TravelX:
NLP model for a
task-oriented
Intelligent assistant

## Contents:

- 1. Motivation
- 2. Theoretical background and Related work
- 3. Proposed solution and results





# Original contribution

- → Combine three AI models in order to create a task-oriented conversational AI
- → Compare two different approaches for our NLP models
- → Provide a user-friendly application that solves a real-world problem by means of our integrated models



# Motivation and goals

- X Custom real-life application based on a relatively new NLP model (BERT)
- X Intuitive and user-friendly interface
- X Create a model and interface easy to extend and integrate with external parties (Amazon Alexa)



2.
Theoretical
background and
Related work

## **BERT**

- Bidirectional Encoder Representation from Transformers
- Built on top of the Transformer Architecture
- State-of-the-art accuracy on 11 NLP tasks
- Brings state-of-the-art to regular users
- Fine-tuning vs feature based

#### **BERT Pretrained model**

### Masked Language Model

 ${\bf Input}{:}$  The man went to the  ${\rm [MASK]}_1$  . He bought a  ${\rm [MASK]}_2$  of milk .  ${\bf Labels:}$   ${\rm [MASK]}_1$  = store;  ${\rm [MASK]}_2$  = gallon

### Next Sentence prediction

Sentence A = The man went to the store.

Sentence B = He bought a gallon of milk.

Label = IsNextSentence

Sentence A = The man went to the store.

Sentence B = Penguins are flightless.

Label = NotNextSentence

## Related work

## Real-world Conversational AI for Hotel Bookings

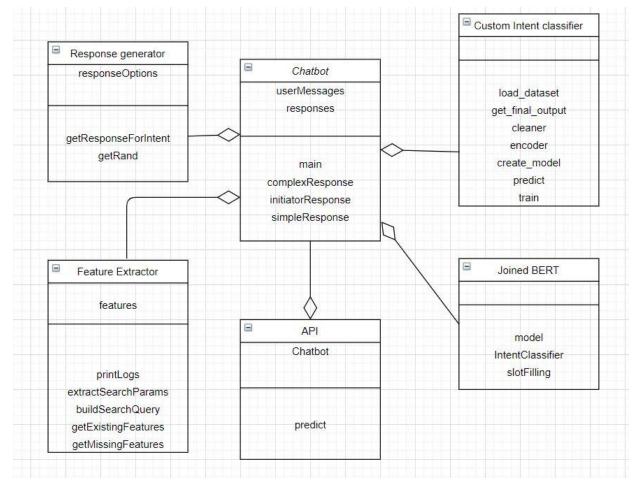
- X Commercially used app in the real world
- X Intent Classifier Bidirectional LSTM
- X Named Entity Recognition SpaCy2
- X Top-1 Recall: 89% Top -3 Recall: 96%

