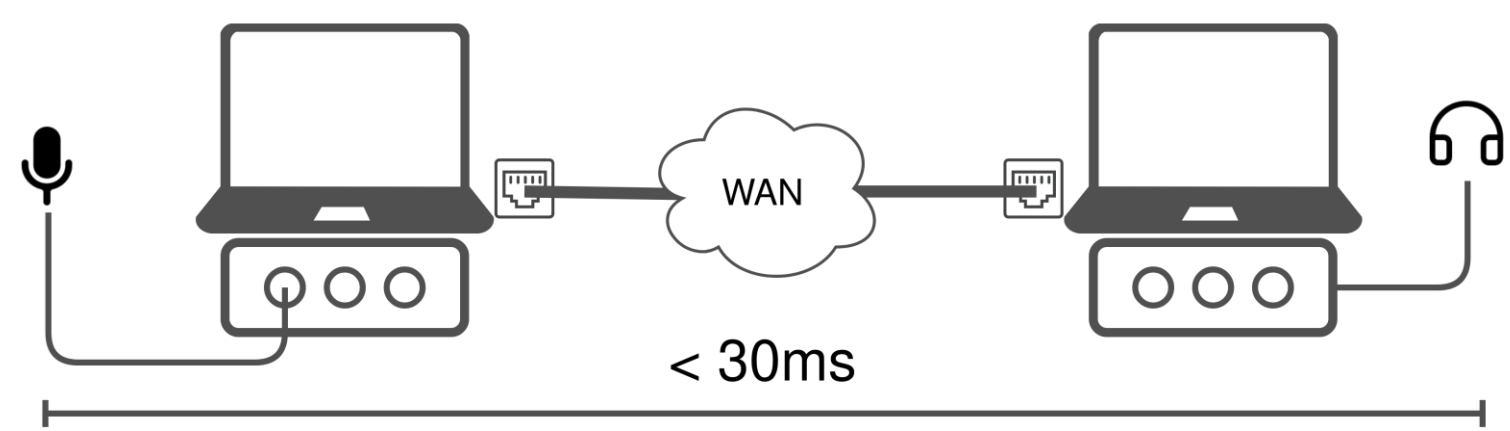


## Research context and motivation

- The SARS-CoV-2 pandemic encouraged the use of videoconferencing platforms also for music teaching and networked music performance (NMP)
- NMP is "a real-time interaction over the network which enables musicians to play together as if they are in the same room"
- In NMP latency and audio quality are the two most important factors



