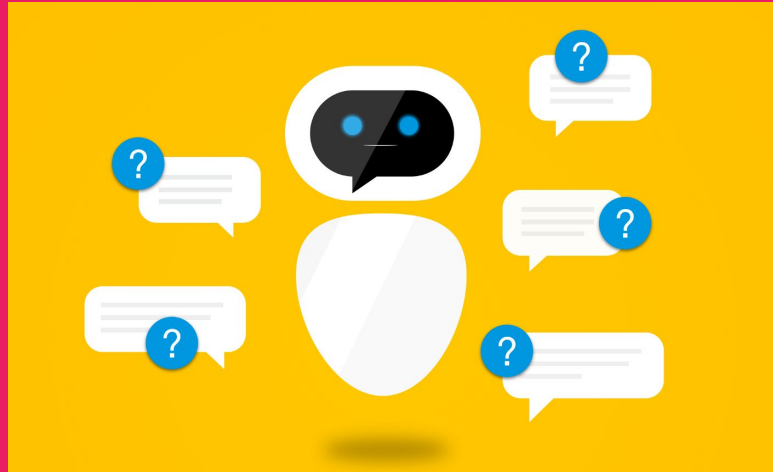


# Natural Language Processing



# Basics



# What?

---

- Understanding + analyzing lang.
  - Speech to text
- Complex variables
  - Slang, slurs, regional dialects



# Examples

----

- Siri - Apple
- Galaxy - Samsung
- Watson - IBM
- Cortana - Windows
- Echo Dot - Amazon

**SAMSUNG**  
**Galaxy**



# Examples (cont.)

- Machine Translation
  - Google Translate

- CHATBOTS!!!!

- Applications interacting with users for better experience

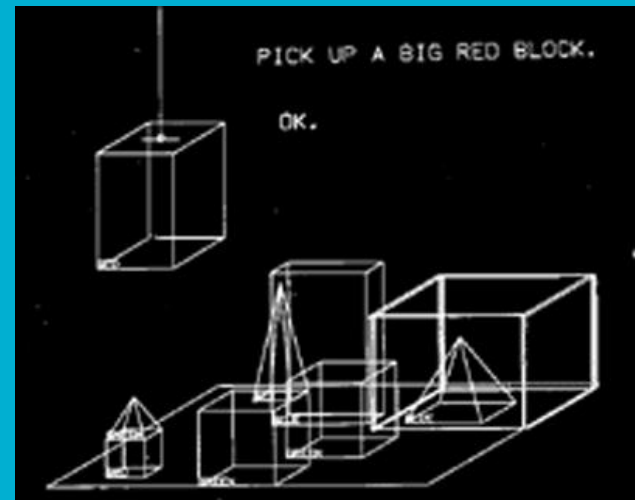


## MACHINE TRANSLATION



# History

- 1966-1980
  - Powerful computers
- CHATBOT!!!!
- SHRDLU
  - Program dev. @ MIT 1968-1970
    - Lisp
  - Accurately understanding lang.  
& retain memory + understand word in other contexts
  - Real word applications



