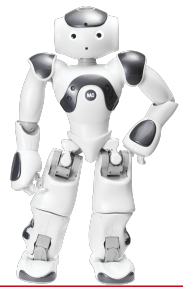


ROBOCUP Project

Cornelius Braun, Seraphin Zunzer, Emilia Schulenburg



Motivation & Goal

Our project goal: Have a robot that can dance to music

For that, the robot needs to...

1. ... be able to “listen” to music
2. ... be able to recognize what the music is like → music genre recognition
3. ... be able to execute dancing movements

Project pipeline

1. **Sensing**
 - record audio
2. **Thinking**
 - analyze audio
3. **Acting**
 - dance to music



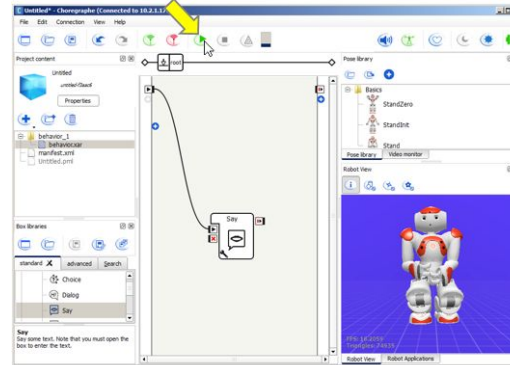
Tools



+ libraries:

- pyaudio
- sklearn / keras
- librosa
- threading

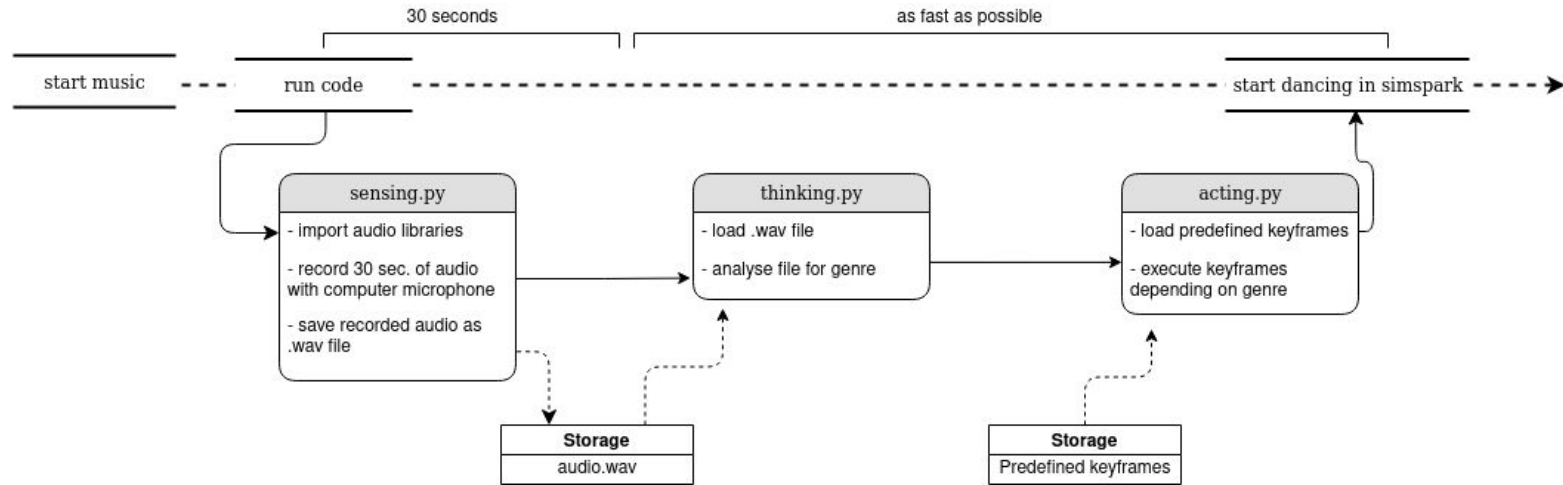
Choregraphe software:



Simspark simulator:



