



# Fundamentals of Building a Retrieval Based Chatbot

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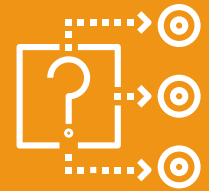
# Agenda

- Business Expectations from Chatbots
  - Value Proposition
  - Business Metrics
  - Conversational Metrics
  - CSAT Metrics
- Options Available for Developers
  - Menu Based Chatbots
  - Keyword Based Chatbots
  - Contextual Chatbots
- Deeper look into Contextual Chatbots
- General Steps when building a chatbot
- Generative Chatbots
- Retrieval Chatbots
- Jupyter Notebook - An illustration using Flight Dataset from Kaggle





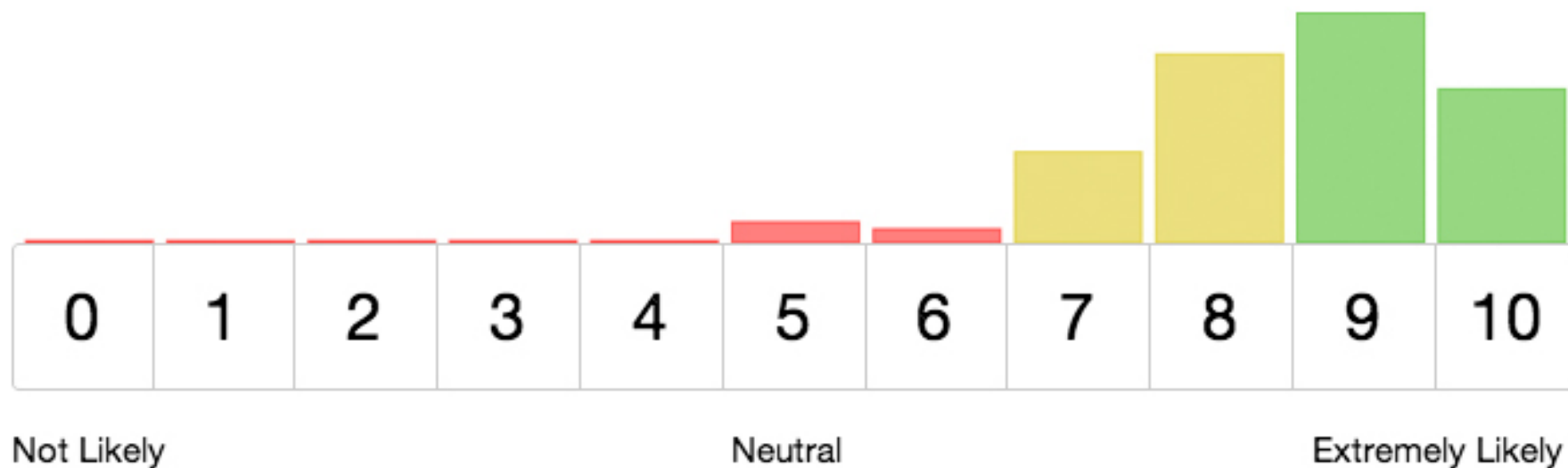
# Next Business Expectations from Chatbots



What really is the expectation of Businesses interested in Chatbots



# Chatbot Value Proposition



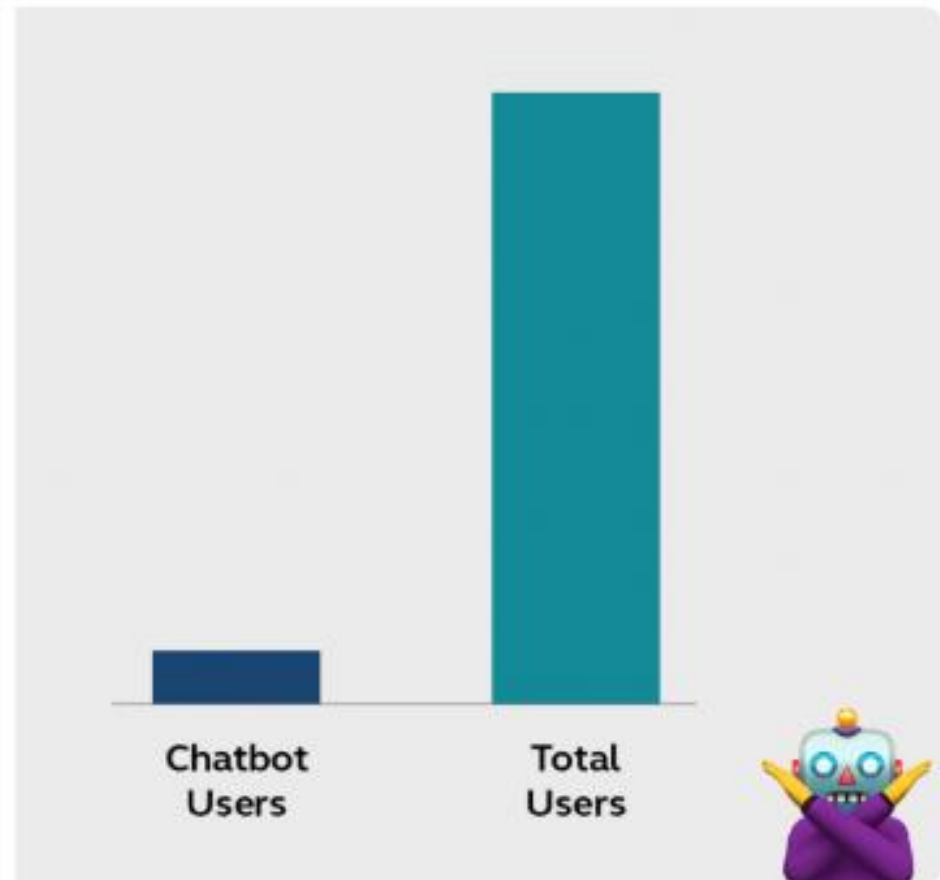
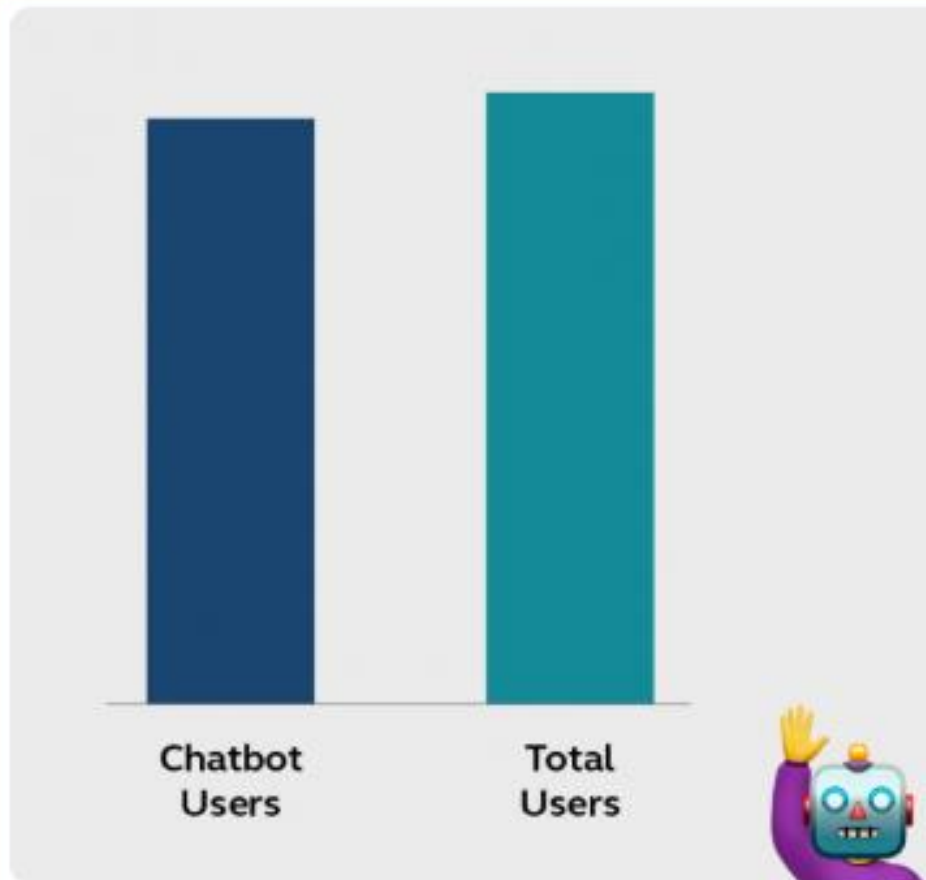
**Net Promoter Score: 50**