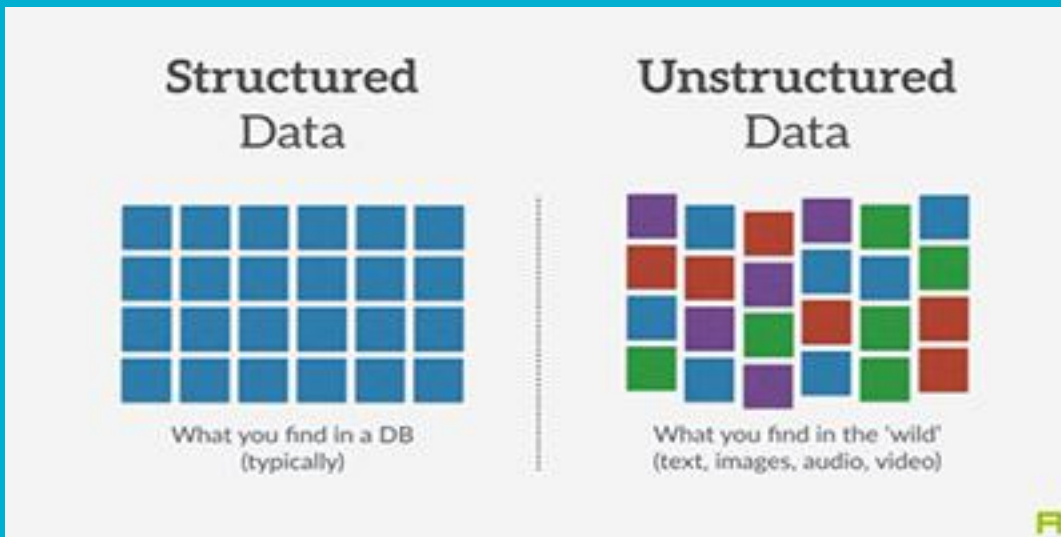
# Structured vs. Unstructured Data

## ➤ Structured

- Table
- Charts
- Data base
- Very organized

## ➤ Unstructured

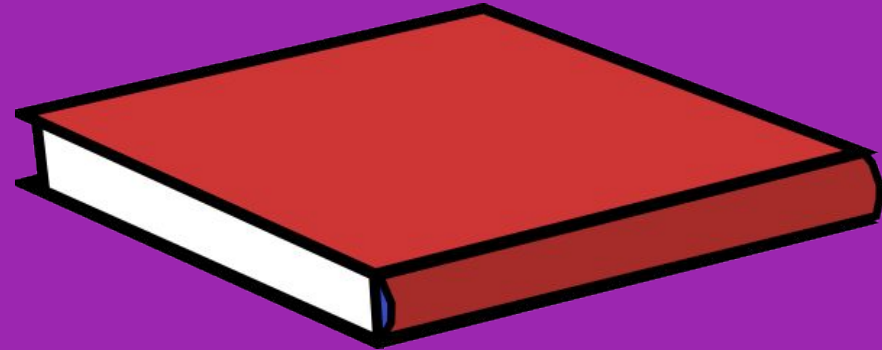
- Long winding text
- Difficult to organize







# Core Concepts



# Stemming and Lemmatization

---

- Reducing word to base form
  - Lemma : base of word
- Stemming : “chopping off” word
  - Ex : amusing, amusement, amused : stem = amus
- Examples
  - I am a student → I be a student
  - My computer’s touch screen is not working → My computer touch screen be not working



# Differences between Stemming & Lemmatization

--

## ➤ Differences

- Stemmer : single word, no context
- Lemma : appropriate base for diff. Scenarios
  - Ex : meeting
    - We are meeting tomorrow, In our meeting yesterday

## ➤ I saw the most awesome NLP bot!

- Stem : I s the most awesome NLP bot!
- Lemmatizing : I see the most NLP bot!

