



Machine Learning Algorithms for Chatbots

By

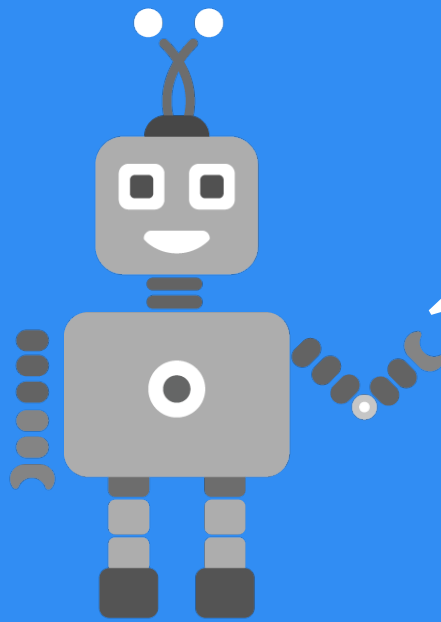
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What are chat bots?

- Interface that enables users to interact with a machine through a conversational UI.
- Machine's need to understand the user's message and the context of the conversation to get things done.
- The interface of how people interact with the machine is as important as the algorithm.
Design + Machine Learning.

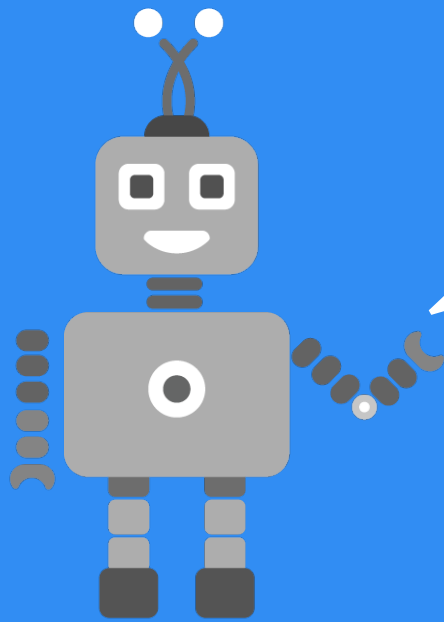


Why build chat bots?

- Ease of doing everything on one screen
- Chat is the most commonly used interface on a smart phone
- Technology that feels like a friend

Application of Chat bots

- Personal Assistant
- Health and nutrition
- Dating and love
- Education
- Customer care



How to build chat bots

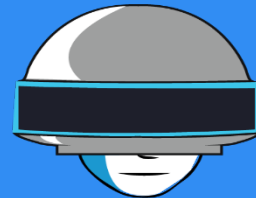
Too many decisions ?



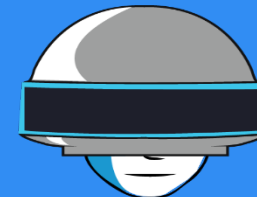
Wit.ai, Api.ai, SciPy
Scikit learn ?



TensorFlow, Theano,
Keras, RNNLM, CNTK ?



Facebook, slack,
Telegram, custom
App?



IBM Watson, AWS ML,
Microsoft Azure?