Project Planning



User interaction

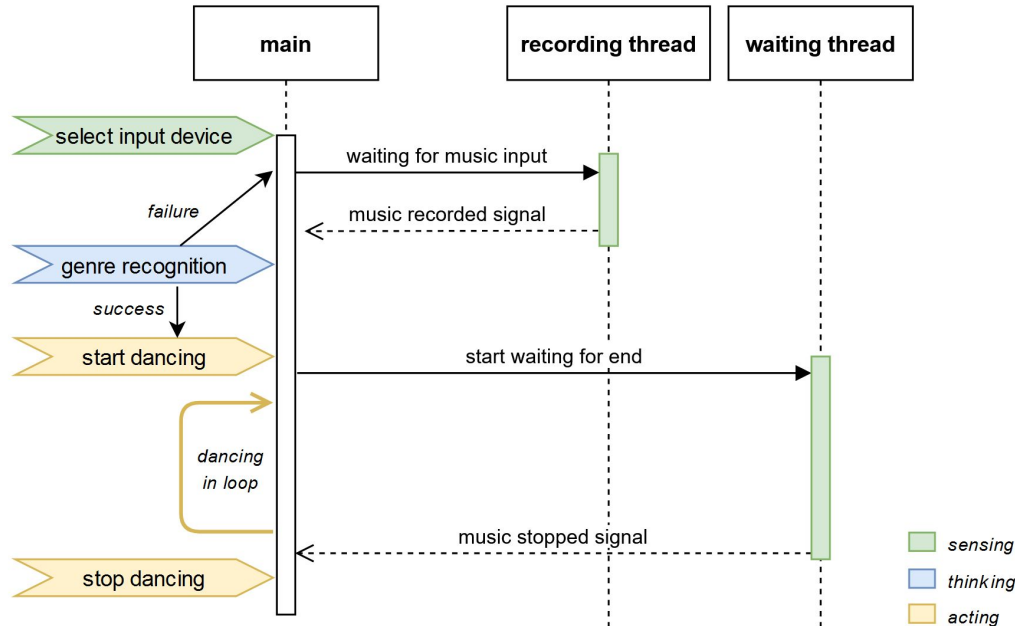
The sensing part implements user interactions:

User interacts with the command line interface:

1. Select a microphone
2. Decide whether you want to:
 - load a music fileor:
 - record a music file
3. Stop the robot and start again

```
-----record device list-----  
Input Device 0 - Microsoft Sound Mapper - Input  
Input Device 1 - Stereomix (Realtek(R) Audio)  
Input Device 2 - Microphone Array (Realtek(R) Au  
-----  
Select a microphone before starting! Enter device number and press return: 1  
Setup done!  
  
----- Select Input -----  
1: Record song live with selected microphone.  
2: Load already recorded song from storage.  
3: Always use option 1.  
4: Always use option 2.  
-----  
Enter a number: █
```

General structure & Sensing



recording thread:

- select:
 1. live recording or
 2. load music from storage
- save music and start classification

waiting thread:

- waits until:
 1. user interrupt or
 2. music stopped
- stop robot

Thinking: Music Genre Classification

Training data:

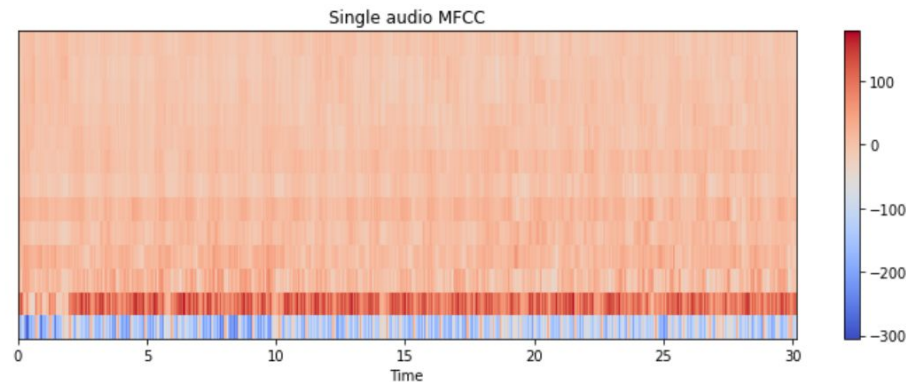
GTZAN dataset

Genres:

Classical, Pop, Metal

Features:

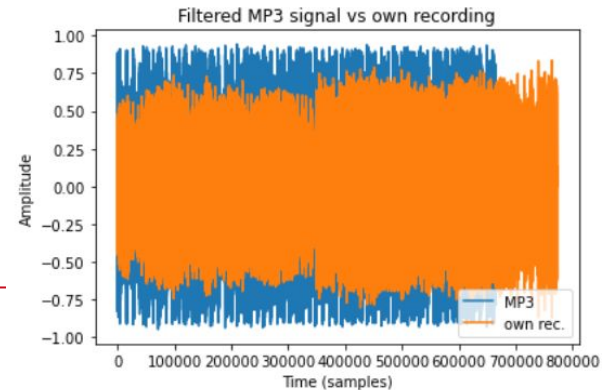
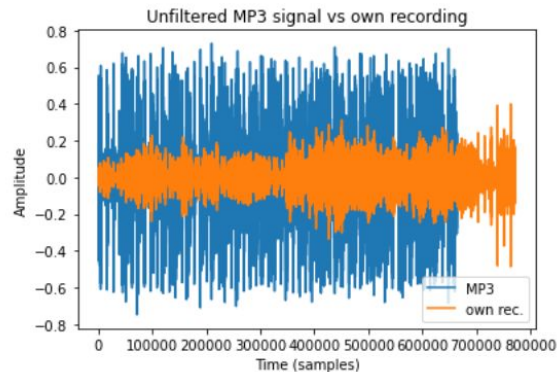
Mel Frequency Cepstral Coefficients (MFCC)