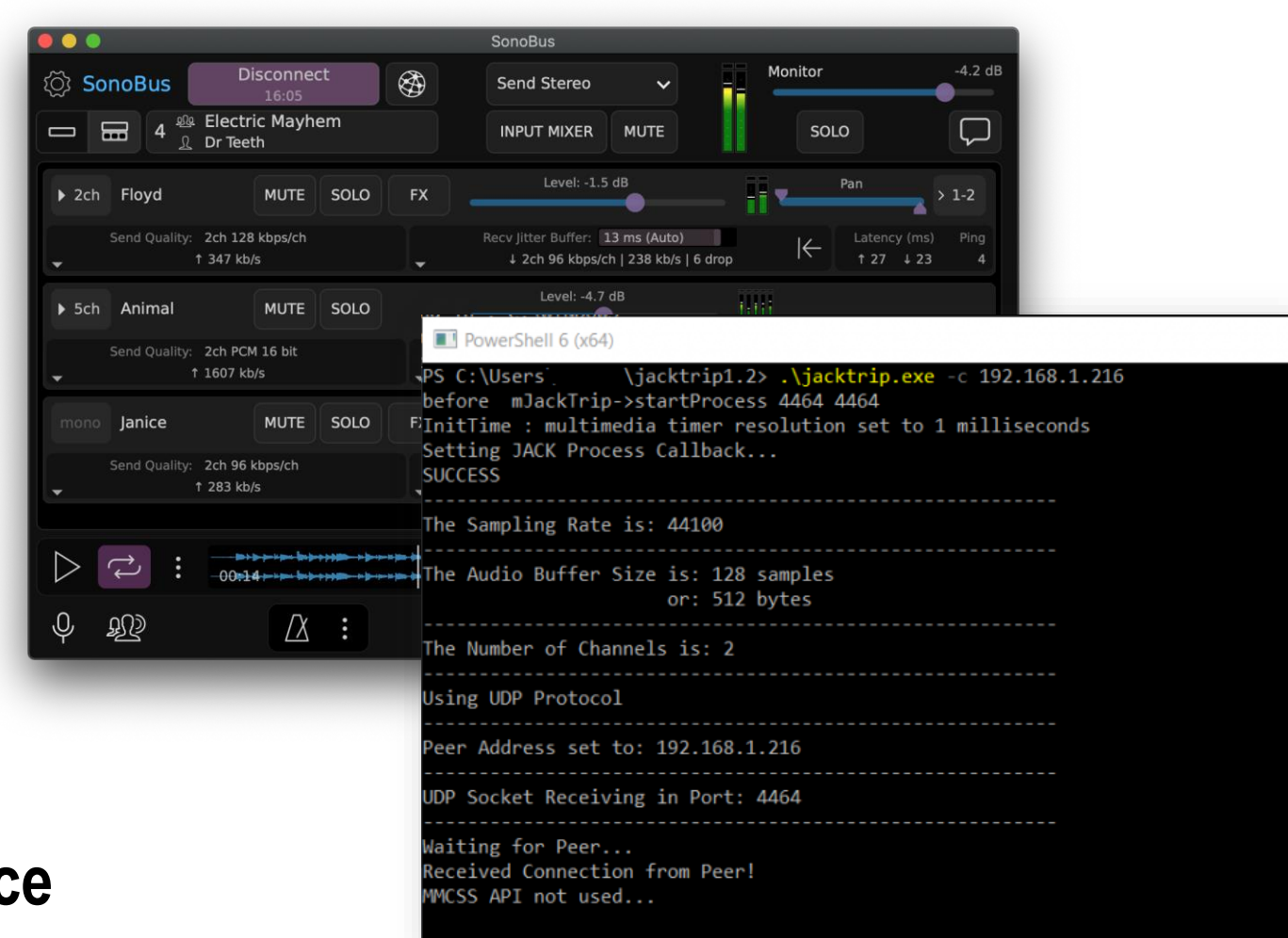
- Latency < 30ms
- Uncompressed audio (20Hz-20kHz).

- Standard videoconferencing platforms lack in performance

- Latency > 100ms
- Voice optimized codecs/settings
- Heavy processing (noise suppression, ...)