Getting Basics Right while building Chatbot

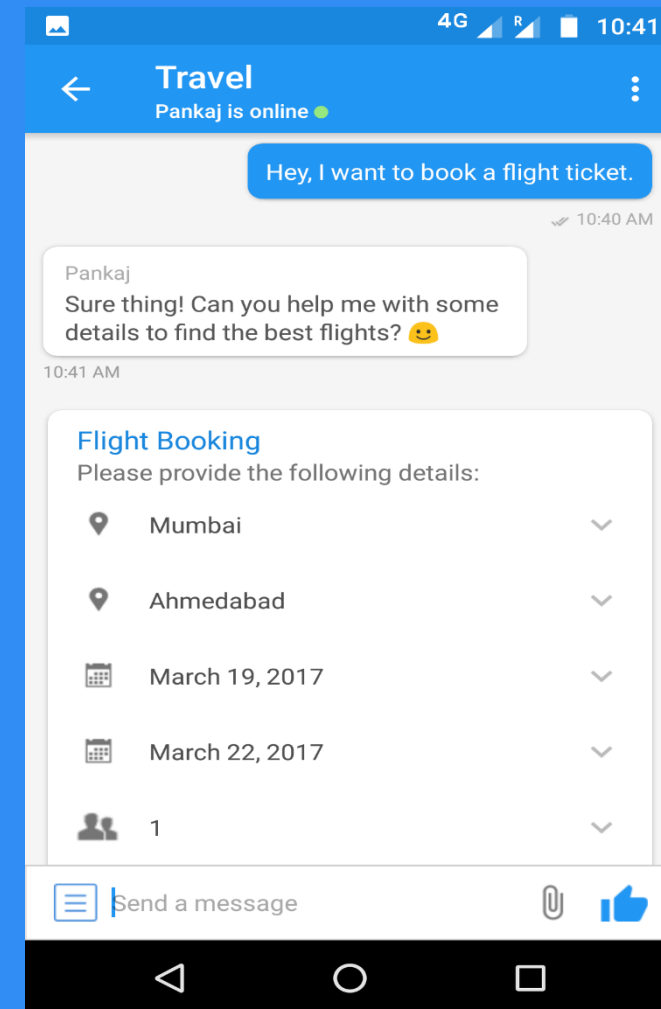
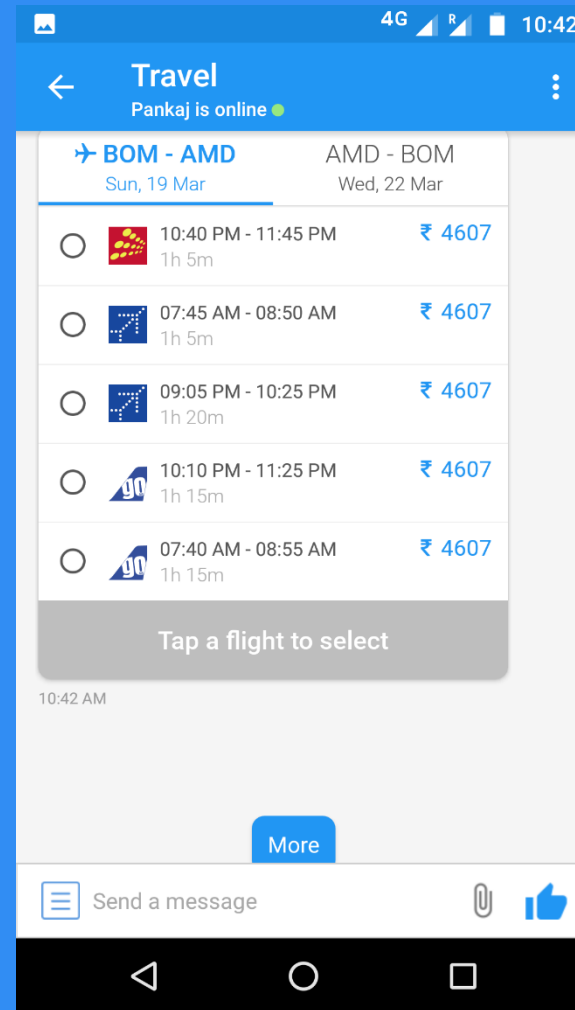


Collecting Training Data

- Volume and Accuracy of Training Data
- Domain of Data – Open Domain vs. Closed Domain
- Example Text :
 - 1) User - “Go ahead with the booking” – Movies, Flights, Trains?
 - 2) User – “Only Non stop flights”, Bot – “XYZ flight”, User – “Go ahead with the booking” - Flights