**55%** promoters - **5%** detractors



# Business Metrics

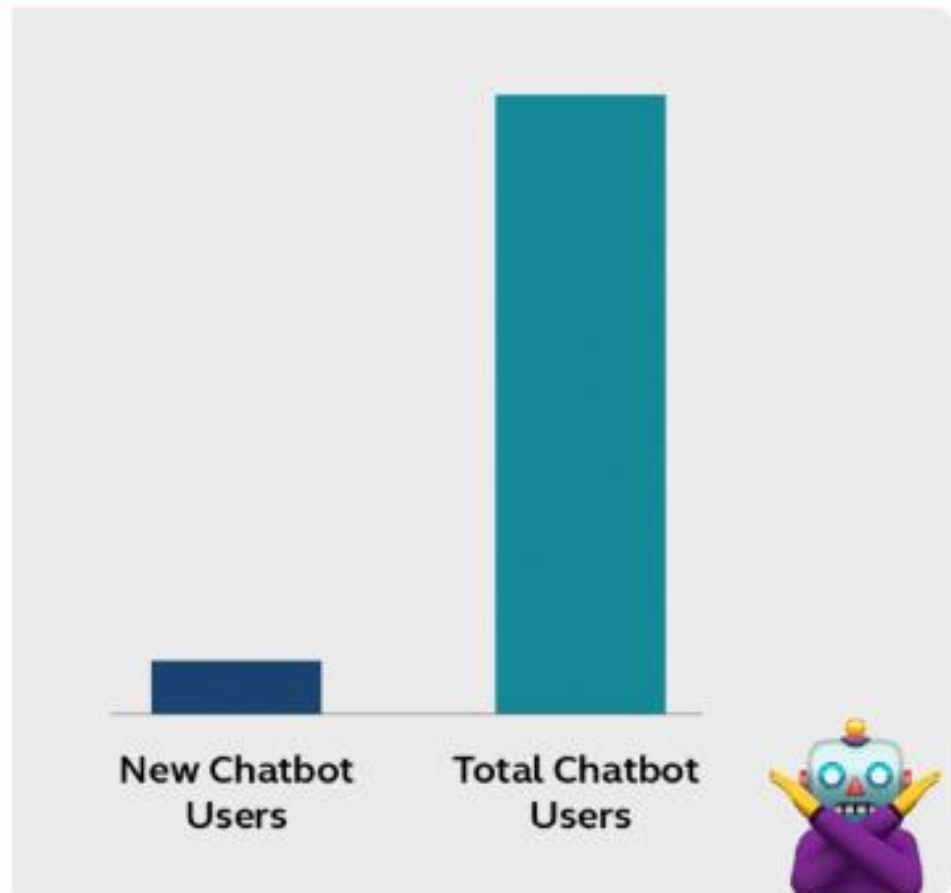
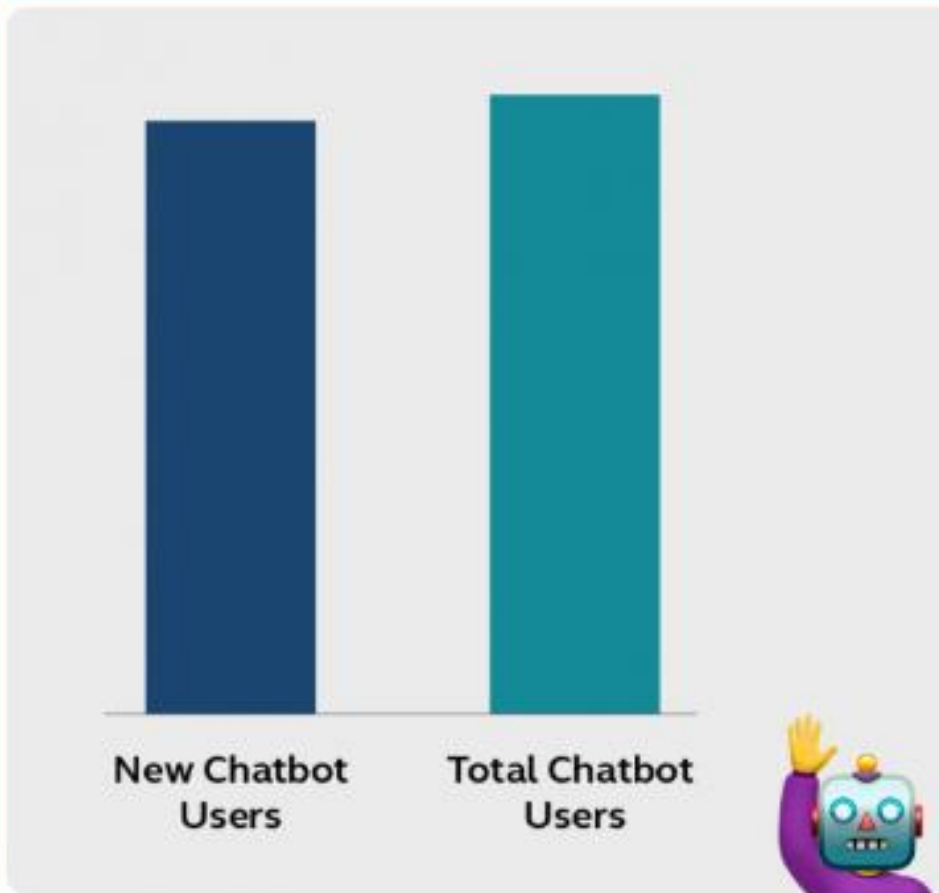
Total User Metrics - Are you helping your customers?





# Business Metrics

New User Metrics - Are you gaining users?



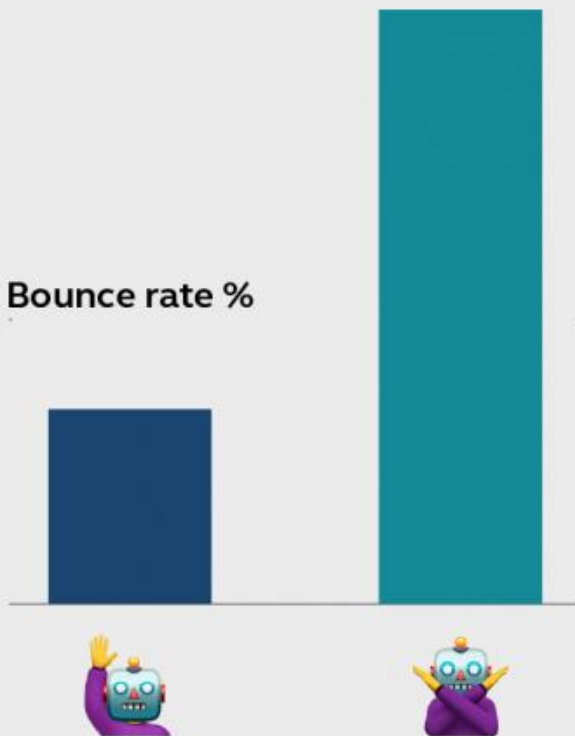




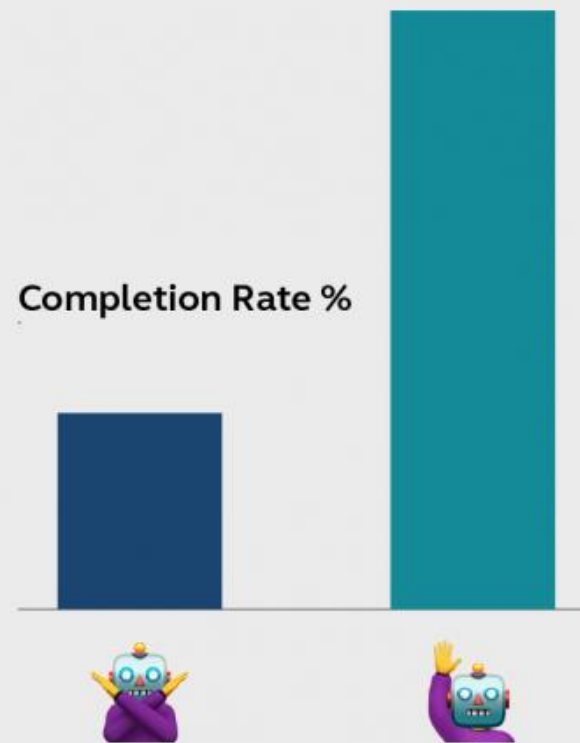
# Business Metrics

Bounce Rate & Goal Completion - Is the chatbot useful?

