### **NLP For Economists**

Lecture 2: Python and Text- An Overview

MGSE - LMU Munich Guest Course, October 2022

6th October 2022

### Session Outline

- Python an overview (Notebook)
- Python and Text an overview (Notebook)
- ► Regular expressions in Python (slides)

### Regular Expressions

- Regular expressions can be described as a system of creating rules to specify patterns that can be extracted from data.
- 2. Where are regular expressions useful?

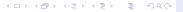
### Regular Expressions

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  - Searching inside texts, information extraction from texts
  - Also used extensively in theoretical computer science (we are not concerned with this aspect in this class!)
  - Substituting one pattern with another.



### Regular Expressions

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- 2. Where are regular expressions useful?
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  - Also used extensively in theoretical computer science (we are not concerned with this aspect in this class!)
  - Substituting one pattern with another.
- 3. Every commonly used programming language supports regular expressions.
- 4. Unix based operating systems have pre-installed terminal based tools such as grep, egrep etc. that allow you to use regular expressions for text processing.



## RegEx for text processing

#### What do we need?

- ► A corpus of texts (or a single text)
- A description of what we want to search for or extract
- A pattern that meets this description.

### Simple Patterns

- ▶ Plain sequence of characters: a pattern "Python" matches all occurrences of Python in text.
- Regular expressions are case-sensitive. To match "python" and "Python", you should have a pattern: [pP]ython.
- ▶ the pattern [abc] matches a or b or c. [pP]ython matches python or Python.
- ▶ patterns [a-z], [A-Z] match all lower and upper case characters respectively. [0-9] matches digits.

# Use of special characters in RegEx

- caret: [^X] matches any single character that is not X. If the caret occurs anywhere else in the sequence, it is treated as a caret symbol.
- asterisk: zero or more occurrences of something. "ba\*" matches b, ba, baa, baaa etc.
- ▶ plus: one or more occurrences of something. "ba+" matches ba, baa, baaa etc. "(ba)+" matches ba, baba, bababa ..
- question mark: the pattern "questions?" catches question and questions.
- period: just a "." matches everything. To match a period, you have to use "\.". "p.n" matches any character between p and n in a text.
- .\*: matches all characters. "p.\*n" matches all characters between p and n.

### "Anchor" characters

- caret, without [], when put in front of a pattern matches the beginning of a line. "^The" matches lines starting with "The".
- ▶ \$ matches the end of the line. "Dog\.\$" matches lines that end in "Dog."
- ▶ \b matches word boundary, \B matches non-boundary. E.g., "\bthe\b" matches "the" but not "other".
- ▶ |(pipe symbol): is used to represent "or" operation. "cat|dog" matches "cat" or "dog".
- pupp(y|ies) matches puppy or puppies.

### Advanced operators

- ▶ \d matches any digit. \D matches any non-digit.
- \w matches any alpha numeric character or underscore.
   \W matches anything other than alphanumeric characters or underscores.
- ► \s matches whitespace. \S matches any non-white space character.
- ▶ \n matches newline.
- ▶ \t matches tab.

# The use of {}

- ► {n} indicates n occcurences of a previous character/expression. "a{2}" matches aa.
- ▶ {n,} indicates n or more occurrences of a previous character or expression. "a{2,}" matches aa, aaa etc.
- ► {m,n} indicates m to n occurrences. a{2,5} matches 2 to 5 occurrences of a's together (aa, aaa, aaaa, aaaaa)

# Substitution and number operator

- We can substitute one pattern with another. E.g., s/colour/color substitutes colour with color (syntax is for illustration. Works with some languages, may not work with python)
- ► An operator \1 is used in regular expression syntax, to refer to a previous part of the full expression.
- ► For example, consider this pattern: s/([0-9]+)/<1> replaces 99 with < 99 >.
- ➤ Such numbered patterns are "memorized" and are called registers. You can have \1, \2 etc in complex patterns. Anything within () counts as one register.

### Substitution and number operator

- ► These operators are very useful in creating canned responses for standard question forms.
- Sometimes, they create an impression of real natural language understanding happening behind screen.

### Regular Expressions: Eliza

- ▶ Eliza was an early NLP program from 1960s.
- ► It simulated conversation between a human and a machine, using pattern machine techniques.
- One version imitates a Rogerian Psychotherapist (demo in next slide)
- ➤ To think that all that can be done just with what we discussed in the class so far is amazing :-)

#### Eliza - Demo

#### Talk to Eliza \* What do you usually do? > Oh... usually do? \* What is your profession, Eliza? > Does that question interest you? \* Of course, isn't that why people ask? > Have you asked such questions before? \* Are you going to answer my questions or no? > Would you prefer if I were not going to answer your questions or no? \* Do you know you test people's patients? > We were discussing you, not me. Input:

## Eliza - Code snippet

```
# gPats, the main response table. Each element of the list is a
# two-element list; the first is a regexp, and the second is a
# list of possible responses, with group-macros labelled as
# %1, %2, etc.
gPats = [
  [r'I need (.*)',
  [ "Why do you need %1?",
   "Would it really help you to get %1?",
    "Are you sure you need %1?"]],
  [r'Why don\'?t you ([^\?]*)\??'.
  [ "Do you really think I don't %1?",
    "Perhaps eventually I will %1.",
    "Do you really want me to %1?"]].
```

source: https://github.com/jezhiggins/eliza.py/
blob/main/eliza.py

# Practice writing RegEx

source: Exercise 2.1 in J&M

Let us say these are our requirements. How do we write a regex for each case?

