# Chatbots A Few Thoughts

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### References

- O'Reilly #BotDay <a href="http://bit.ly/botday2016">http://bit.ly/botday2016</a>
- Pretty much everything I read and tweet about bots http://bit.ly/doraionbots
- Venture Beat BotBeat
- My Twitter BotLists <a href="https://twitter.com/dorait/lists/ai-bots?lang=en">https://twitter.com/dorait/lists/ai-bots?lang=en</a>
- https://www.reddit.com/search?q=chatbots
- Blog.chatbot.com
- Chatbots What, Why and How?
   http://doraithodla.com/2017/04/17/chatbots-what-why-and-how/

## **Chatbots are...**

# Conversational Agents Driven by Intelligence

## Why Am I Excited? And You Should be Too...

- 1. A chance to make our Apps easier (to use)
- 2. Learn a lot from interactions
- 3. Get on to mobile without writing an app







## A Brief History of Chatbots

### **A Brief History of Chatbots**

#### 1950 • The Turing Test

Alan Turing theorized that a truly intelligent machine would be indistinguishable from a human during a text-only conversation. Turing's ideas helped lay the groundwork for the chatbot revolution.



#### 1966 • ELIZA

The world's first chatbot, ELIZA could mimic the responses of a psychotherapist and — for short spurts — carry on convincingly human conversations.

#### 1972 • PARRY

In the 1970s, ELIZA met its first (non-human) patient: PARRY, a chatbot that could imitate a person with paranoid schizophrenia.

### 1988 • Jabberwacky

Developed in the 1980s and released online in 1997, the Jabberwacky chatbot was designed to "simulate natural human chat in an interesting, entertaining and humorous manner."

### 1995 • ALICE

The "Artificial Linguistic Internet Computer Entity" chatbot served as the inspiration for the 2013 film *Her*, in which a human falls in love with a computer program.

### 2001 · SmarterChild

The first chatbot to achieve widespread adoption, SmarterChild joined the buddy lists of millions of AIM and MSN Messenger users in the early 2000s.

The SmarterChild approach -- building a chatbot for popular messaging platforms -- is the blueprint that most modern chatbot builders are now following.

## Why Chatbots?

## Really, Why?

One of my favorite answers from Kik. Why? Three simple reasons:

- 1. Messaging has surpassed social media in usage.
- Consumers don't download new apps.
- 3. And if chat is the new browser, bots are the new websites.

The beauty of bots is that you don't have to download new apps. Bots live in your chat app, for which you already have an account. Also, you don't have to learn a new UI, since you already know how to use your chat app.

## **Types of Bots**

## Different ways of Looking at Bots

#### By Intelligence Implementation

Rule Based, NLP Based

#### By Use

Entertainment, Productivity, Business, Education

#### By Type of Users

Personal Bot vs Team Bots

## Uses of Chatbots

### Productivity tools







StatusPage.io

Ace

#### Travel









Hyatt

Expedia

Skyscanner

### HR/Employee Engagement

















Hired



Breezy HR

#### **Conversational Commerce**











Conversable



Converse

Converse.ai





Goodbox

#### Conversational Customer Service













CallerZen



Teckst

Twyla

Chatlio















Groove

Help Scout



Reamaze













SupportKit

Userlike

WPSlackSync

Zendesk

## **Chatbot Platforms**

#### General AI agents with platforms

Developer access available now or announced



# A Chat Bot Conversation Snippet

Hello. Welcome to Emerging Technology Gadgets Group. My name is Sandy. How mayl help you?

Utterances and intents

Hi Sandy, I want to return my Phone XY?

Sure. That is no problem. May I know why?

It does not work. I bought in yesterday.

Sorry to hear that. I see that your product comes with full money back guarantee. Here is a link to return instructions.

http://etpg.in/products/returns

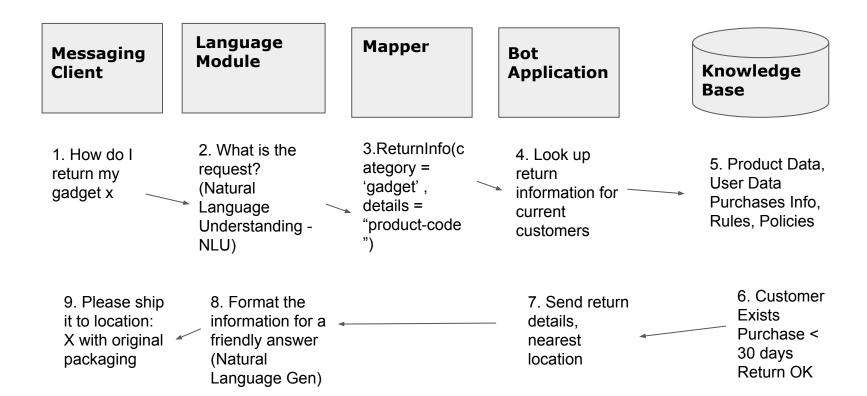
Can I exchange it for another model?