Bounce rate %



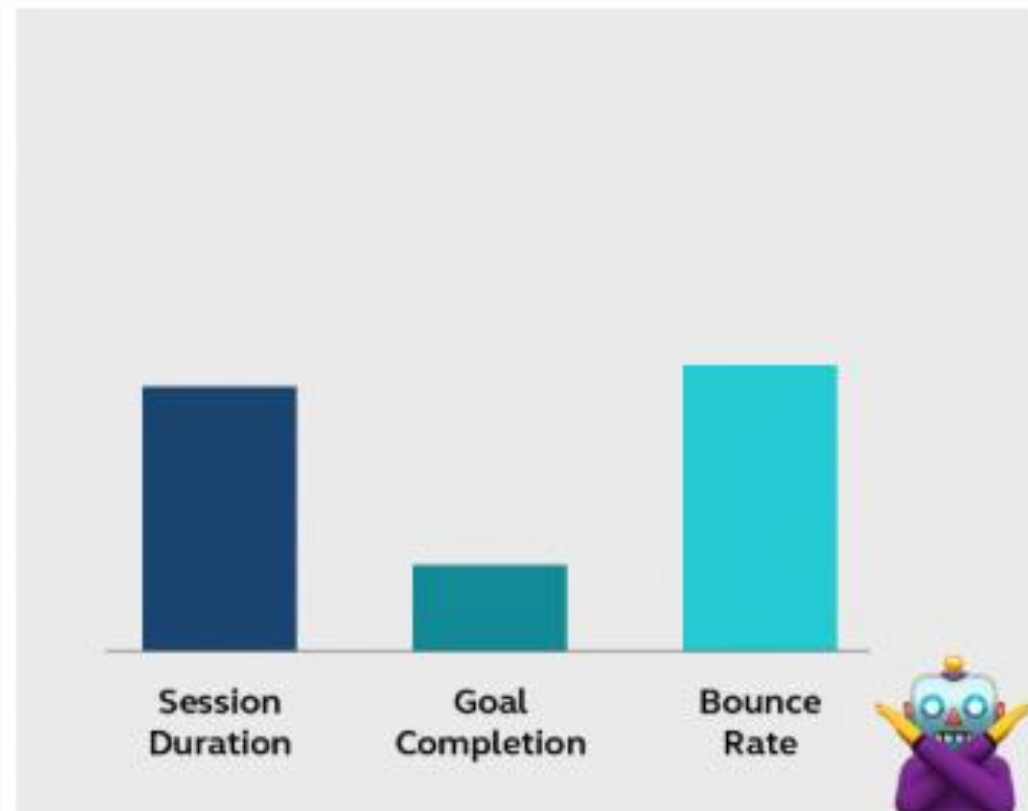
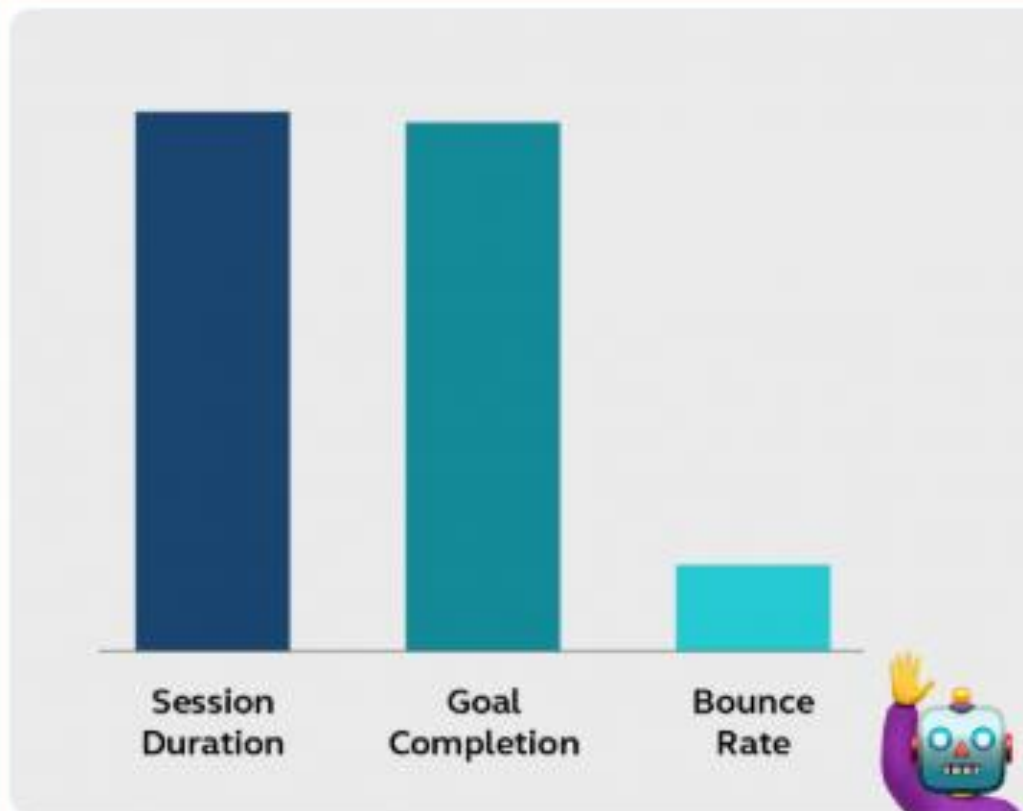
Completion Rate %





# Conversation Metrics

Session duration - Do you have fruitless conversations?

