(r\n)?[\t])*|(?:(r\n)?[\t])*|(?:(r\n)?[\t])*|(?:(r\n)?[\t])*|(?:(r\n)?[\t])*|(?:(r\n)?[\t])*|(?:(r\n)?[\t])*|(?:(r\n)?[\t])*|(?:(r\n)?[\t])*|(?:(r\n)?[\t])*|(?:(r\n)?[\t])*|(?:(r\n)?[\t])*|(?:(r\n)?[\t])*|(?:(r\n)?[\t])*|(?:(r\n)?[\t])*|(?:(r\n)?[\t])*|(?:(r\n)?[\t])*|(?:(r\n)?[\t])*|(?:(r "()<>@;;:\\".\[|]]))|"(?:[^\"\r\\]|\\.[(?:(?:\r\n)?[\t]))*"(?:(?:\r\n)?[\t])))"(?:(?:\r\n)?[\t]))"(?:(?:\r\n)?[\t])) +\\Z|(?=[\["()<>@,;:\\".\[\]))\\[([^\\]\r\\]\\.)*\](?:(?:\r\n)?[\\t])*\(?:(?:\r\n)?[\\t])+\\Z |{?=[\["()<>@,;:\\".\[\]]))|\[([^\[\]\r\\]]\\r\\]|\\.)*\]{?:(?:\r\n)?[\\t])*))*\>(?:(?:\r\n)?[\\t])*))*\>

 $(?:(?:\n')?[\t])*(?:(?:(?:(n')?[\t]))|"(?:(?:\n')?[\t]))|"(?:(?:\n')?[\t]))|"(?:(?:\n')?[\t]))|"(?:(?:\n')?[\t])|"(?:(?:\n')?[\t])|"(?:($

Interlude

Convenient Regex

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Bonus: Yes, More Regex Syntax



Convenient Regex Syntax

\W	[A-Za-z0-9 _]	_	operation	example	matches	doesn't match
\d \s +	[0-9] whitespace at least one		built-in character classes	\w+ \d+ \s+	Fawef_03 231231 whitespace	this person 423 people non-whitespace
[^] ne	egates entire er class		character class negation	[^a-z]+	PEPPERS3982 17211!↑å	porch CLAmS
"take this characte	s next er literally"		escape character	cow\.com	cow.com	COWSCOM





Back to Our Log File, Part 1: https://regex101.com/r/bJ9vUn/1

operation	example	matches	doesn't match
built-in character classes	\w+ \d+ \s+	Fawef_03 231231 whitespace	this person 423 people non-whitespace
character class negation	[^a-z]+	PEPPERS3982 17211!↑å	porch CLAmS
escape character	cow\.com	COW.COM	COWSCOM

Puzzle

169.237.46.168 - - [26/Jan/2014:10:47:58 -0800] "GET /stat141/Winter04/ HTTP/1.1" 200 2585 "http://anson.ucdavis.edu/courses/"

Give a regular expression that matches the gold portion above.



Back to Our Log File, Part 1

operation	example	matches	doesn't match
built-in character classes	\w+ \d+ \s+	Fawef_03 231231 whitespace	this person 423 people non-whitespace
character class negation	[^a-z]+	PEPPERS3982 17211!↑å	porch CLAmS
escape character	cow\.com	COW.COM	COWSCOM

Solution

Answer: \[.*\]



Even More Regular Expression Features

A few additional common regex features are listed above.

- Won't discuss these in lecture, but might come up in discussion or hw.
- There are even more features out there!

operation	example	matches	doesn't match
beginning of line	^ark	ark two ark o ark	dark
end of line	ark \$	dark ark o ark	ark two
lazy version of zero or more *?	5.* ? 5	5005 55	5005005

Again—The official guide is good! https://docs.python.org/3/howto/regex.html





Regex in Python and Pandas (Regex groups)

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Canonicalization: Python

```
re.sub(pattern, repl, text) docs
```

Returns text with all instances of **pattern** replaced by **rep1**.

```
text = "<div>Moo</div>"
pattern = r"<[^>]+>"
re.sub(pattern, '', text) # returns Moo

Moo
```



Canonicalization: Pandas

```
re.sub(pattern, repl, text) docs
```

Returns text with all instances of **pattern** replaced by **repl**.

```
text = "<div>Moo</div>"
pattern = r"<[^>]+>"
re.sub(pattern, '', text) # returns Moo

Moo
```

pattern is a raw string. r"...'

```
ser.str.replace(pattern,
repl, regex=True)
```

Returns Series with all instances of **pattern** in Series **ser** replaced by **repl**.

```
df["Html"].str.replace(pattern, '')
Html
```

0 <div>Moo</div>

0 Moo Name: Html, dtype: object



Sidenote: Raw Strings in Python

Note: When specifying a pattern, we strongly suggest using raw strings.

A raw string is created using r"" or r'' instead of just "" or ''.

```
pattern = r"<[^>]+>"
```

- The exact reason is a bit tedious.
 - Rough idea: Regular expressions and Python strings both use \ as an escape character.
 - Using non-raw strings leads to uglier regular expressions.