## ➤ Stemming

- Flies → fli
- Bananas → banana

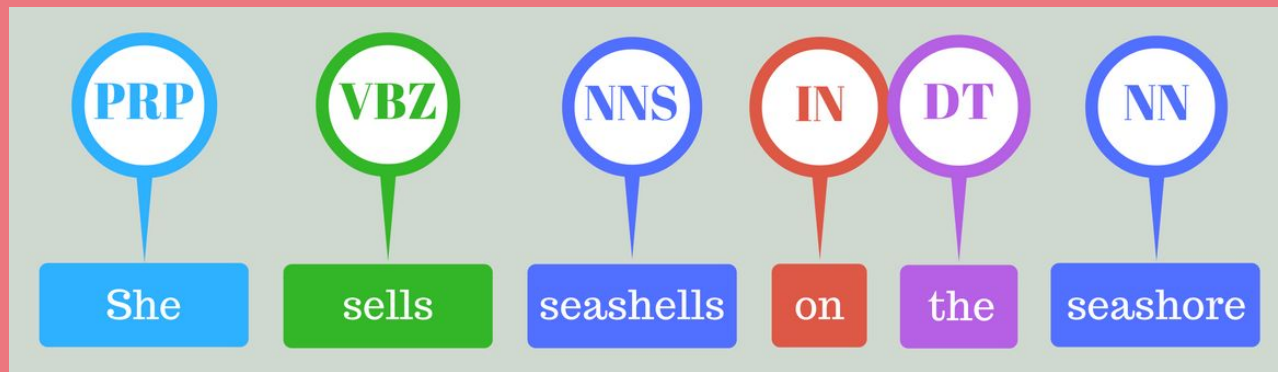
## ➤ Lemmatization

- Flies → fly

## ➤ Lemmatization more applied

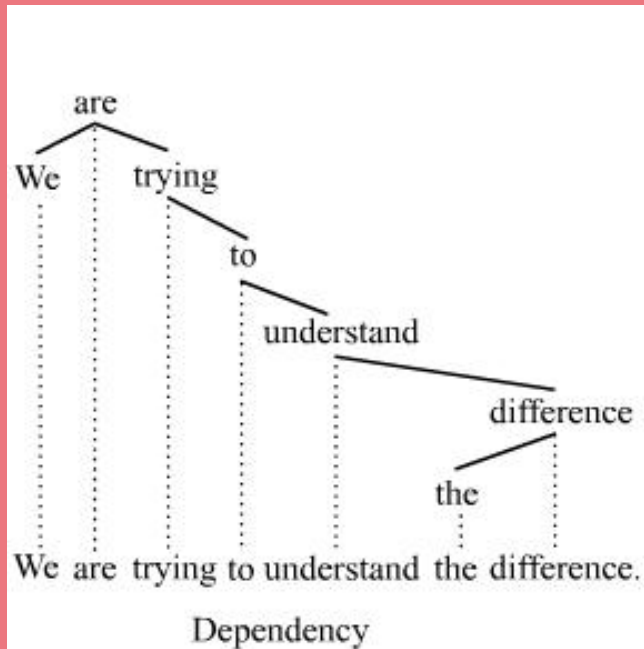
# Part of Speech (POS) Tagging

- Objective : categorize & assign POS to each word
- I want to learn NLP
  - I (Preposition)
  - Want (Verb)
  - Learn (Verb)
  - NLP (Noun)



# Dependency Parsing

- Understand dependencies and relationships of words
- Dependency tree
- Examples & Terms
  - Subject
  - Object
  - Complement
  - Modifier



# Named Entity Recognition (NER)

- Associates entities (categories) with different words
- Examples
  - The Jungle Book : FILM
  - Plainsboro Public Library : LOCATION
  - Taylor Swift : SINGER/SONGWRITER



# NER Example

— — —

In 1917, Einstein applied the general theory of relativity to model the large-scale structure of the universe. He was visiting the United States when Adolf Hitler came to power in 1933 and did not go back to Germany, where he had been a professor at the Berlin Academy of Sciences. He settled in the U.S., becoming an American citizen in 1940. On the eve of World War II, he endorsed a letter to President Franklin D. Roosevelt alerting him to the potential development of "extremely powerful bombs of a new type" and recommending that the U.S. begin similar research. This eventually led to what would become the Manhattan Project. Einstein supported defending the Allied forces, but largely denounced using the new discovery of nuclear fission as a weapon. Later, with the British philosopher Bertrand Russell, Einstein signed the Russell-Einstein Manifesto, which highlighted the danger of nuclear weapons. Einstein was affiliated with the Institute for Advanced Study in Princeton, New Jersey, until his death in 1955.

Tag colours:

LOCATION

TIME

PERSON

ORGANIZATION

MONEY

PERCENT

DATE

# Automatic Summarization

— — —



before



after

- Shortening, or summarizing long document
  - Accuracy
  - Major points
- Examples:
  - IBM Watson : ability to write good headline
    - Feed large amt. Of data & Watson has ability to summarize text



# Tokenization

---

- Separate individual words & punctuation marks
  - Breaking up text by identifying positions of spaces & punctuation

This is a test that isn't so simple: 1.23.

This  
is  
a  
test  
that  
is  
n't  
so  
simple  
:  
1.23  
.

# Text Segmentation Example

---

Line 1

This left turn will be a U turn.

Segment

This left will be a U turn.