3.
Proposed solution and results

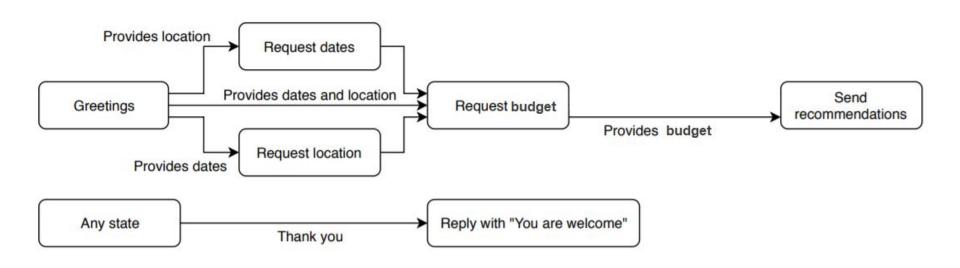
# Proposed approach

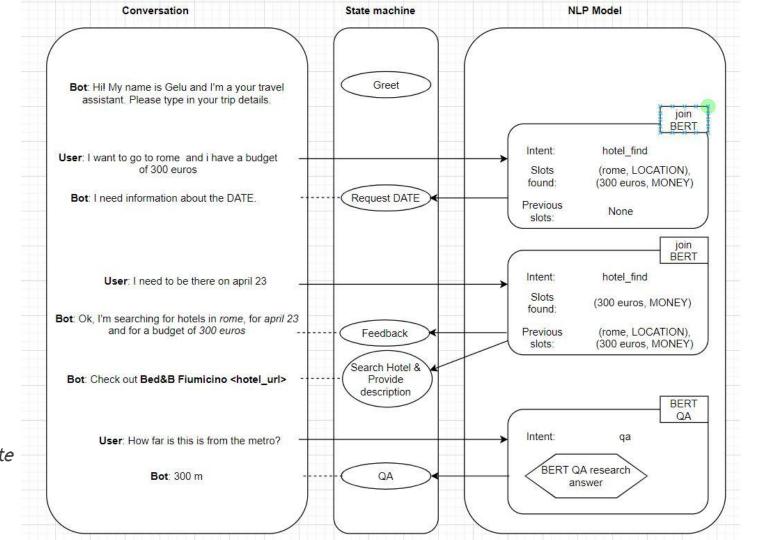
BERT model for intent classification and slot filling model for gesture for question answering in Python

State machine for dialog management the model into a Web and desktop application



Class diagram of the Backend application





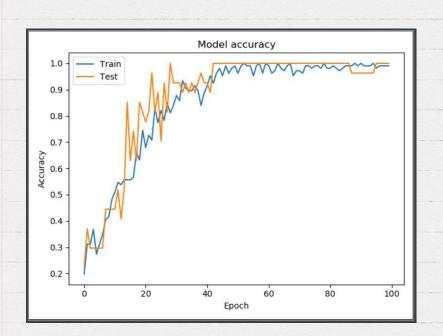
Example of a conversation with our bot, with corresponding state transitions and model logic.

# Implementation

- X Python model: ScyPy, pytorch, tensorflow, Keras, BERT
- X User interface: React, Electron, Axios



# Experimental results





Our bert: 92.59%

Our bi-LSTM: 87.23%

State-of-the-art: 97.87%

# Algorithm improvements

- X Memory footprint reduction: decrease resource utilization
- X Response time improvements:

3.8 seconds avg. -> 1.1 seconds avg.

(request completion-time measured in Chrome dev tools)





# Conclusions and achievements

- ✓ Real-life application for a task-oriented chatbot
- ✓ User-friendly interface
- ✓ Proof of concept for further development
- ✓ Ability to integrate with other existing interfaces



## Difficulties and limitations

- X Hardware resources
- X Complex dialog flows
- X Lack of free datasets for our problem, increased time of data collection and dataset construction



## What's next? Future work

- X Support more complex dialog flows
- X Support more hotel features
- X Extends dataset
- X Detect the need to defer task to human
- X Performance improvement:
  - Model
  - Resource utilization
- X Integrate with speech recognition models / systems (Alexa)

To Do!

# Bibliography

- X [1] Qian Chen, Zhu Zhuo, and Wen Wang. Bert for joint intent classification and slot filling. Technicalreport, Speech Lab, DAMO Academy, Alibaba Group, February 2019.
- X Alice Coucke, Alaa Saade, Adrien Ball, Theodore Bluche, Alexandre Caulier, David Leroy, Clement Doumour, Thibault Gisselbrecht, Francesco Caltagirone, Thibaut Lavril, Mael Primet, and Joseph Dureau. Snips voice platform: an embedded spoken language understanding systemfor privateby-design voice interfaces. Technical report, 2018.
- X Chih-Wen Goo, Guang Gao, Yun-Kai Hsu, Chih-Li Huo, Tsung-Chieh Chen, Keng-Wei Hsu, andYunNung Chen. Slot-gated modeling for joint slot filling and intent prediction. In NAACL-HLT, New Orleans, Louisiana, USA, June 1-6, 2018, Volume 2, pages 735–737, June 2018.
- Daniel Guo, Gokhan T ur, Wen tau Yih, and Geoffrey Zweig. Joint semantic utterance classifica-tion and slot filling with recursive neural networks. In 2014 IEEE Spoken Language TechnologyWorkshop, SLT 2014, South Lake Tahoe, NV, USA, pages 554–563, December 2014.
- Dilek Hakkani-Tur, G okhan T ur, Asli CÂ, elikyilmaz, Yun-Nung Chen, Jianfeng Gao, Li Deng, and YeYi Wang. Multi-domain joint semantic frame parsing using bi-directional rnn-lstm.InInterspeech 2016, San Francisco, CA, USA, pages 715–719, September 2016.



# Thank you!

Next:
Application Demo