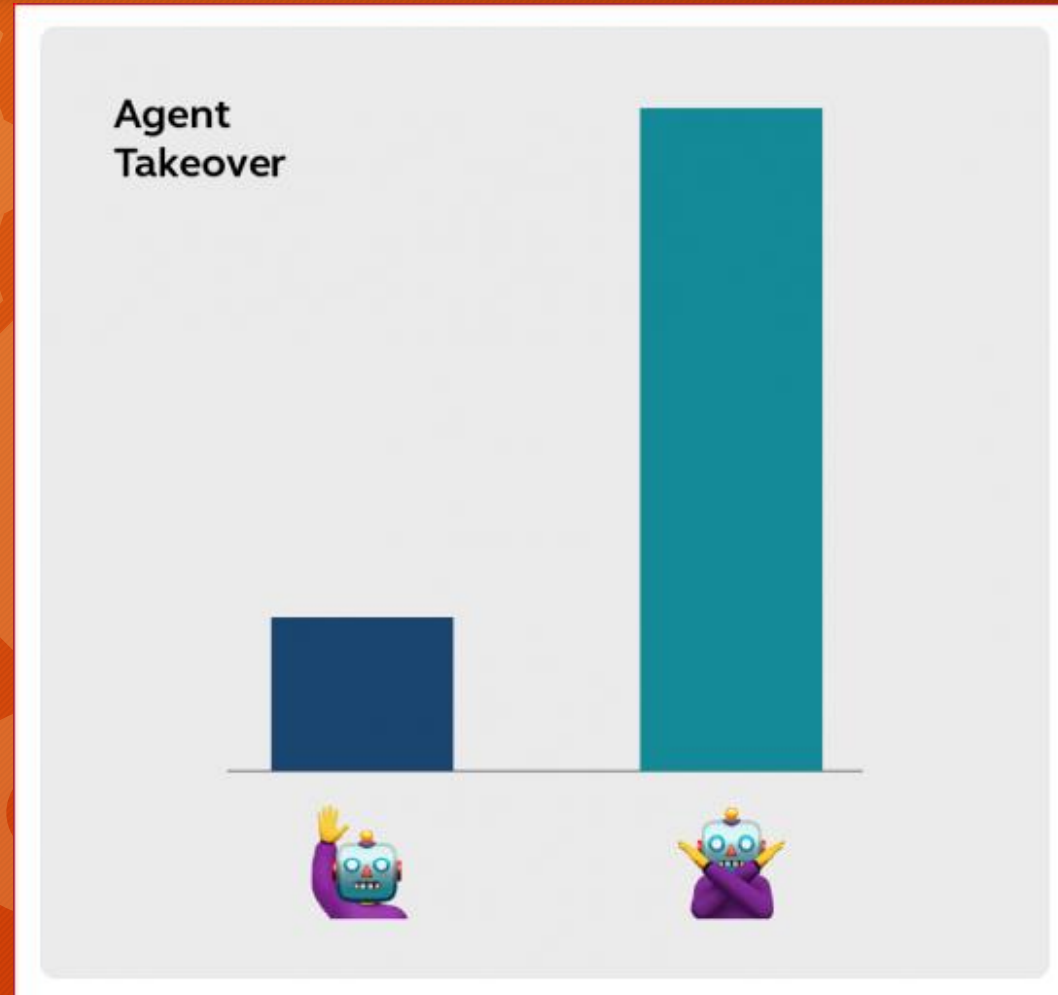






# Conversation Metrics

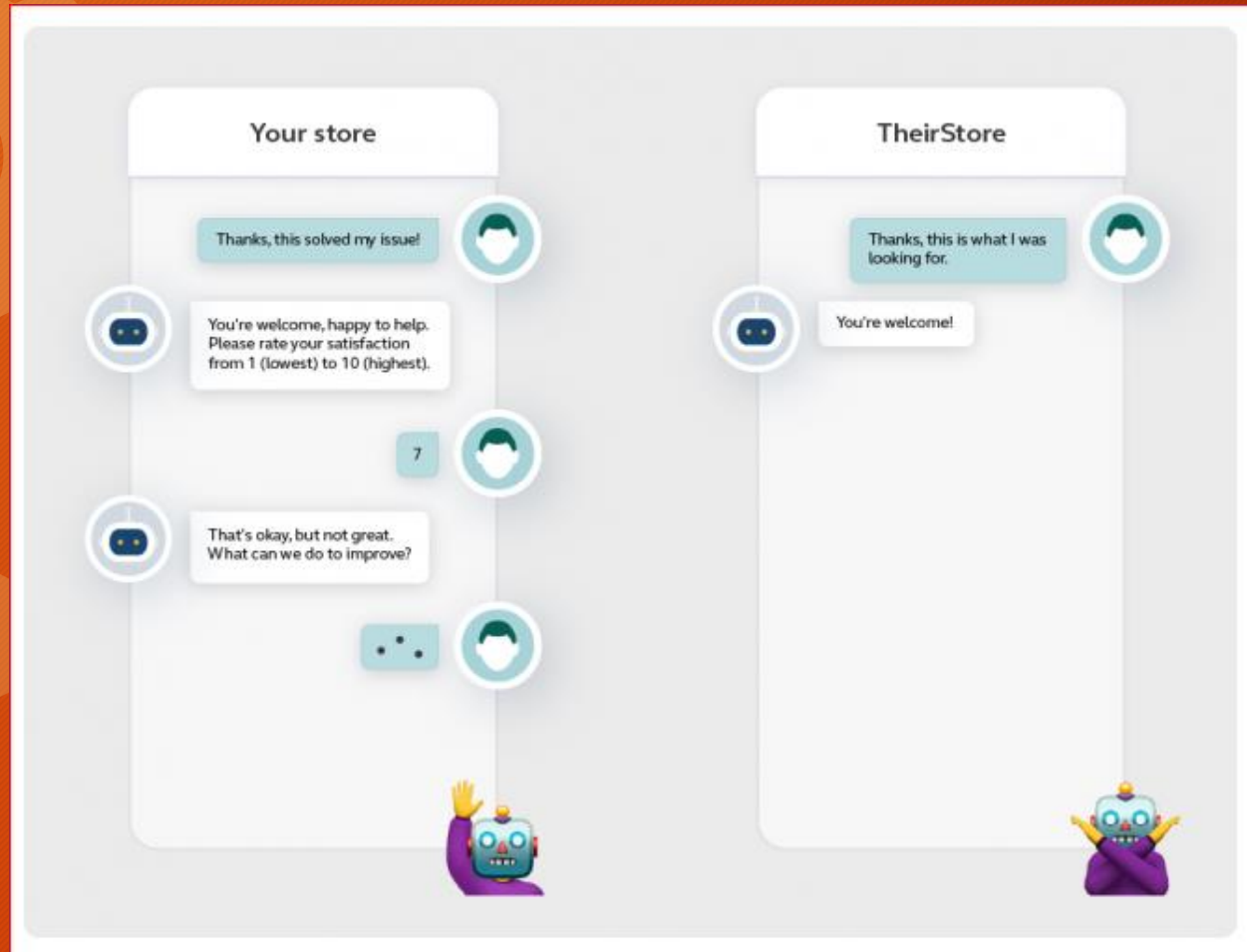
Agent Takeover - Is the chatbot handling Conversations?





# CSAT Metrics

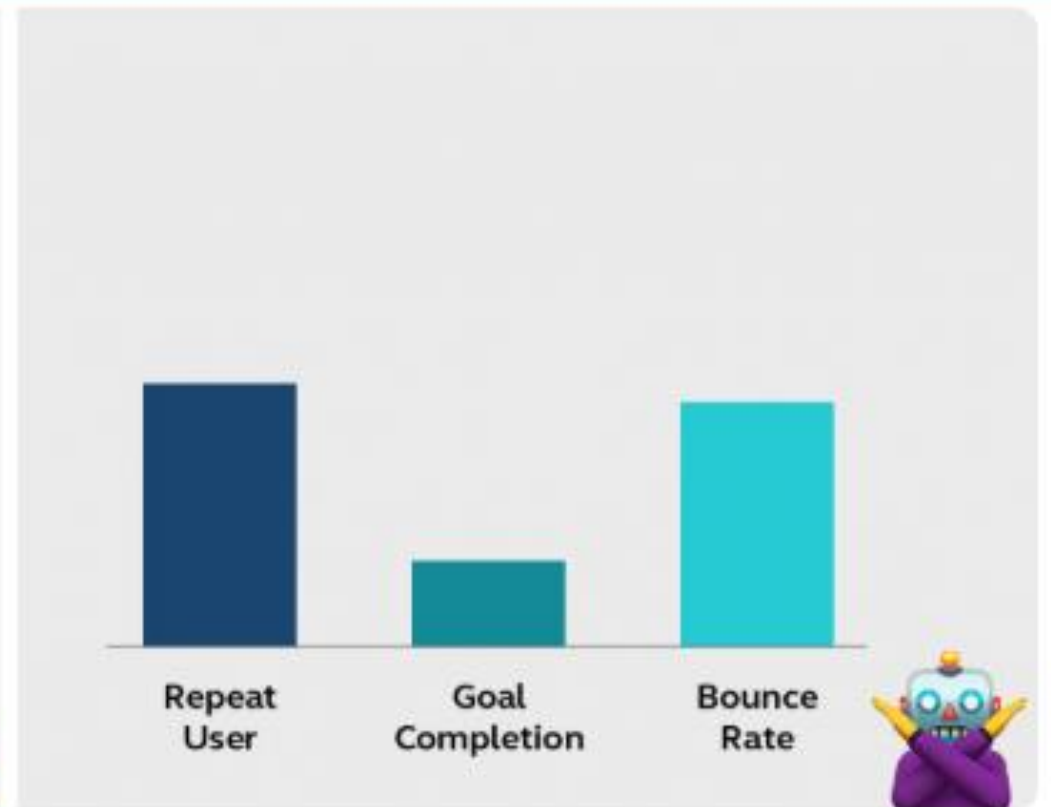
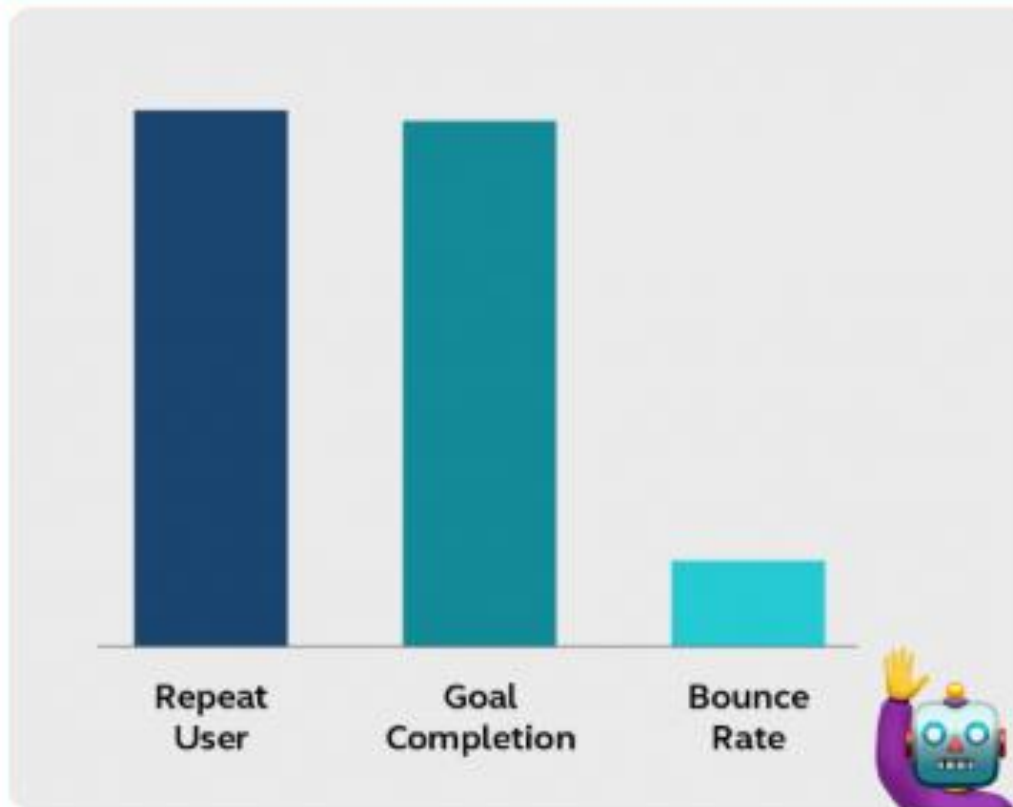
## NPS - How is the Net Promoter Score?





# CSAT Metrics

Retention Rate - Do we have any repeat customers?