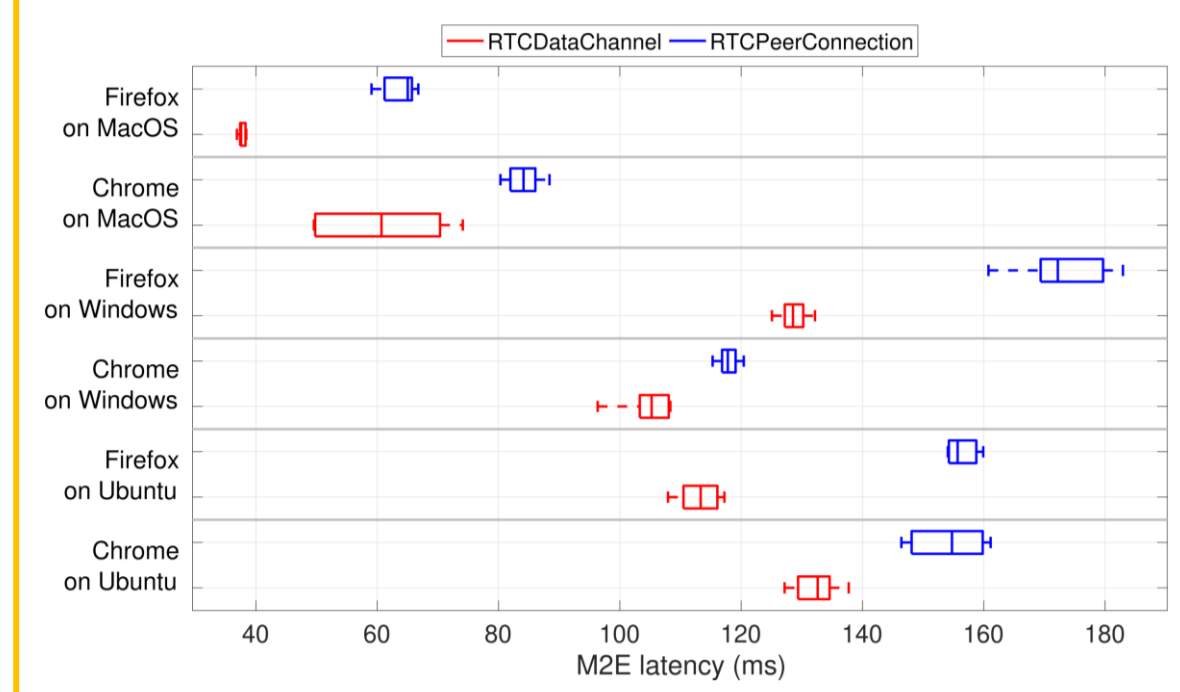
- Traditional NMP solutions lack in usability and accessibility

- Difficult installation
- Complex/Not accessible interface

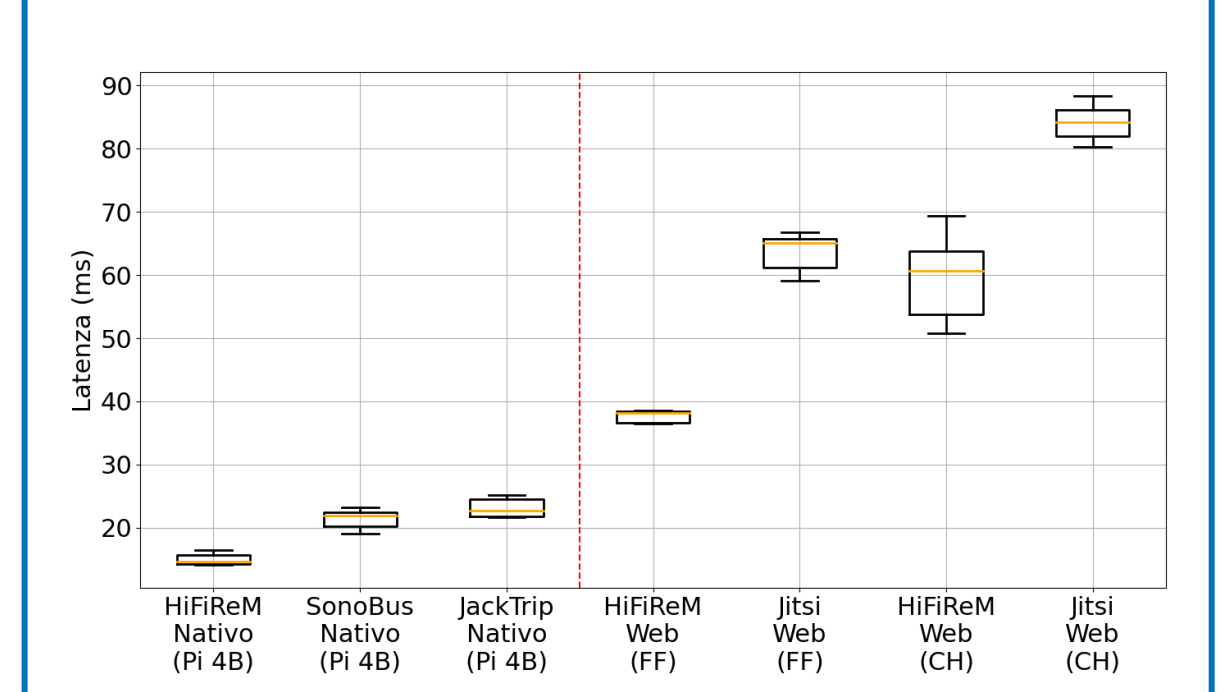


## Novel contributions

- Our web app (JackTrip-WebRTC) was able to improve over traditional WebRTC based solutions by 20-60ms
  - < 40ms with Firefox on macOS