Preprocessing

- Abstraction
- Latency
- Consistency



Feature Engineering

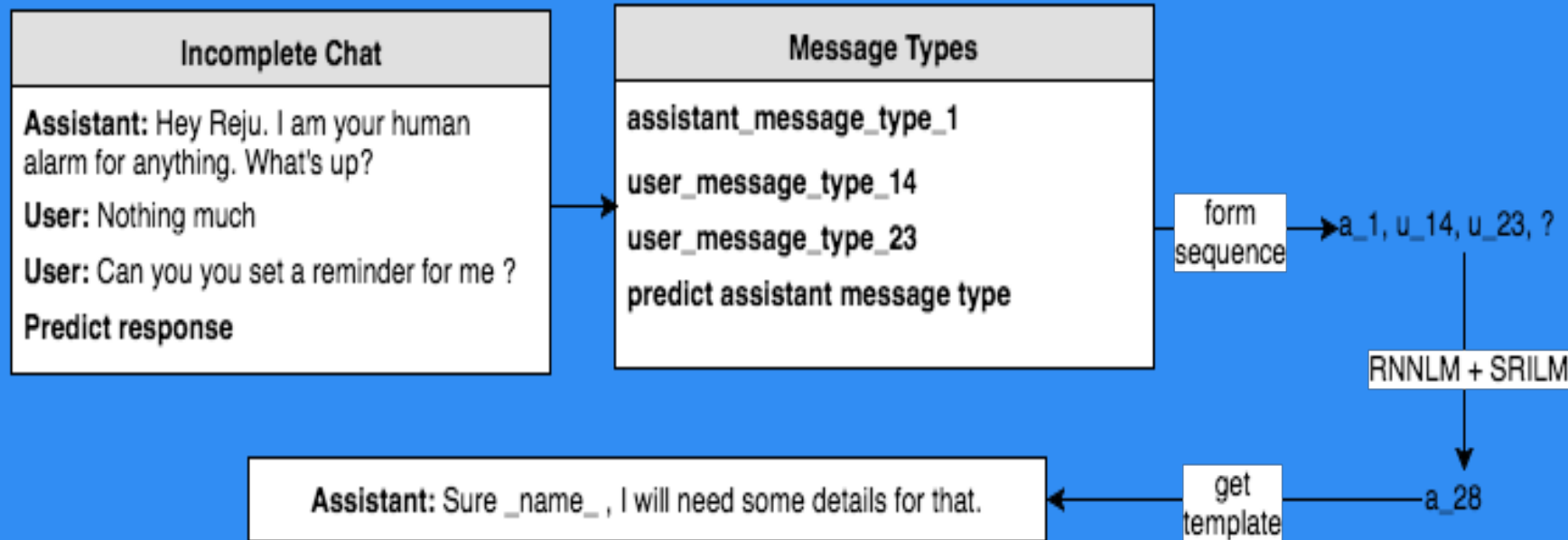
Heuristics, Tf-idf, N-grams
Word Embedding
Word2Vec, Doc2vec,
Document-term Matrix ?