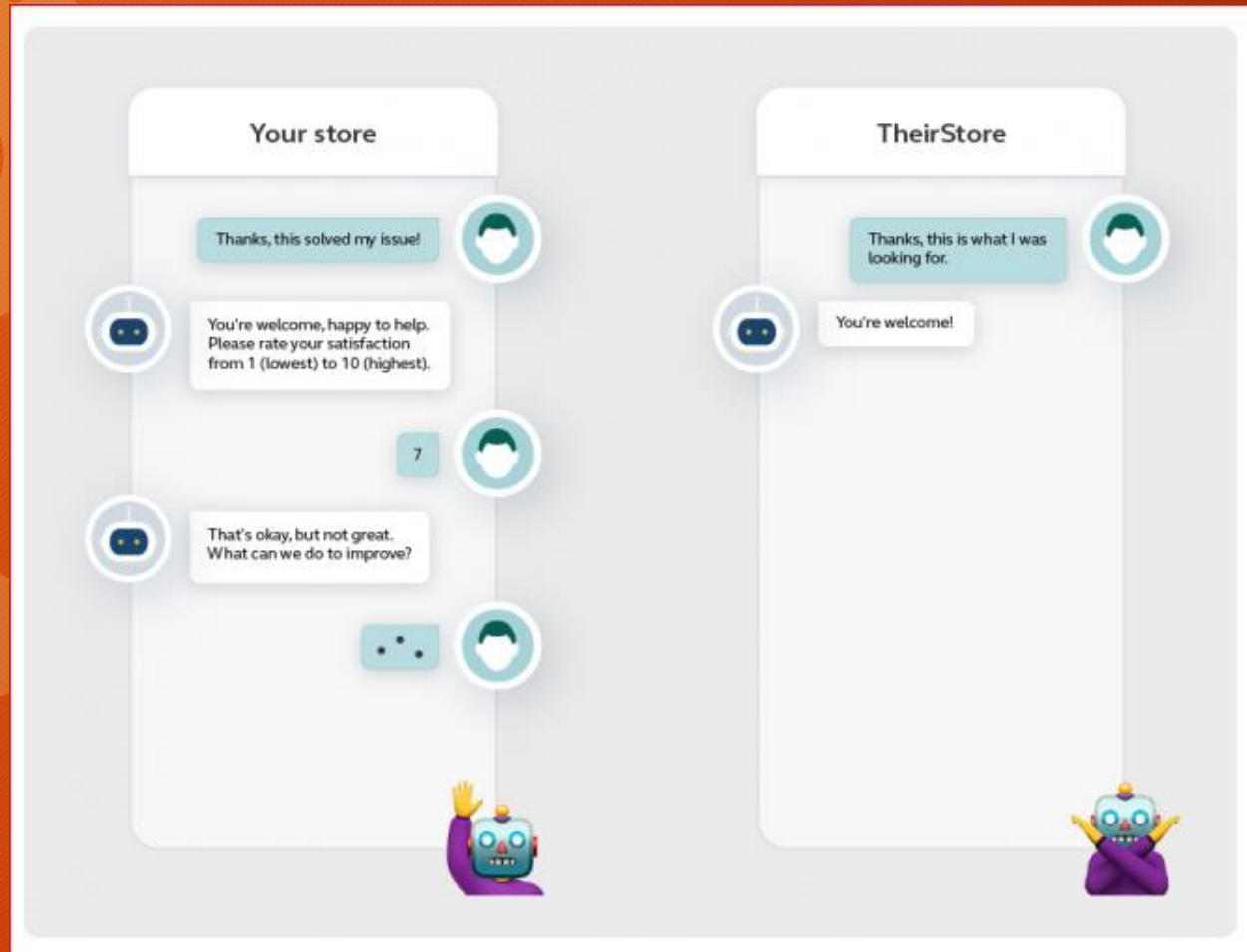




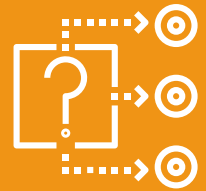


# CSAT Metrics

## CSAT Metrics - How is the Net Promoter Score?



# Next Options Available for Developers

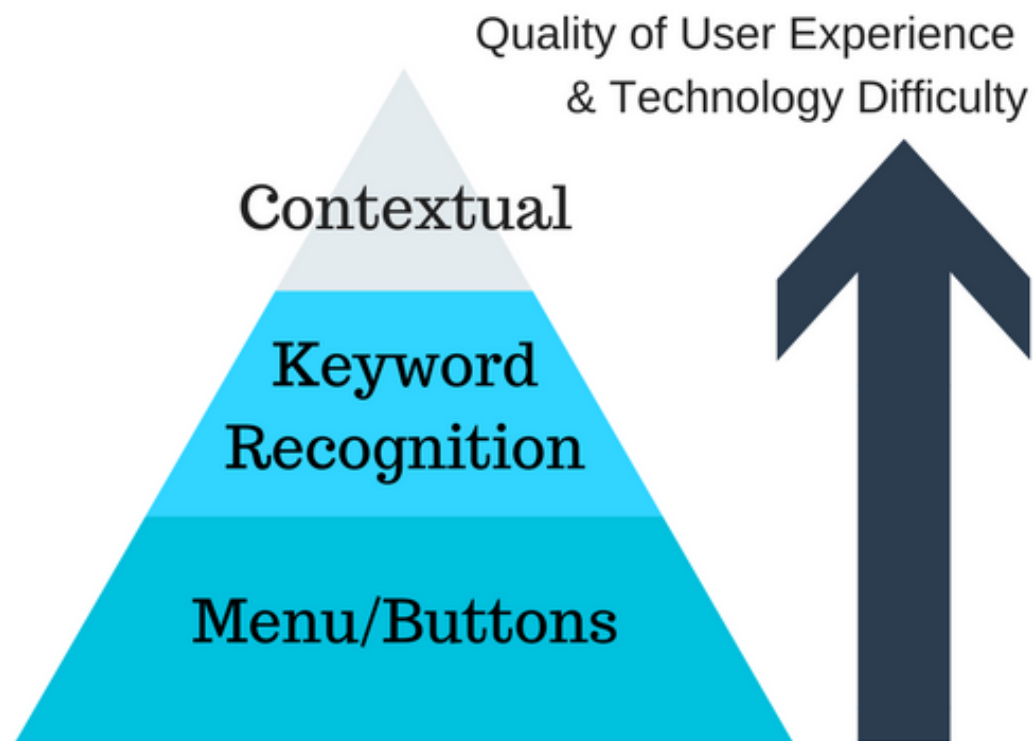


What options do we have for developers to build chatbots meeting business expectations



# Types of Chatbots

Which one best meets business expectations



As expected, a chatbot's ceiling for providing a quality user experience rises as its technical complexity increases.





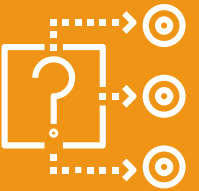
# Which one is best?

How do you choose the chatbot to use



# Next Contextual Chatbot

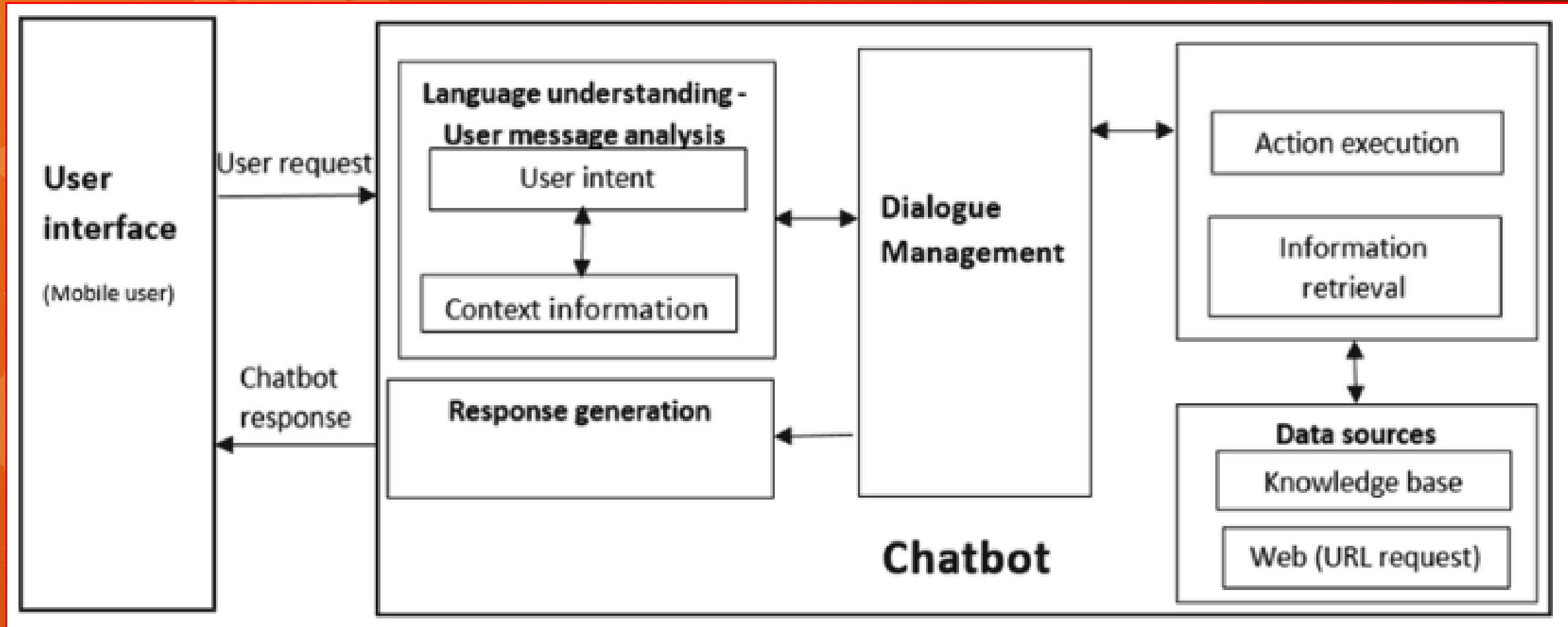
Use of Machine Learning and Artificial Intelligence to build bots that have the ability to remember