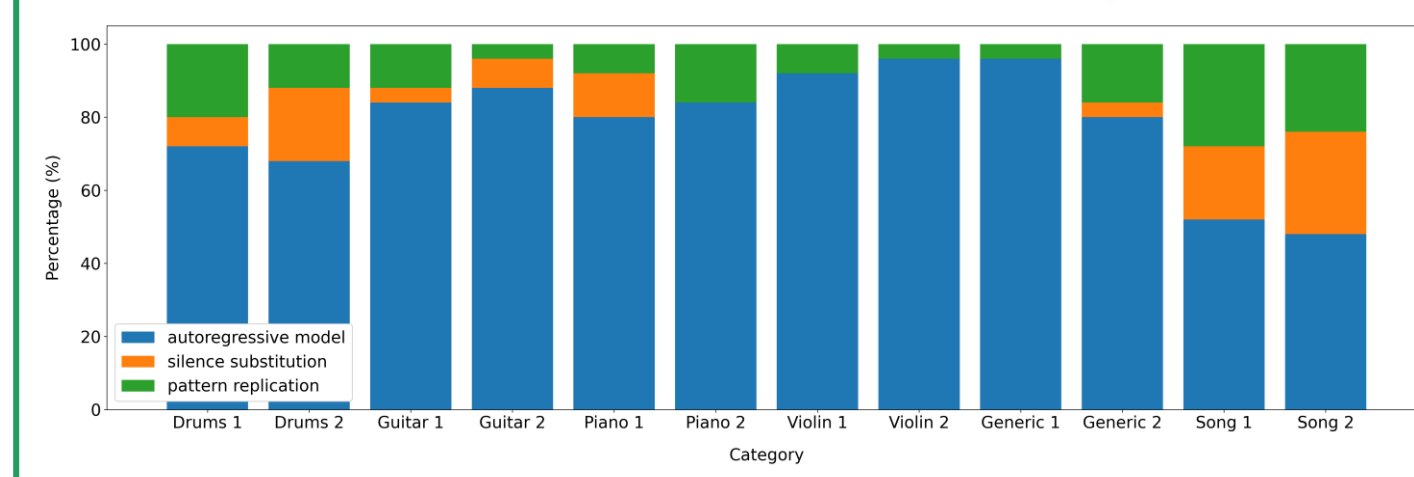
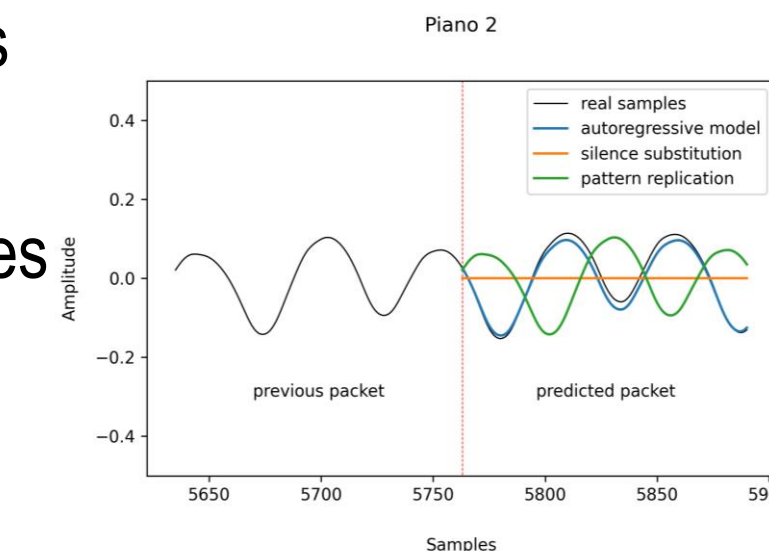