Regular String	Raw string	
"ab*"	r"ab*"	
"\\\\section"	r"\\section"	
"\\w+\\s+\\1"	r"\w+\s+\1"	

For more information see "The Backslash Plague" under https://docs.python.org/3/howto/regex.html#the-backslash-plague



Extraction

```
re.findall(pattern, text)

docs
```

Return a list of all matches to pattern.

```
text = "My social security number is 123-45-6789 bro, or actually maybe it's 321-45-6789."; pattern = r"[0-9]{3}-[0-9]{2}-[0-9]{4}" re.findall(pattern, text)
```

```
['123-45-6789', '321-45-6789']
```



Extraction

```
re.findall(pattern, text)

<u>docs</u>
```

Return a list of all matches to **pattern**.

```
text = "My social security number is 123-45-6789 bro, or actually maybe it's 321-45-6789."; pattern = r"[0-9]{3}-[0-9]{2}-[0-9]{4}" re.findall(pattern, text)
```

```
['123-45-6789', '321-45-6789']
```

ser.str.findall(pattern) docs

Returns a Series of lists

```
df["SSN"].str.findall(pattern)
```

SSN	
987-65-4321	0
forty	1
123-45-6789 bro or 321-45-6789	2
999-99-9999	3

```
0 [987-65-4321]
1 []
2 [123-45-6789, 321-45-6789]
3 [999-99-9999]
```

Name: SSN, dtype: object



Regular Expression Capture Groups

Earlier we used parentheses to specify the **order of operations**.

Parenthesis have another meaning:

- Every set of parentheses specifies a match/capture group.
- In Python, matches are returned as tuples of groups.

```
text = """Observations: 03:04:53 - Horse awakens.
03:05:14 - Horse goes back to sleep."""
pattern = "(\d\d):(\d\d):(\d\d) - (.*)"
matches = re.findall(pattern, text)
```

```
There's more than one way to regex, e.g. (\d\d) vs (\d{2})
```

```
[('03', '04', '53', 'Horse awakens.'),
  ('03', '05', '14', 'Horse goes back to sleep.')]
```



Back to Our Log File, Part 2

With this notion of groups, let's come back to the regex presented without explanation earlier.

```
import re pattern = r' \setminus [(\d+) \setminus /(\d+) : (\d+) : (\d+) : (\d+) : (\d+) | (
```

operation	example	matches	doesn't match
built-in character classes	\w+ \d+ \s+	fawef 231231 whitespace	this person 423 people non-whitespace
at least one	jo+hn	john joooooohn	jhn jjohn
escape character	cow\.com	COW.COM	cowscom
any character (except newline)	.U.U.U.	CUMULUS JUGULUM	SUCCUBUS TUMULTUOUS



Demo Slides

Finding regex groups

```
re.findall(pattern, text)
```

(Python) Return a list of all matches to pattern.

Returns a Series of lists of all matches.

```
ser.str.extract(pattern)

docs
```

Returns a DataFrame of first match, one group per column

Returns a DataFrame of all matches, one group per column, one row per match



Limitations of Regular Expressions

Writing regular expressions is like writing a program.

- Need to know the syntax well.
- Can be easier to write than to read.
- Can be difficult to debug.

Some people, when confronted with a problem, think 'I know, I'll use regular expressions.' Now they have two problems.

Jamie Zawinski (Source)

Regular expressions sometimes jokingly referred to as a "write only language".

Regular expressions are terrible at certain types of problems:

- For parsing a hierarchical structure, such as JSON, use the json.load() parser, not regex!
- Complex features (e.g. valid email address).
- Counting (same number of instances of a and b). (impossible)
- Complex properties (palindromes, balanced parentheses). (impossible)

However, regular expressions are decent at wrangling text data.



Demo on Restaurant Data

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Bonus: Yes, More Regex Syntax



String function summary

Today we saw many, many different string manipulation tools (highlighted).

- There are many many more!
- With just this basic set of tools, you can do most of what you'll need to wrangle text data!

1	Python String	re	pandas Series
1	s.lower() s.upper()		<pre>ser.str.lower() ser.str.upper()</pre>
	s.replace()	re.sub()	ser.str.replace()
	s.split()	re.split()	ser.str.split()
	s[1:4]		ser.str[1:4]
		re.findall()	<pre>ser.str.findall() ser.str.extractall() ser.str.extract()</pre>
	'ab' in s	re.search()	ser.str.contains()
	len(s)		ser.str.len()
	s.strip()		<pre>ser.str.strip()</pre>

Bonus: Yes, More Regex Syntax

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Optional (but Handy) Regex Concepts

These regex features aren't going to be on an exam, but they are useful:

- Lookaround: match "good" if it's not preceded by "not": (?<!not)good
- Backreferences: match HTML tags of the same name: <(\w+)>.*</\1>
- Named groups: match a vowel as a named group: (?P<vowel>[aeiou])
- Free Space: Allow free space and comments in a pattern.

BONUS MATERIAL

Of these concepts, **named groups** is the most useful for **extraction**.



Bonus: https://tinyurl.com/reg913

operation	example	matches	does not match
character class negation	[^a-z]+	PEPPERS3982 17211!↑å	porch CLAmS
escape character	cow\.com	cow.com	COWSCOM
lazy version of zero or more *?	5 .*? 5	5005 55	5005005

Create a regular expression that matches anything inside of **angle brackets <>**, but none of the string outside of angle brackets.

Example: <div>Moo</div>

Moo should not match because it is not between < and >.

Note: This is equivalent to the problem of matching HTML tags.

Puzzle

BONUS MATERIAL