# Components

## High level architecture of a contextual chatbot







# What is context?

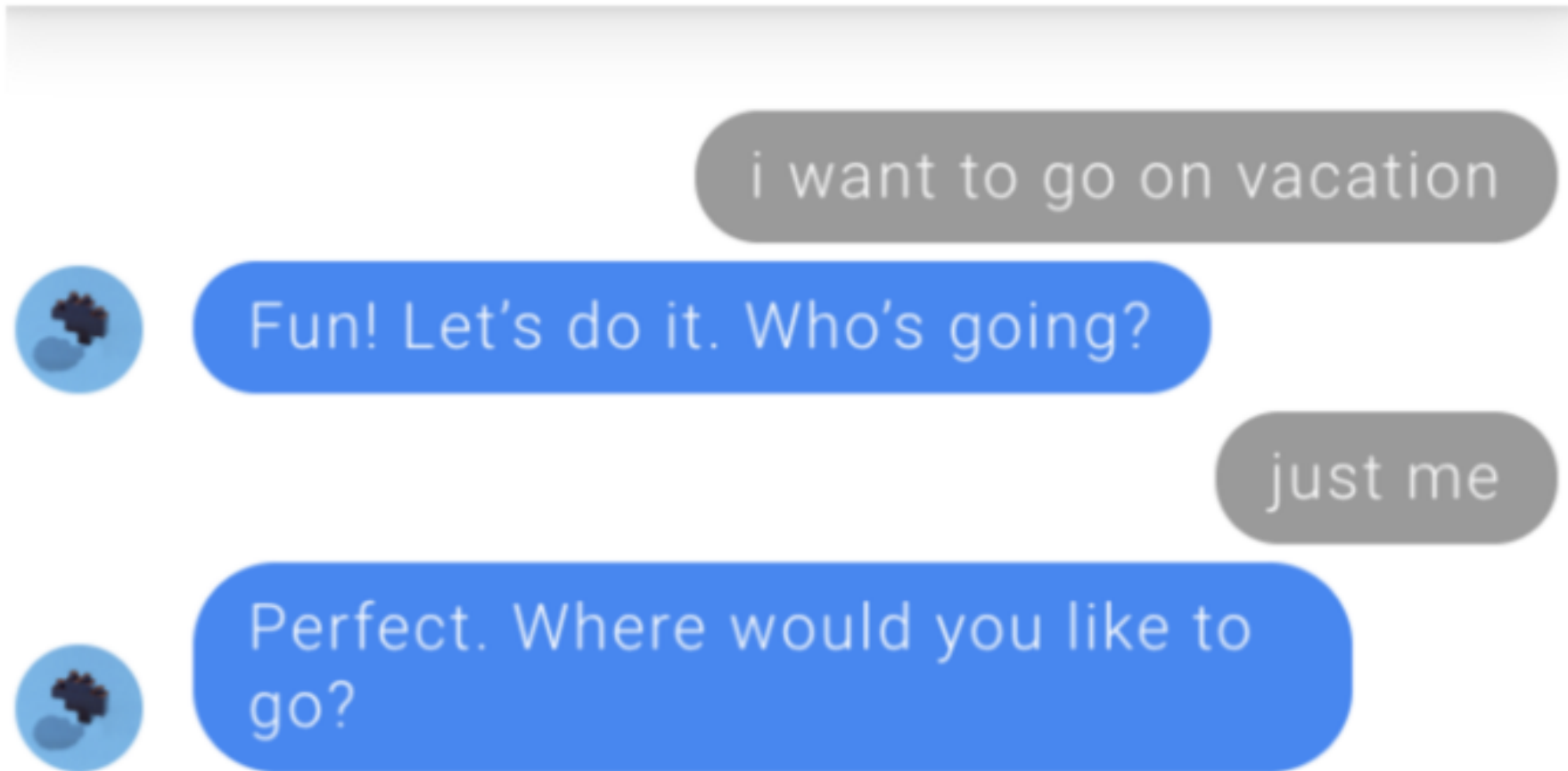
The in-memory of a chatbot?



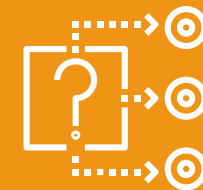


# Examples?

Chatbot's ability to maintain a conversation



# Next General Process of Building a Contextual Chatbot?



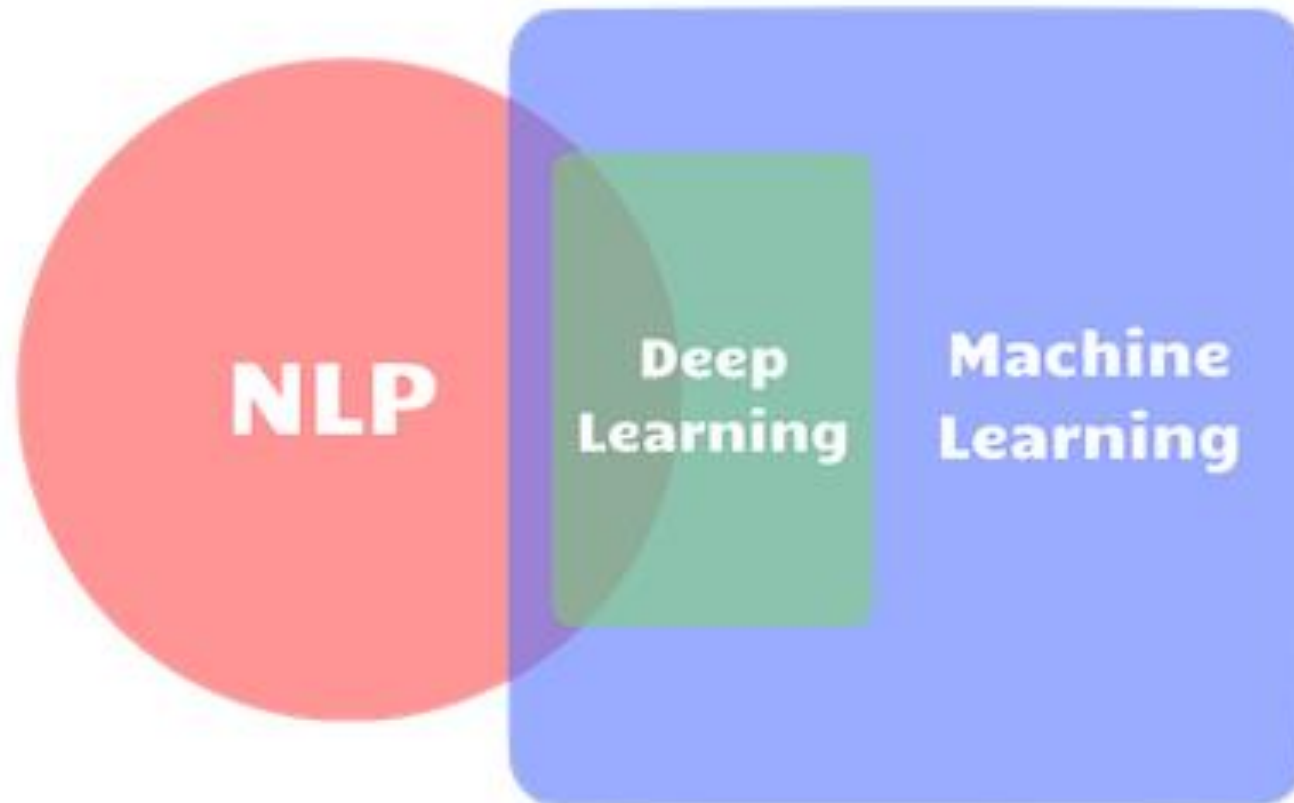
What are the general guidelines when building contextual chatbots





# Available Techniques

Common Approaches in Building Contextual Chatbots





# General Process

## 1. Define your goal

Build a chatbot which  
would satisfactorily  
converse with customers  
of ....