0

1

2

3

4

5

6

Line 2

Go on Audobon parkway to the next

Segment

Go on Audobon parkway to the next

0

1

2

3

4

5

6

Line 3

There will be a traffic light there.

Segment

There will be a traffic light there.

0

1

2

3

4

5

# Removal Of Stop Words

- Stop words
  - Don't contain significance in search queries
  - Stop words are filtered out of queries (google search)
- Examples of Stop Words
  - A, about, along, behind, etc.
  - **<http://xpo6.com/list-of-english-stop-words/>**
- Improves efficiency
- Reduces file size

**Table 3:** Example of stop word removal.

|  |       |          |   |       |   |
|--|-------|----------|---|-------|---|
| A swimmer likes swimming, thus he swims. |       |          |   |       |   |
| ↓  |       |          |   |       |   |
| swimmer                                  | likes | swimming | , | swims | . |

# Language Identification

- Determines language of content/doc.
- After identifying language
  - Applies best dictionaries for each file
- Google Translate

Instantly identify and triage  
many languages within large  
volumes of text.

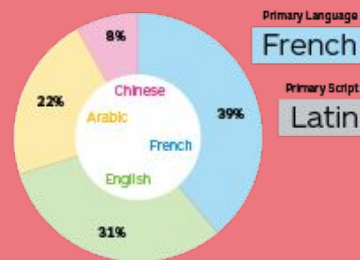
即时识别和处理大量多语言文本。

Identifiez et triez instantanément plusieurs

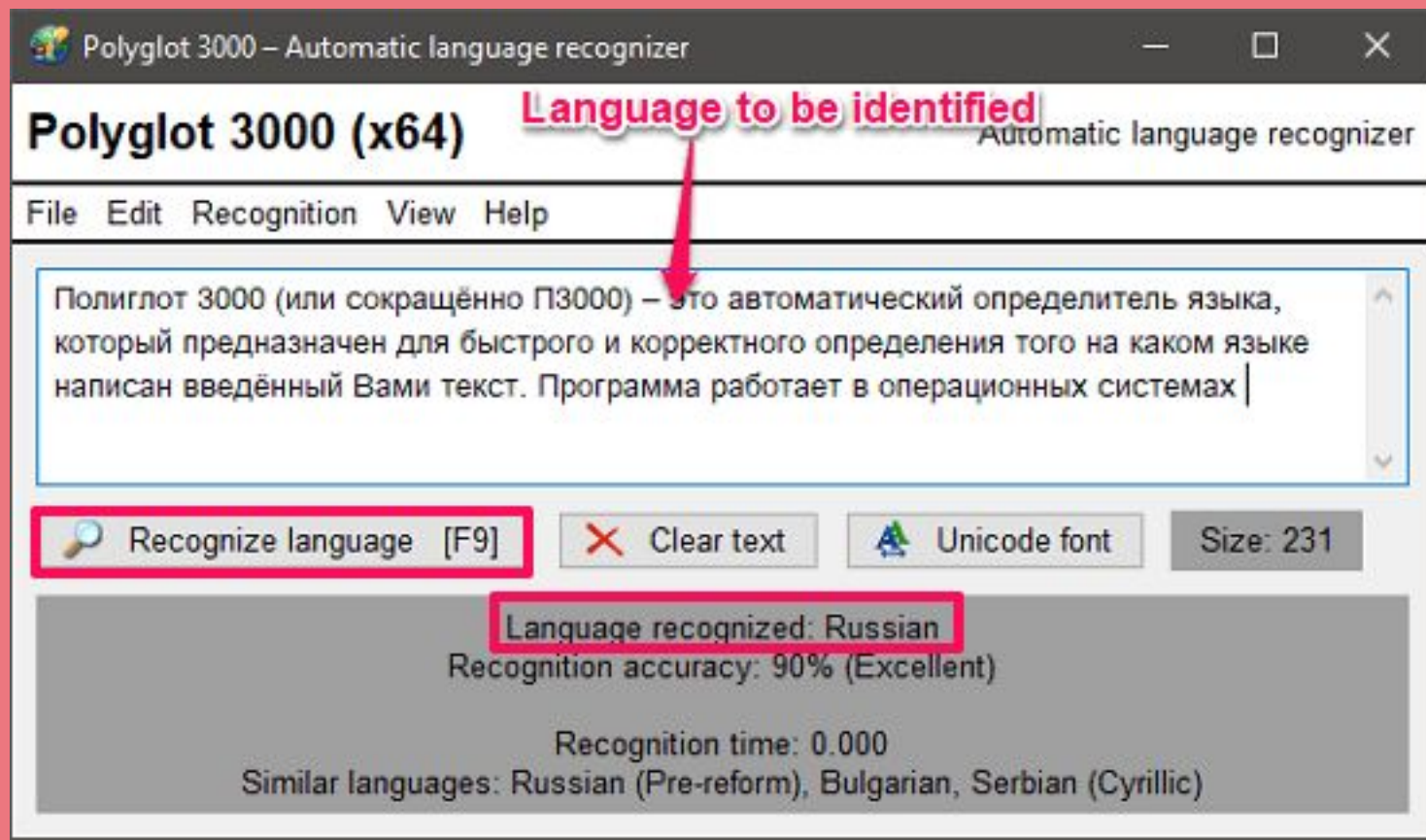
langues à travers de nombreux textes.