Training Algorithms

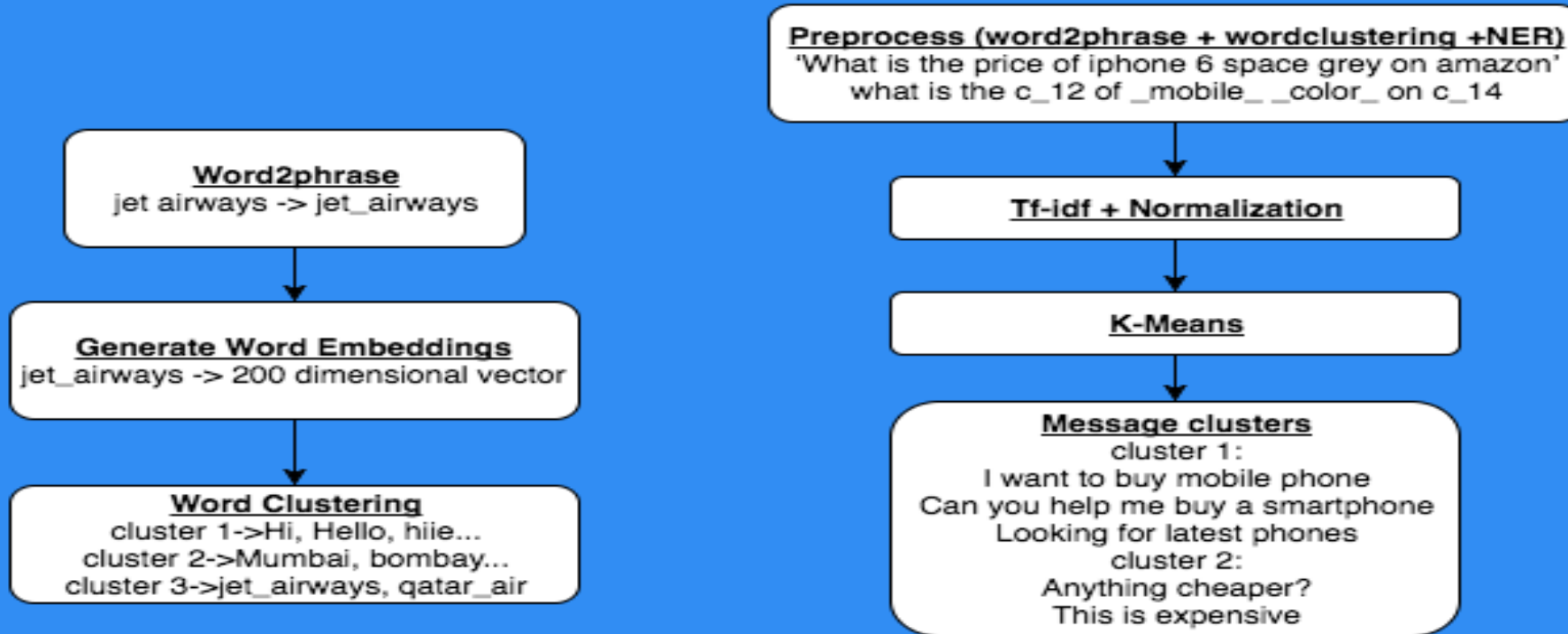
Algorithm	Graph/ Finite State Machine	Retrieval Approach	Generative Approach
Fundamentals	<ul style="list-style-type: none">• Graph Traversal (BFS/DFS)• Selects from predefined responses	<ul style="list-style-type: none">• Classification (Random Forest, SVM, RNN, Ensemble)• Selects from predefined responses	<ul style="list-style-type: none">• Machine Translation (Sequence to Sequence)• Generates its own Natural Language Response
Pros	<ul style="list-style-type: none">• Precision is very high• Grammar and personality• Works well for narrow domain seen data	<ul style="list-style-type: none">• Precision can be controlled• Grammar and personality• Works well for Narrow domain• Can take complex features	<ul style="list-style-type: none">• High Recall• 'SMARTER' – captures context• Caters to unseen Data
Cons	<ul style="list-style-type: none">• Fails for unseen data• Capturing context is difficult• Cannot take complex features• Not scalable for open domains	<ul style="list-style-type: none">• Capturing context is difficult• Needs lot of iterations during feature extraction• Not Scalable for open domains	<ul style="list-style-type: none">• Difficult to define hard precision boundary• Incorrect grammar• Inaccurate for open domains• Needs huge amount of Data

Sequence Learning Example



Overview of Sequence Learning

Clustering of Messages



Message Clustering

Challenges

- Remembering Context – Overwrite/ Replace ?
- Dynamic Information – Date, Time, Prices, Festivals
- Coherent Personality
- Evaluation Metrics
- Diversity of responses

Thank You