# General Process

## 2. Create an Ontology

Consolidate conversations  
between customers and  
support staff in order to  
teach the machine





# General Process

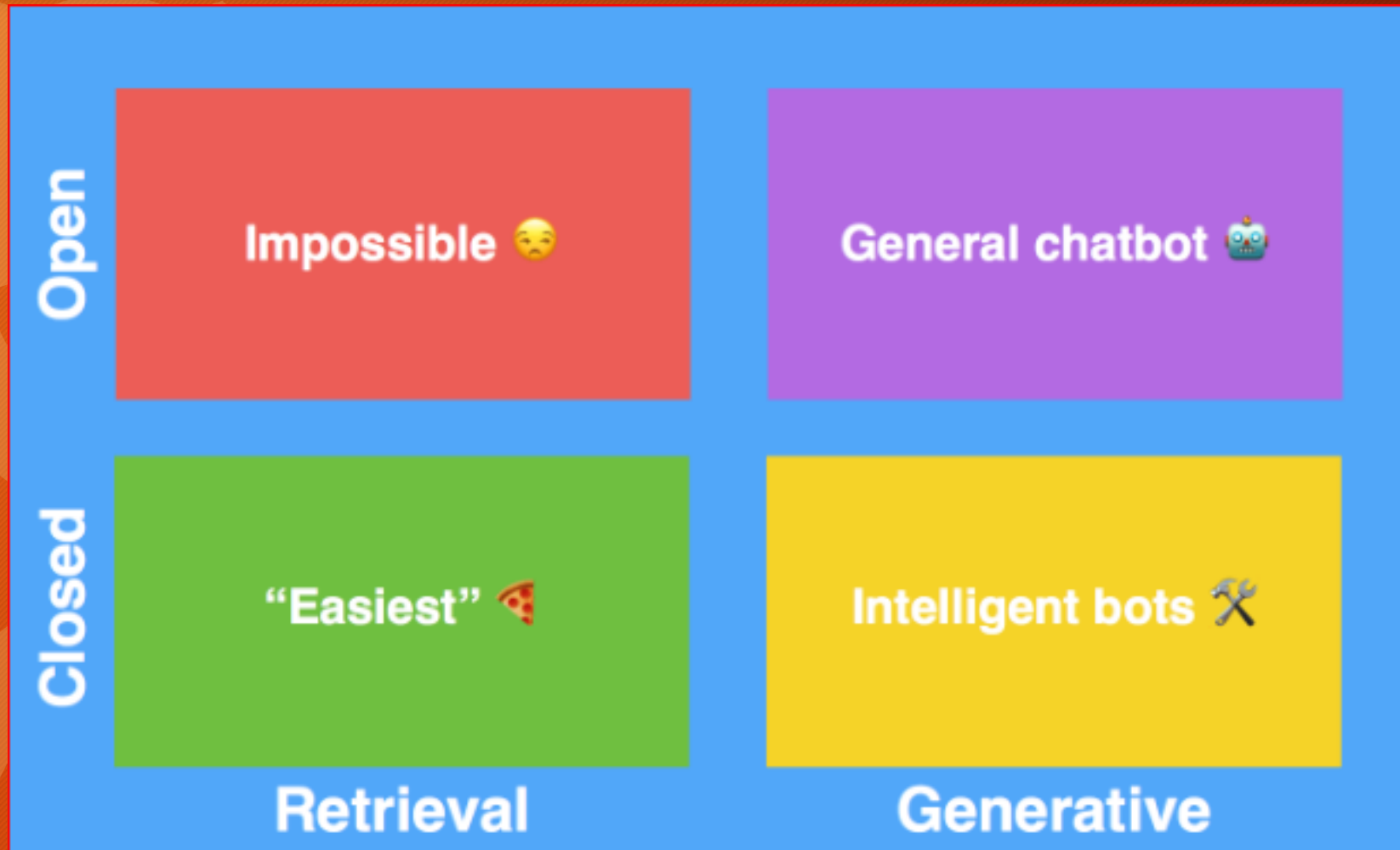
## 3. Pre-Process using NLTK library

Incorporate grammar into machine understanding  
e.g. tokenization,  
stemming, lemmatization.



# General Process

## 4. Define and Agree on the chatbot you want





# General Process

## 5. Create a corpora

Corpora consisting on inputs of context ( conversations with prior sentences ).





# General Process

## 6-a. Convert the words into vectors - CBOW

|       |          |          |
|-------|----------|----------|
| like  | watching | movie    |
| I     | watching | movie    |
| I     | like     | movie    |
| I     | like     | watching |
| enjoy | watching | movie    |
| I     | watching | movie    |
| I     | enjoy    | movie    |
| I     | enjoy    | watching |

|          |
|----------|
| I        |
| Like     |
| watching |
| movie    |
| I        |
| enjoy    |
| watching |
| movie    |

Vectorized input

| I | like | watching | movie | enjoy |
|---|------|----------|-------|-------|
| 0 | 1    | 1        | 1     | 0     |
| 1 | 0    | 1        | 1     | 0     |
| 1 | 1    | 0        | 1     | 0     |
| 1 | 1    | 1        | 0     | 0     |
| 0 | 0    | 1        | 1     | 1     |
| 1 | 0    | 1        | 1     | 0     |
| 1 | 0    | 0        | 1     | 1     |
| 1 | 0    | 1        | 0     | 1     |

Output Vector

| I | like | watching | movie | enjoy |
|---|------|----------|-------|-------|
| 1 | 0    | 0        | 0     | 0     |
| 0 | 1    | 0        | 0     | 0     |
| 0 | 0    | 1        | 0     | 0     |
| 0 | 0    | 0        | 1     | 0     |
| 1 | 0    | 0        | 0     | 0     |
| 0 | 0    | 0        | 0     | 1     |
| 0 | 0    | 1        | 0     | 0     |
| 0 | 0    | 0        | 1     | 0     |



# General Process

## 6-b. Convert the words into vectors - CBOW

|       |          |          |
|-------|----------|----------|
| like  | watching | movie    |
| I     | watching | movie    |
| I     | like     | movie    |
| I     | like     | watching |
| enjoy | watching | movie    |
| I     | watching | movie    |
| I     | enjoy    | movie    |
| I     | enjoy    | watching |

|          |
|----------|
| I        |
| Like     |
| watching |
| movie    |
| I        |
| enjoy    |
| watching |
| movie    |

Vectorized input

| I | like | watching | movie | enjoy |
|---|------|----------|-------|-------|
| 0 | 1    | 1        | 1     | 0     |
| 1 | 0    | 1        | 1     | 0     |
| 1 | 1    | 0        | 1     | 0     |
| 1 | 1    | 1        | 0     | 0     |
| 0 | 0    | 1        | 1     | 1     |
| 1 | 0    | 1        | 1     | 0     |
| 1 | 0    | 0        | 1     | 1     |
| 1 | 0    | 1        | 0     | 1     |

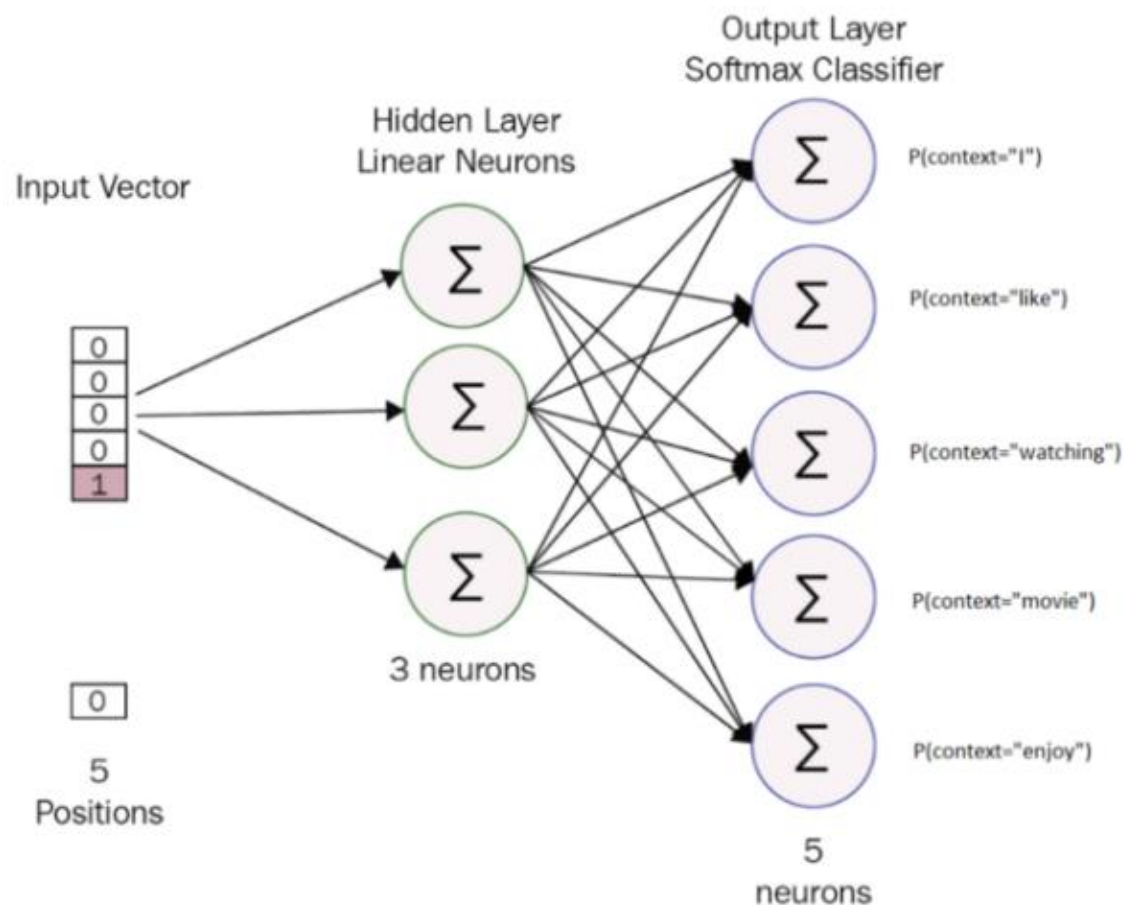
Output Vector

| I | like | watching | movie | enjoy |
|---|------|----------|-------|-------|
| 1 | 0    | 0        | 0     | 0     |
| 0 | 1    | 0        | 0     | 0     |
| 0 | 0    | 1        | 0     | 0     |
| 0 | 0    | 0        | 1     | 0     |
| 1 | 0    | 0        | 0     | 0     |
| 0 | 0    | 0        | 0     | 1     |
| 0 | 0    | 1        | 0     | 0     |
| 0 | 0    | 0        | 1     | 0     |