التحديد والمعالجة الفورية للعديد من اللغات

ضمن كميات كبيرة من النصوص



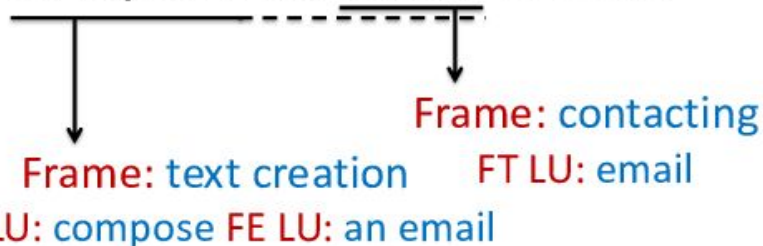
# Language Identification Example



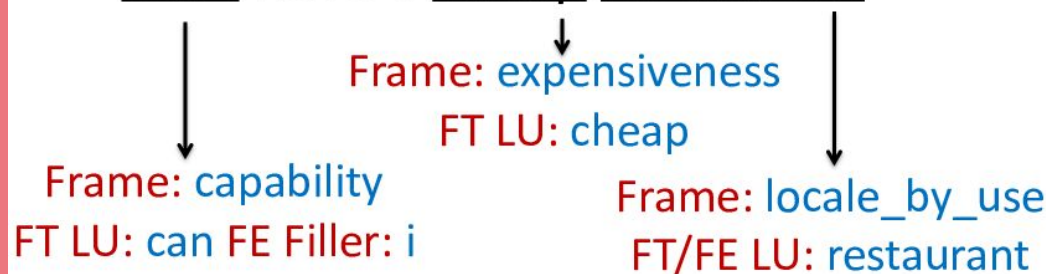
# Semantic Parsing

- Mapping sentence into a formal rep.
- Ability to identify roles
  - Student, location, food, etc.

compose an email to alex



can i have a cheap restaurant



# Open Information Extraction (OIE)

---

- Generates machine rep. Of text
  - Uses POS tagger to establish relationships
- Objective
  - Find relationships expressed in huge
  - How to find accurate relationships

## Open Information Extraction on the Web

### **TextRunner** *Banko et al., IJCAI'07*

Unsupervised, single-pass extraction for the Web.  
No relation names required for input.

Extracted  
Tuple: was founded by (EBay, Pierre Omidyar)

Noun

Relation

Noun Phrase

EBay was founded by Pierre Omidyar.

# OIE Examples

## Open IE: Motivation (5)

Argument 1:

Argument 2:

Relation:

All

**7 answers** from **93 sentences** (cached)

- Bill Gates (64)
- Paul Allen (18)
- the man (3)
- Allen (2)
- Microsoft Bill Gates (2)

## Open IE: Motivation (8)

Argument 1:

Argument 2:

Relation:

All

**6 answers** from **35 sentences** (cached)

- Tent (20)
- Dormitory (7)
- classrooms (2)
- car (2)
- thatched-roof bandas (2)
- class (2)

Huck, Matthias, and Alexander Fraser. "Open Information Extraction."