- 1. all lowercase alphabetic strings ending in b.
- 2. All lines that start at the beginning of the line with a number, and that end with a word.
- 3. All lines that have both the words "the" and "of" in them (but not "then", they", "often" etc)
- all strings with two consecutive repeated words ("big big" but not "big bug")

### Solutions

▶ all lowercase alphabetic strings ending in b:

▶ all lines that start at the beginning of the line with a number, and that end with a word:

$$^d.*\b[a-zA-Z]+\.$$

➤ all lines that have both the words "the" and "of" in them (but not "then", they", "often" etc):

\bthe\b.\*\bof\b

all strings with two consecutive repeated words ("big big" but not "big bug"):

 $\b(\w+)\s\1 (not \b(\w+)\b\1. Why?)$ 

# Python and Regular Expressions-1

- re is the python library that supports processing with regular expressions (import re)
- re.compile(some pattern) is used to compile a pattern into a "pattern" object, and use the pattern again in the program.
- re.search(pattern,string,\*flags) is used to search for the first location of a pattern in a given string.
- re.match(same params) is similar to search(), but only matches the pattern at the start of the string.
- re.fullmatch(same params): shows a match only if the full string matches with the pattern.
- Important flags: re.MULTILINE (matches regular expressions looks for matches at each line), re.DOTALL (includes newlines in matching).

Refer: https://docs.python.org/3/library/re.html

# Python and Regular Expressions-2

- re.findall(pattern,string,\*flags): finds all matches for a pattern, and returns a list.
- re.sub(pattern,replacement,string,\*flags): Replace one pattern with another. Returns the new string with replacements.
- re.subn(same params): Same as sub() but returns a tuple (new\_string, num. of replacements made).
- ➤ Tip: Use of ? after .\* in Python regular expressions lets you match shortest matches. Otherwise, python matches longest possible match by default.
- re.split() similar to split() of strings, but accepts patterns along with plain strings.

### RegEx - some examples

```
import re
fh = open("example.txt")
#Prints lines having "th" after a space
for line in fh:
    if re.search(" th",line):
        print(line)
        print()
#Prints a list of matches spanning multiple lines
content = open("example.txt").read()
temp = re.findall("sometimes.*difficult",
            content, re. DOTALL)
#remove re.DOTALL and try.
print(temp)
```

## RegEx - some examples

#### Continuation from previous slide

```
#re.MUI.TII.INF. overview
temp2 = re.findall("^This",content,re.MULTILINE)
#Remove re.MULTILINE or replace with re.DOTALL and try.
print(temp2)
#re_sub() overview
temp3 = re.sub("Th", "HA", content)
#replace sub with subn and try
print(temp3)
#For more details on other re functions, visit:
#https://docs.python.org/3/library/re.html
```

## RegEx - Programming practice

All wikipedia pages have links in their side panel, that links to the versions of an article in other languages. Write a Python program that uses regular expressions and string functions, and prints these links.

### A solution

```
import re
from urllib.request import urlopen
def get_input_url():
   link = input("Enter the wikipedia url: ")
   p = re.compile(".*?</a>")
   #why the question mark after .*?
   #How to get this pattern above?
   #Look at the source of HTML from browser.
   try:
       html = urlopen(link).read().decode(encoding="utf8").strip()
       temp_list = re.findall(p, html)
       for item in temp_list:
          #print(item)
          #printing this told me what I should split.
          my_link = item.split("a href=\"")[1].split(" ")[0]
          #What is this???
          print(my_link)
   except:
       print("something is wrong. Quitting the program")
       exit()
```

## Summary

- There is far more than what I just introduced, and regex is a very useful tool while doing NLP
- ► Even though it would seem like they have no role in modern NLP dominated by deep learning, they do.
- ► Look inside the code of popular NLP libraries. You will see a regex somewhere!
- Sometimes, knowing the right regex will save a lot of time and effort.

### Tomorrow's Session

- Overview of various NLP methods
- ▶ Hands on + lecture
- ➤ ToDo: Try to talk to your friends and choose a team of 2-3 people for group discussion. You can also present individually, if you want. Let me know whatever you choose, by Monday (10th October 2022).
- The above item counts for your grade.