Action/Response

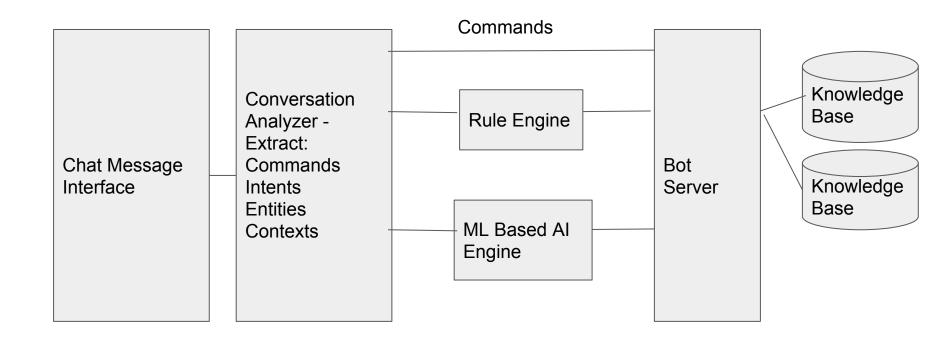
Entity

Context

## A Simple Request/Response Flow



## Flow of messages and Control



## Steps to Building a Chatbot

- 1. Decide on an application area
- 2. Design conversations (aka interactions)
- 3. List intents, entities, actions, responses, contexts
- 4. Select an Al Engine
- 5. Train the Al Engine
- 6. Write Code for Actions
- 7. Create and update Knowledge Base
- 8. Test scenarios and incrementally improve
- 9. Log everything
- 10. Analyze logs and improve learning/knowledge

# If You Want to Build Your Own AI Engine

VIDEO 2 OF 7 FROM BOT DAY 2016 - SAN FRANCISCO, CA

Introduction to artificial intelligence for bots - Peter Skomoroch (Skipflag)

## AI: Build your own?

#### Pros

- Get a better result on your problem by building a custom solution
- Scales better than calling out to 3rd party services
- Solve complex domain specific problems that API services can't handle
- With open source libraries, you don't need to reinvent the wheel

#### Cons

- Need to acquire more costly training data
- Risk of building brittle models that overfit narrow use cases
- Risk of building a lot of non-differentiated tech
- Need skilled machine learning engineers to build and maintain systems

O'RELLY"

## A Few Things to Think About

#### Simple Rule Based Chatbots

- AIML
- ChatScript

#### Al Based

- Build your own (or reuse) NLP, NLU, NLG
- Conversational Design
- Conversation Analysis ML (classification, clustering, prediction)
- Entity Extraction (Limited help from NLTK, Topic Extraction/Modeling)
- Knowledge Representation Frames and Slots, RDF/SPRQL, Lucene/Solr

## Skills of Al powered bots

What problems are well suited to Al powered bots?

- Search problems with scale: needle in a large, moving haystack
- Connect dots across large amounts of information quickly
- Learning from user feedback
- Pattern recognition & discovery

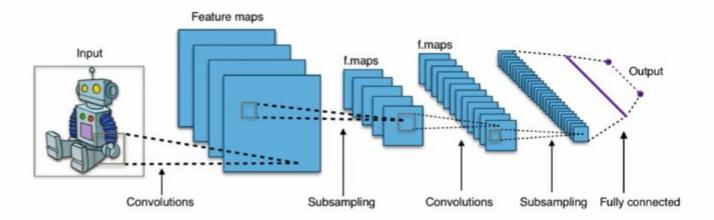


4) 28-08 / 40-17

## **A Few More Things**

- Questions Analysis (decomposition, classification)
- Syntax, Semantics and World Knowledge (pragmatics)
- Intent Design
- UI Paradigms Text, Cards, Buttons
- Handling Slang
- Preserving and Using Context
- Response Selection (select multiple possible responses and score them)
- Content Acquisition, Content Modeling (KR)
- Dialog Analysis
- Log Analysis (Learning from previous conversations)
- Profile Extraction (for context across sessions)