[Http://Www.cis.uni-Muenchen.de/~Fraser/information\\_extraction\\_2016\\_lecture/12\\_open\\_IE.Pdf](http://Www.cis.uni-Muenchen.de/~Fraser/information_extraction_2016_lecture/12_open_IE.Pdf), 18 Jan. 2017.



# Textual Entailment

- Gives direct relation between text fragment & hypothesis

## The Textual Entailment Task: More complex example

T: An avalanche has struck a popular skiing resort in Australia, **killing** at least 11 people.

H: Humans **died** in an avalanche.

- Again, need to match semantic roles:

T: avalanche kill people

H: human die in avalanche

- Again need for “frame semantics”
  - (syntax) X kill Y → (semantics) **cause** kill **victim**
  - (syntax) X died in Y → (semantics) **protagonist** died in **cause**
- ALSO:
  - *protagonist* is a *victim*, Killing → Death



## Textual Entailment

- Example 1 (TRUE)

**Text:**

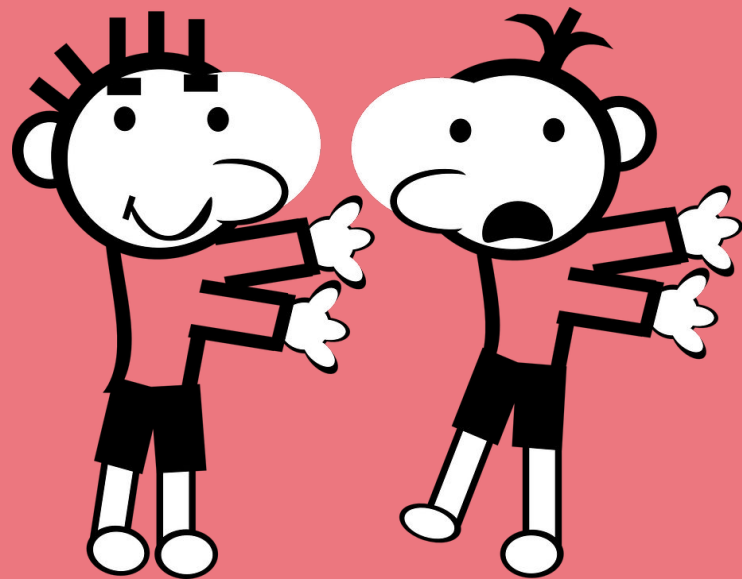
His family has steadfastly denied the charges.

**Hypothesis:**

The charges were denied by his family.

# Argumentation Mining

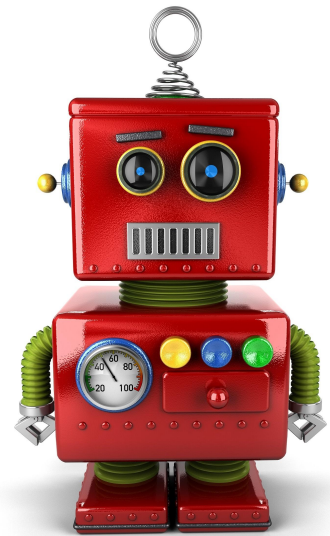
- Detection of arguments & relationships
  - Understanding POV (Point of View) of user
  - Point vs. counterpoint
- Argumentation model components
  - Claim
  - Data
  - Qualifier
  - Warrant
  - Rebuttal
  - Backing



# Linguistic Empathy

---

- Ability for machine to understand POV
  - Point of view of user
  - Empathize
- Empathic chatbots
  - Building feelings in robots



# Sentiment Analysis

- Ability for machine to understand human emotion
- Categorizing + classifying opinions
  - Positive, negative, or neutral



# Steps to Sentiment Analysis

— — —



# Sentiment Analysis Activity

---

## 1. Gather materials

- Markers
- Paper

## 2. Focus on one sentiment

- Examples : angry, sad, nervous, etc.