Thinking: Data augmentation

- GTZAN data are snippets of studio recording audio quality
- Computer recordings have worse quality

Solution: use mu-law compressor



Thinking: Classification results

We compared 3 classifiers:

Perceptron, Convolutional Neural Network (CNN), Support Vector Machines (SVM)

Classifier	Perceptron	CNN	SVM
Mean accuracy	0.97	0.33	0.96

SVM works the best in practice → we use SVM

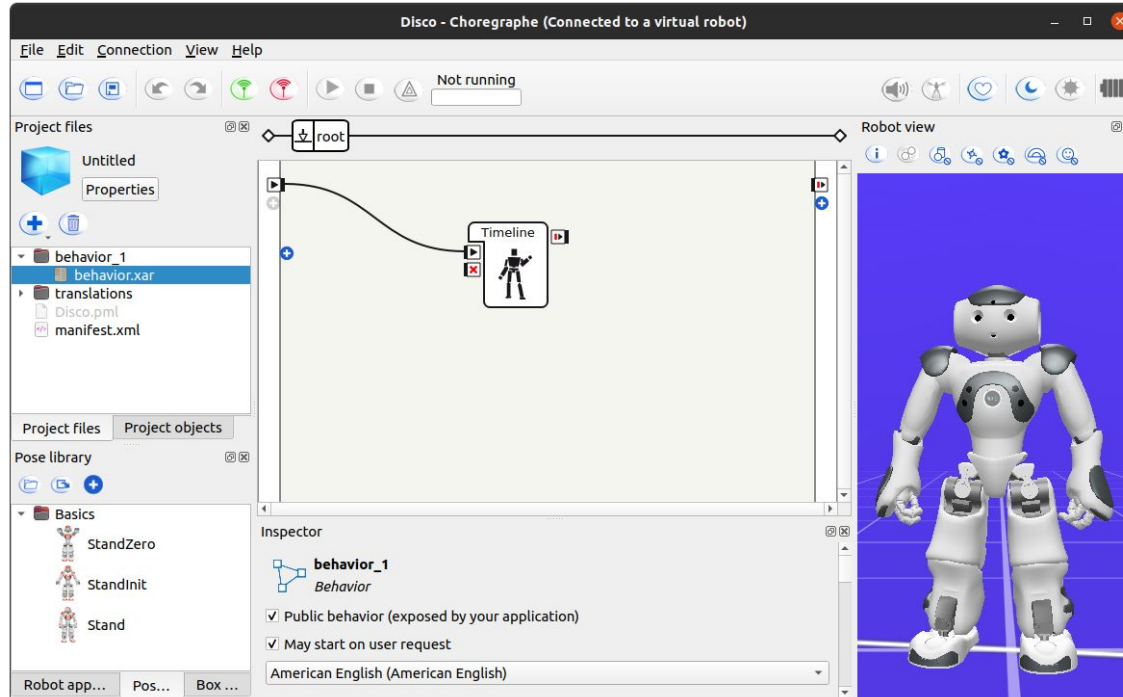
Acting

Genres: pop / disco, metal, classic

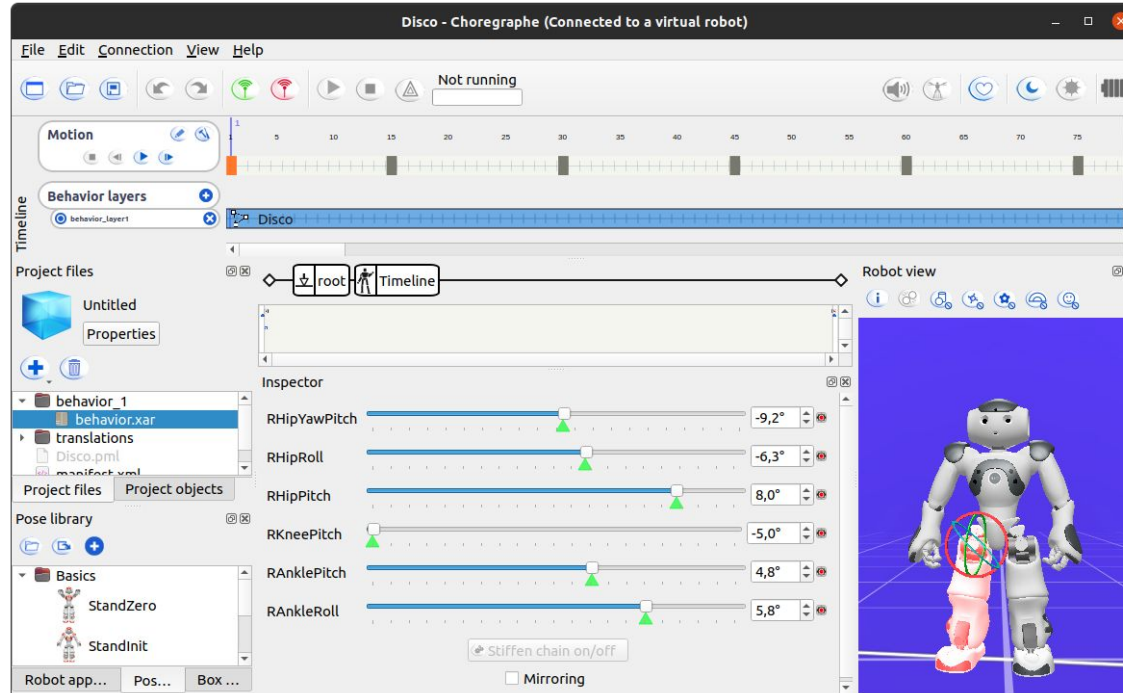
- software to create keyframes → Choregraphe
- exported in Bezier to Python
- imported in our dancing.py
- simulated in Simspark

```