- Our native solution was able to reduce latency by 5-12ms w.r.t. state-of-the-art NMP solutions
  - 12-15ms on a local network

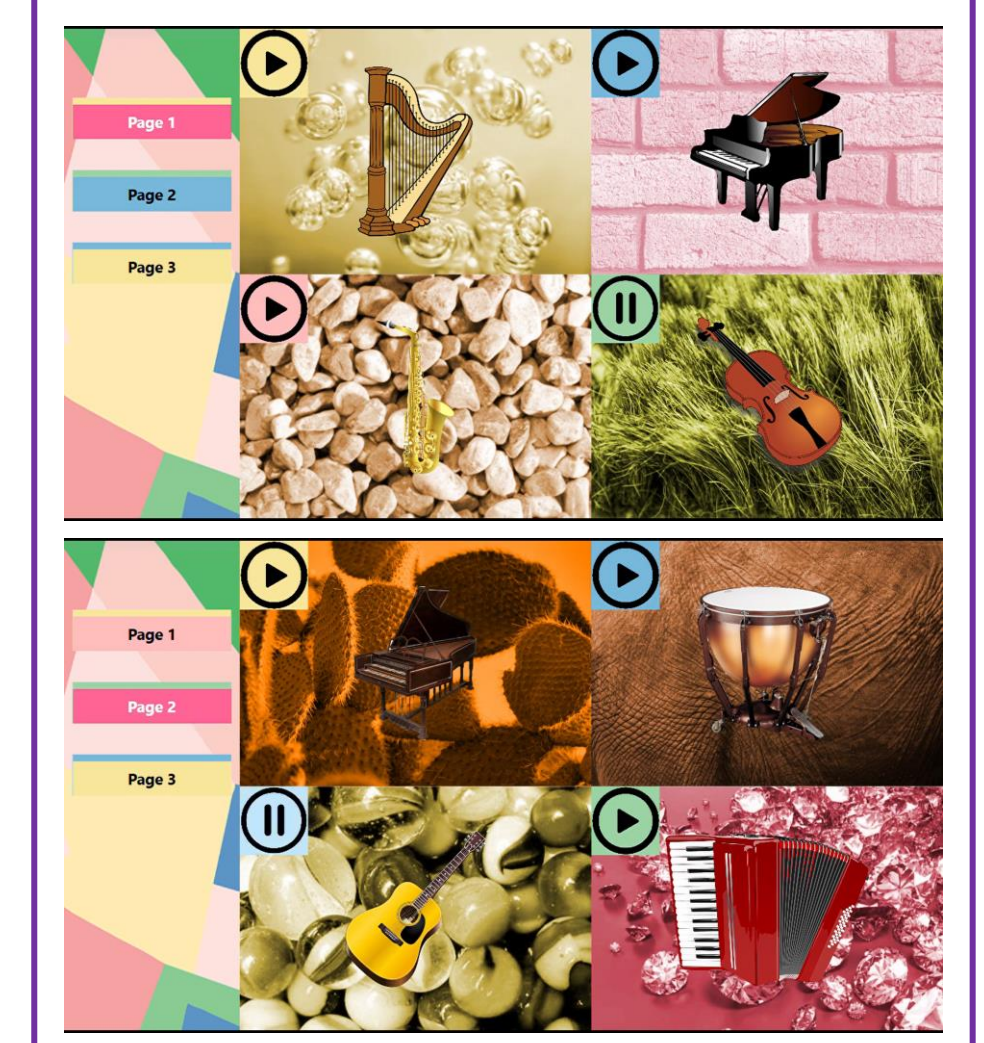


- AR models showed to improve over the two traditional solutions

- Lower errors
- 1/2 discontinuities
- Qualitatively better



- Final interface

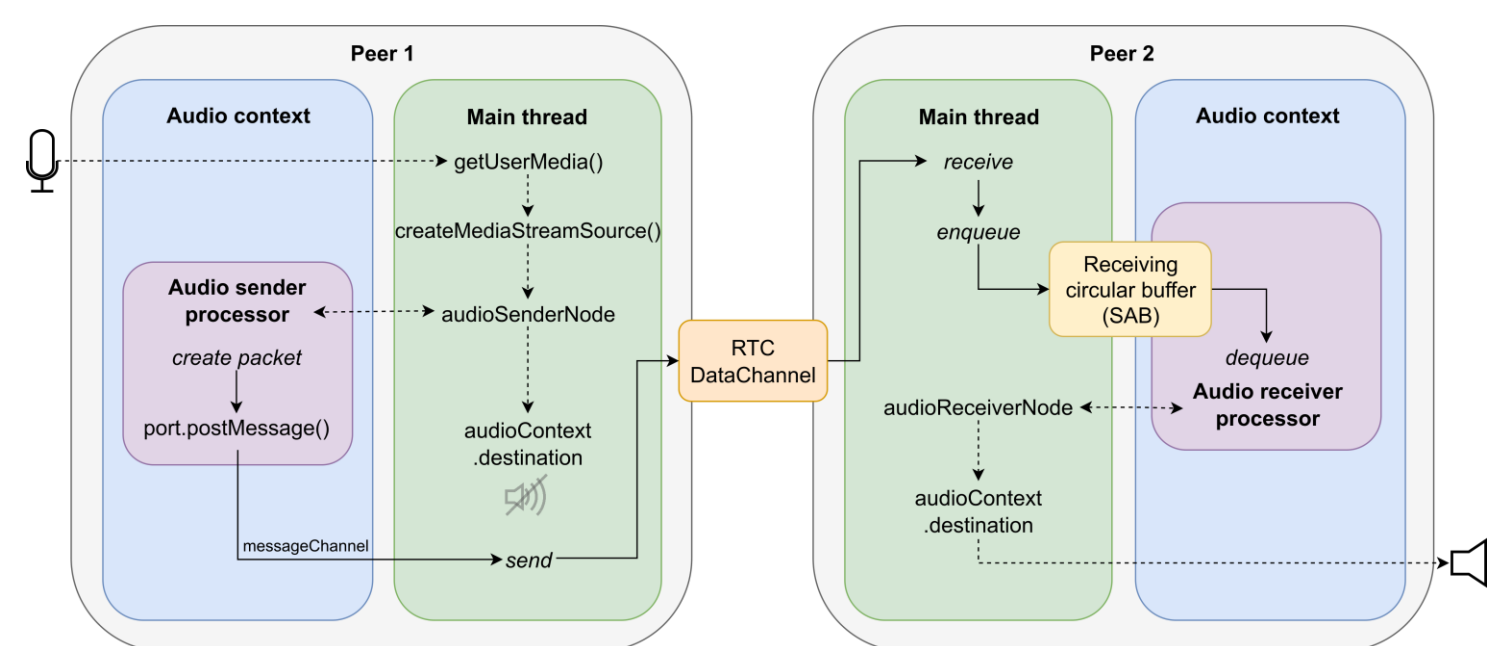


## Addressed research questions/problems

- Web applications are easy to use and designed to be accessible

- Design a web app focused on NMP

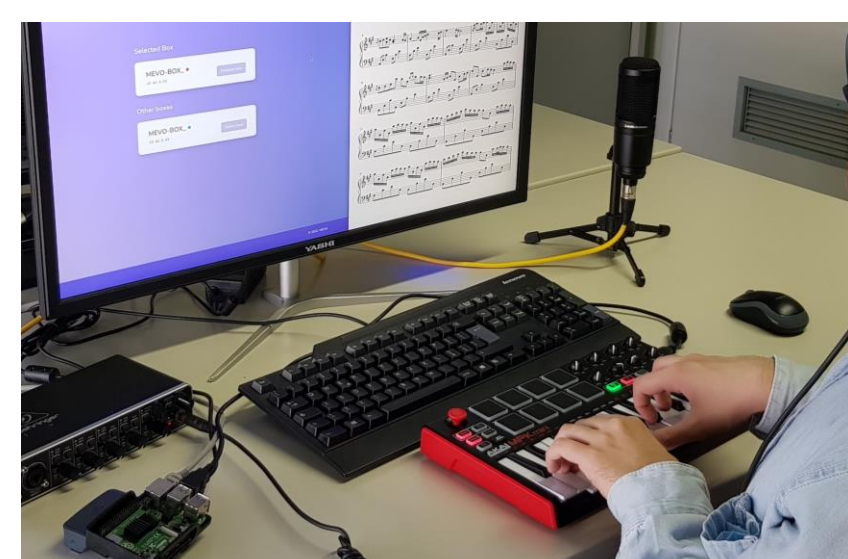
- Use WebRTC's DataChannel (UDP)
- Use Web Audio API's AudioWorklet



- Web applications don't have access to low-latency audio drivers (ALSA, ASIO, ..)

- Overcome limitations of web apps by developing a native solution controllable through a web app

- Based on a Raspberry Pi 4B
- Accessible and easy to use interface



- Traditional NMP packet loss concealment (PLC) solutions lead to suboptimal audio quality

- Silence substitution
- Pattern replication

0.9 0.8 ... 0.8 0.5 0 0 ... 0 0

0.9 0.8 ... 0.8 0.5 0.9 0.8 ... 0.8 0.5

- Propose a NMP specific PLC solution based on autoregressive (AR) models