## 3. Create a web

- In the middle : have sentiment, “anger”, or “sadness”
- Branch off words indicating feeling/sentiment(Noun)
  - Ex : anger → frustrated, infuriated (Adjectives)
- Branch off poss. Sentences indicating feeling (Sentence, include verb)

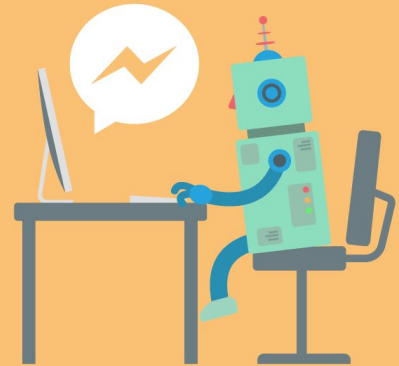
## 4. Share & try with Siri/Galaxy/Cortana.

### SENTIMENT ANALYSIS






Discovering people opinions, emotions and feelings about  
a product or service

# Chatbot Activity (IBM Chatbots for Good)



# Step 1 : Scenario Map

- Draw 4 rows
- Phases row
  - Write down actions/phases
  - Ex : new student at school
    - Prepares for school, etc.
  - 4-6 phases
- Doing row
  - Actions person is performing
- Thinking row
  - Person's internal thoughts
- Feelings row
- Use marker to circle most intense moments (terrified, nervous)

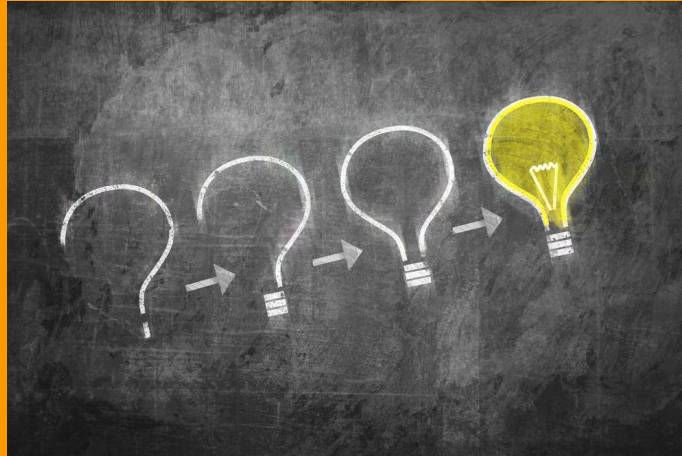
| PHASES   | Prepares for school | Rides the bus                | Goes to classes | Goes home |
|--|---------------------|------------------------------|-----------------|-----------|
| <br>DOING    |                     |                              | "Hi, i'm Maria" |           |
| <br>THINKING |                     | Maybe the kids won't like me |                 |           |
| <br>FEELING  |                     | Excited Nervous              |                 |           |



# Step 2 : Creating Solutions

---

- Choose one of the circled items
- Brainstorm possible solution ideas
  - Different POVs
    - Ex : As a teacher, I can guide a new student through the school.
    - Ex : As a student, I can help the new student by...



## Step 3 : Code - Outside of Workshop @ Home

- Code and step by step process to create simple chatbot @ home
- Resources and info. @ end of presentation
  - Resources will be posted on Classroom

```
for i in people.data.users:
    response = client.api.statuses.user_timeline.get(screen_name=i.screen_name)
    print 'Got', len(response.data), 'tweets from', i.screen_name
    if len(response.data) != 0:
        ltdate = response.data[0]['created_at']
        ltdate2 = datetime.strptime(ltdate, '%a %b %d %H:%M:%S +0000 %Y')
        today = datetime.now()
        howlong = (today-ltdate2).days
        if howlong < daywindow:
            print i.screen_name, 'has tweeted in the past', daywindow,
            totaltweets += len(response.data)
            for j in response.data:
                if j.entities.urls:
                    for k in j.entities.urls:
                        newurl = k['expanded_url']
                        urlset.add((newurl, j.user.screen_name))
        else:
            print i.screen_name, 'has not tweeted in the past', daywindow
```