19 from dance_keyframes import classic,  
20                               disco,  
21                               robotDance,  
22                               stand,  
23                               verbeugung,  
24                               denkerpose
```

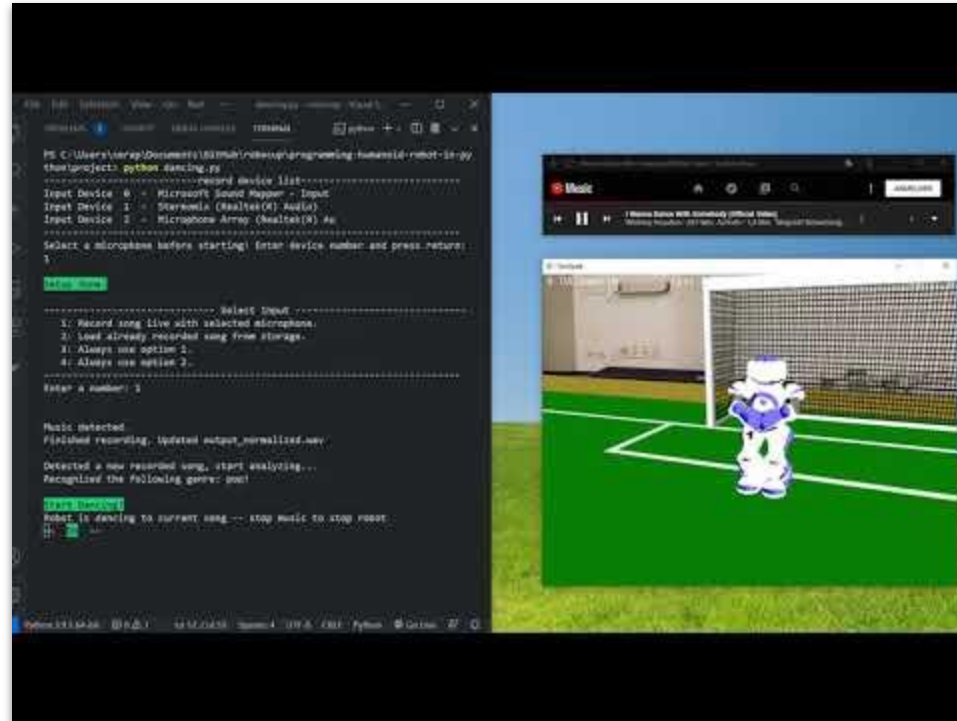
Acting



Acting



Results



<https://tubcloud.tu-berlin.de/s/J9jYsGp4WJbxTEZ>

Project evaluation

Problems we encountered:

- poor audio quality
- recording length needed for classifiers
- maintain robot stability during dancing

Eventually, we were able to manage everything

We reached all of our goals and made the robot dance!



Thank you for your attention!