## Neural networks are powering bots



#BotDay

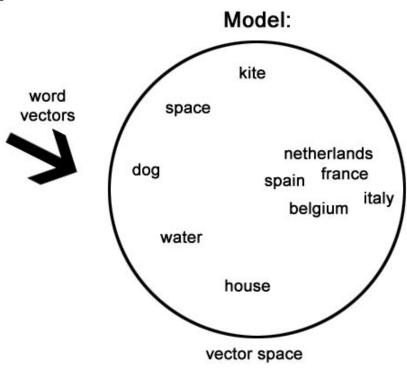
16:58 / 49:17



### word2vec

#### Input: one document

Lorem ipsum dolor sit armet, consetetur sadipscing elitr, sed diam nonumy eirmod tempor invidunt ut labore et dolore magna aliquyam erat, sed diam voluptua. At vero eos et



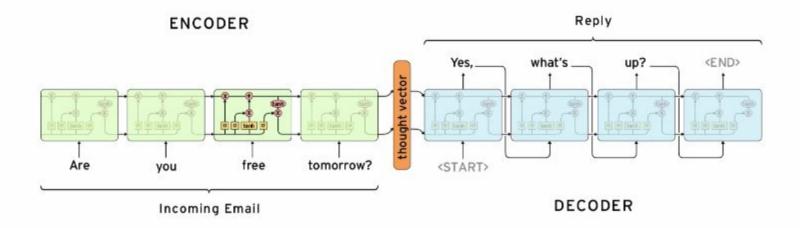
#### most\_similar('france'):

spain 0.678515 belgium 0.665923 netherlands 0.652428 italy 0.633130

> highest cosine distance values in vector space of the nearest words

## Seq2Seq, Thought Vectors

Smart Reply: Automated Response Suggestion for Email. (Kannan et al 2016)



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## **Build: Open source options**

Github popularity of deep learning frameworks (François Chollet – Keras @ Google)

aggregate popularity growth from 2016-09-15 to 2016-10-16			
#1:	12.42		tensorflow/tensorflow
#2:	4.01		fchollet/keras
#3:	3.35		BVLC/caffe
#4:	2.35		dmlc/mxnet
#5:	1.46		baidu/paddle
#6:	1.31		Microsoft/CNTK
#7:	1.04		tflearn/tflearn
#8:	0.94		deeplearning4j/deeplearning4j
#9:	0.92		Theano/Theano
#10:	0.77		NVIDIA/DIGITS
#11:	0.68		torch/torch7
#12:	0.48	1	pfnet/chainer
#13:	0.38	I	NervanaSystems/neon
#14:	0.27		Lasagne/Lasagne
#15:	0.25	T	karpathy/convnetjs
#16:	0.19		amznlabs/amazon-dsstne

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## Tips for builders

- Think about the cold-start problem, how do you train your bot before you have user data?
- Tokenization and preprocessing can have a big impact
- Be careful with pre-trained models & 3<sup>rd</sup> party data, understand their quirks

#### Places to go next:

- Deep Learning for Chatbots WildML
- https://github.com/ChristosChristofidis/awesome-deep-learning
- Question answering on the Facebook bAbi dataset smerity.com
- Do-it-yourself NLP for bot developers Alan Nichol

## Human in the loop Al

- Many bots actually have humans somewhere in the response loop
- Examples: Facebook M, x.ai, Sensay, Operator, Tay...
- Other Al powered apps use humans to clean, label, or categorize data
- Examples: Google, Facebook, Netflix, StitchFix
- Some human API services: Mechanical Turk, CrowdFlower

### Bits of Trivia/Quotes

- Can you build a good chatbot with AIML/ChatScript? Check out Loebner prizes for the past 10 years
- Messaging is interesting not just as a way of consumption but also as a way of production
- Conversational Language Understanding vs one shot NLU
- Building platforms vs applications
- Conversational Al
- What conversational technology are you bringing to help users?
- What is the expert AI you are going to build for your company? (it has long term value)
- Bots can be part apps, part conversation
- Voice is for private spaces, text is for public spaces
- Voice bots are one shot, command oriented
- Bot sharing (send bot content to others)

## They Can Also Be

- The New Apps
- A way to expose software services
- Conversation Miners (or Data Collectors)
- Learning Engines
- Agents of Discovery
- Tools for converting conversations to Knowledge

## Questions?

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