- Experiments on how to integrate haptic feedback and visual stimuli to enhance audio accessibility



## Adopted methodologies

- Low-latency optimization: reduce to the bare minimum the processing time
- Parallel programming for real-time: use minimum number of threads synchronized through lock-free methods
- UI accessibility guidelines: implement a user interface to be accessible to people using screen readers or with visual impairments

- Autoregressive Models: type of process where the forecast variable is expressed as a linear combination of its past values

$$AR(\rho): y_t = c + \psi_1 y_{t-1} + \psi_2 y_{t-2} + \dots + \psi_\rho y_{t-\rho} + \epsilon_t$$

- Augmented Dickey fuller test: tests the null hypothesis that a unit root is present in a time series. Used to check if the time series is stationary

- Psycho-perceptual tests: for associating audio tracks to attributes belonging to different human senses other than hearing (touch, color, smell, ...)

## Future work

- Define a strategy to deal with audio card drift
- Auto-estimate parameters based on the network connection

- Add NAT traversal
- Add some remote mixing capabilities
- Finish development of custom HW audio card/accelerator

- Define a strategy and deploy AR models in a real case

- Perform a qualitative analysis of the resulting interface

## Submitted and published works

- Sacchetto, M., Gastaldi, P., Chafe, C., Rottondi, C., Servetti, A., "Web-Based Networked Music Performances via WebRTC: a Low-latency PCM Audio Solution", Journal of the Audio Engineering Society, 2022. (ongoing publication)
- Sacchetto, M., Huang, Y., Bianco, A., Rottondi, C., "Using Autoregressive Models for Real-Time Packet Loss Concealment in Networked Music Performance Applications", AudioMostly 2022, St. Pölten, 6-9 September 2022. (ongoing publication)
- Sacchetto, M., Rottondi, C., Servetti, A., Shtrepi, L., Masoero, M., Valle, A., "HiFiReM: un approccio unificato, web e nativo, per la didattica musicale remota", XXIII CIM, Ancona, 25-28 October 2022. (submitted)

## List of attended classes

- 01UJBRV - Adversarial training of neural networks (April 2022, 3 CFU)
- 01RGRV - Optimization methods for engineering problems (May 2022, 6 CFU)
- 01MNFUI - Parallel and distributed computing (June 2022, 5 CFU)
- 01SCSIU - Machine learning for pattern recognition (July 2022, 4 CFU)