# What are Bots?

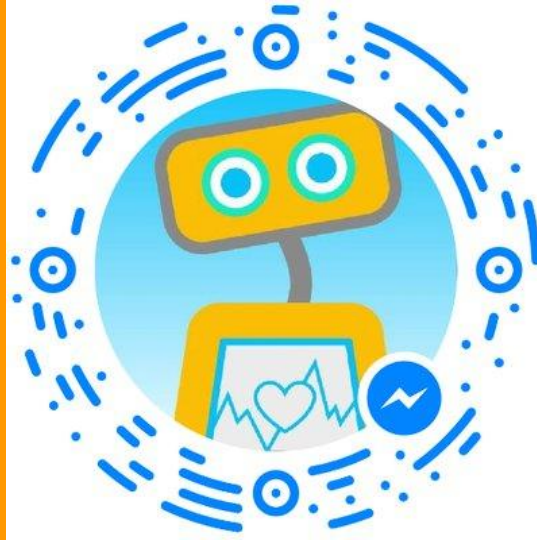
---

[https://www.youtube.com/watch?  
time\\_continue=60&v=fEbzk4vTHsQ](https://www.youtube.com/watch?time_continue=60&v=fEbzk4vTHsQ)

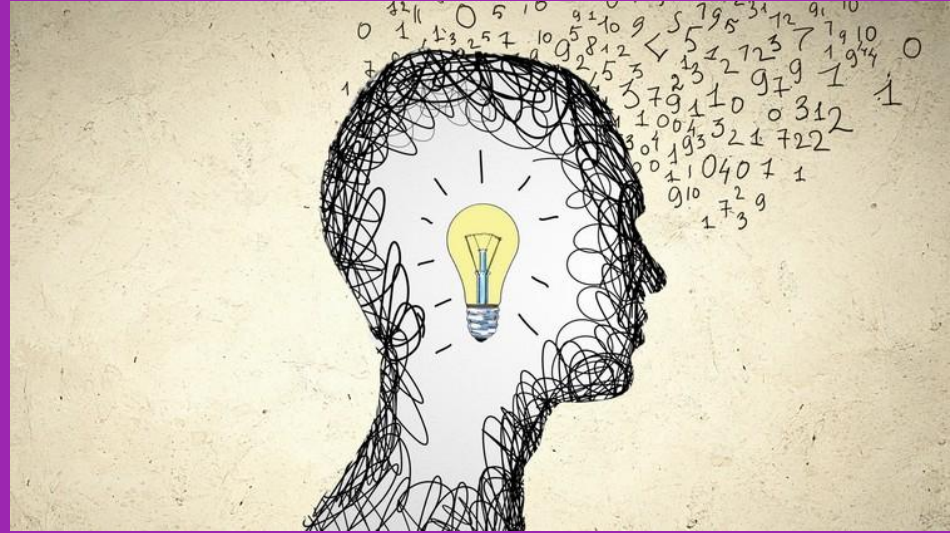
[https://www.youtube.com/watch?  
v=uE\\_WJTnqUwA](https://www.youtube.com/watch?v=uE_WJTnqUwA)

# Examples of Sentiment Analysis Driven Chat Bots

- Woebot : <https://woebot.io/>
- Siri, Alexa, Cortana, Echo Dot, Watson, etc.
- <https://www.youtube.com/watch?v=lmKqmPoU2ec>



# NLP With Java & Python



# Resources

---

## ➤ Java

- Eclipse - IDE
  - Basics on classes, etc.
  - If/else statements
  - Import Stanford Core NLP APIs or Apache OpenNLP


## ➤ Python

- JetBrains PyCharms or IDLE
  - Basics on Python
  - Logic if/else statements
  - Import **Natural Language Toolkit (NLTK)** libraries
    - **NLTK** performs all the NLP concepts we discussed



## Steps with Java/Python

\_\_\_\_\_

1. Download & Install \_\_
  2. Go through tutorial posted on classroom (posted by tomorrow)
    - a. Code I wrote, step by step procedure with meaning
    - b. After understanding code, copy + run in IDE
  3. Run and see the result!
- 



# How Watson Really Works

<https://www.youtube.com/watch?v=Xcmh1LQB9I>



**Cognitive Computing : Machine  
uses AI concepts to simulate  
human thinking by self learning  
through recognizing patterns  
and developing models**