# General Process

## 6-c. Convert the words into vectors - CBOW

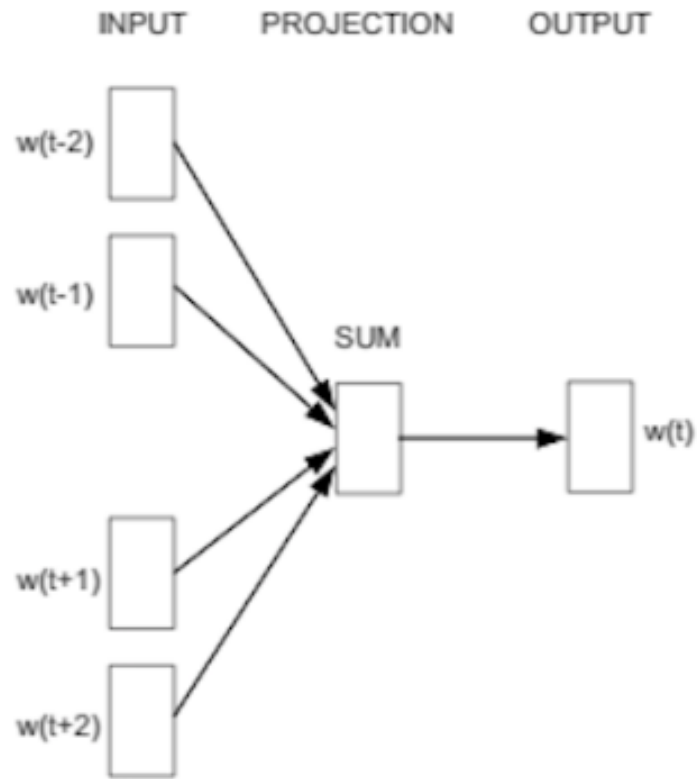




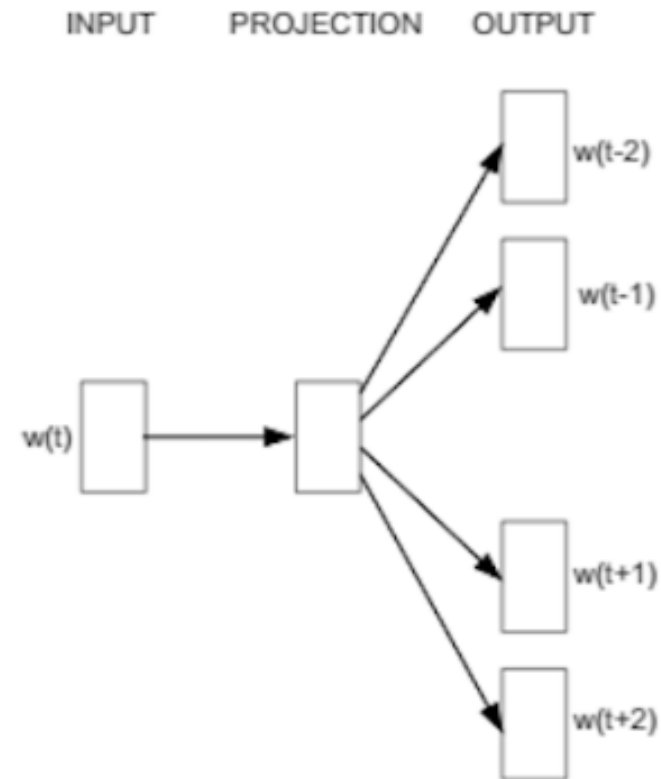


# General Process

## 6-d. Convert the words into vectors - Word2Vec



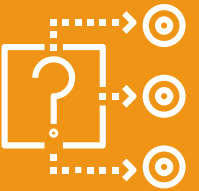
CBOW



Skip-gram

# Next Generative Techniques?

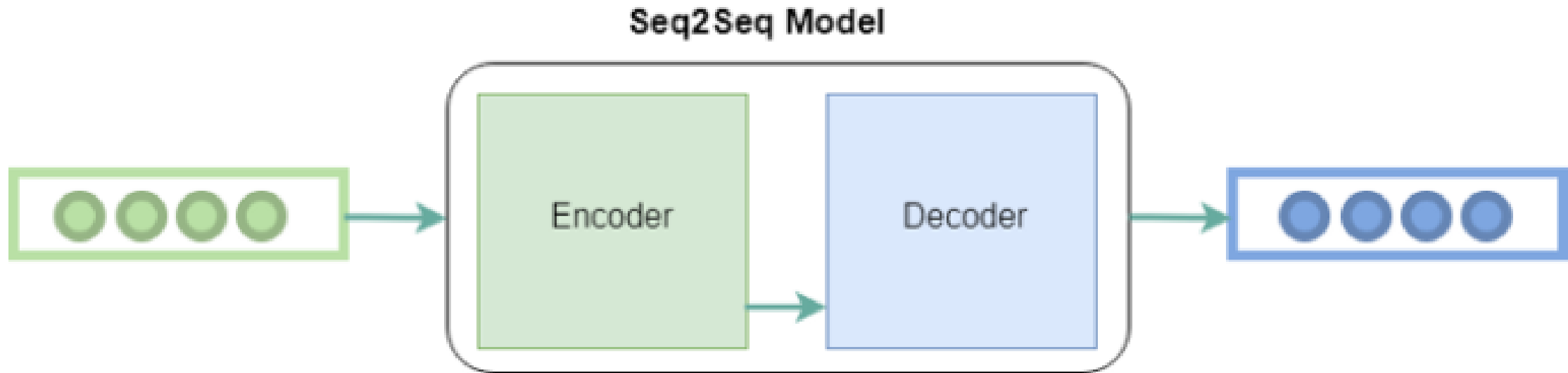
Teaching your Chatbot how to answer questions using deep learning  
generative techniques





# Deep Learning Techniques

## Tensorflow's seq2seq - Generative



Source [Geeks for Geeks](#)





# Deep Learning Techniques

## Generative Approach - Important Notes

| Task Involved          | Description  |
|------------------------|--|
| Context Mappings       | This is the process where you consolidate customer verbatims within a certain conversation and mapping these to support stuff utterances & replies   |
| Vocabulary Definitions | Define a set of vocabulary that best suits the domain in question  |
| Define Tokens          | Tokens defined could be used to identify presence of special entities within the conversations and are needed. Very helpful to incorporate and retain important words present in the corpora but missing in the vocabulary |



# Deep Learning Techniques

Why we cannot use Generative Approach

Spelling  
Mistakes

irrelevant  
responses

Size of data  
needed

Incoherent  
responses

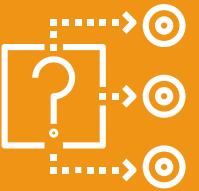
generic  
responses

Inconsistent  
responses

Difficult to  
Optimize

# Next Econometric Techniques?

Teaching your Chatbot how to answer questions using an ensemble of  
Machine Learning Classifiers







# The Reality

What business expects

Quick Turn-  
Around Time

Almost  
immediate  
Business Impact

Low Costs

Reduced  
Costs

High NPS  
Score

Constant  
Delivery



# The Reality

## Skills and Technical Capabilities

Few Machine  
Learning  
Engineers

Little or No  
Experience

Patience is  
Needed

Machine Learning is  
an  
Art and a Science

Failing is  
REAL



# Econometric Techniques

Fastest way to deliver the desire results

Use of a pre-defined list of responses and some heuristic to pick an appropriate response based on input and context.

Most flexible heuristic is an ensemble of machine learning classifiers.





# Econometric Techniques

## The Steps Involved

| Step | Description                                       |
|------|---|
| 1.   | Label the dataset                                 |
| 2.   | Pre-Process the data                              |
| 3.   | Word Vectorization                                |
| 4.   | Modelling and choosing the best approach          |
| 5.   | Create a pipeline                                 |
| 6.   | Running Tests                                     |
| 7.   | Metrics Interpretations                           |
| 8.   | Implementing the response generation workflow *** |

# Next Jupyter Notebook?

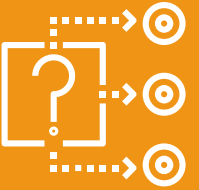


Illustration of Concepts using flight booking dataset from Kaggle

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