

# Extraction of the principal perceptual features of vibrations

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# Thesis overview

Perception of audio-haptic textures for new touchscreen interactions

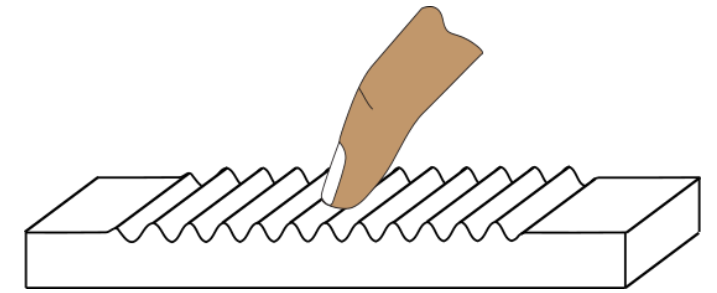
Advisors: Sølvi Ystad and Michael Wiertlewski

Lab: PRISM and ISM (Aix-Marseille University, CNRS)

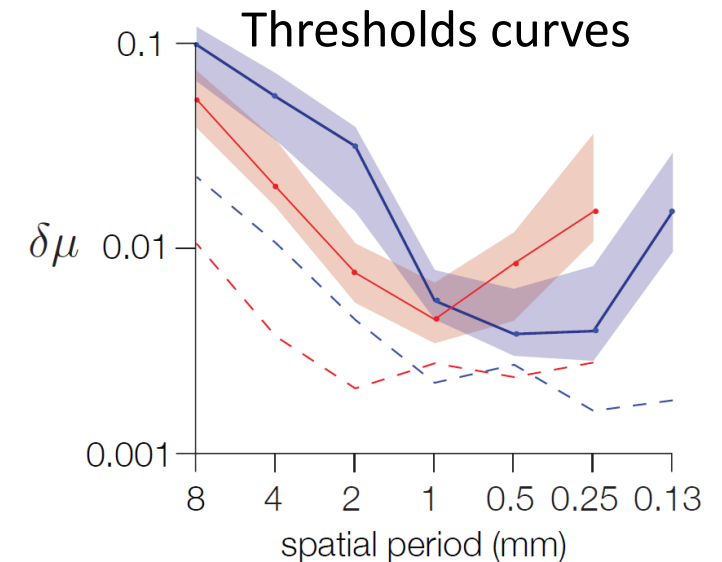
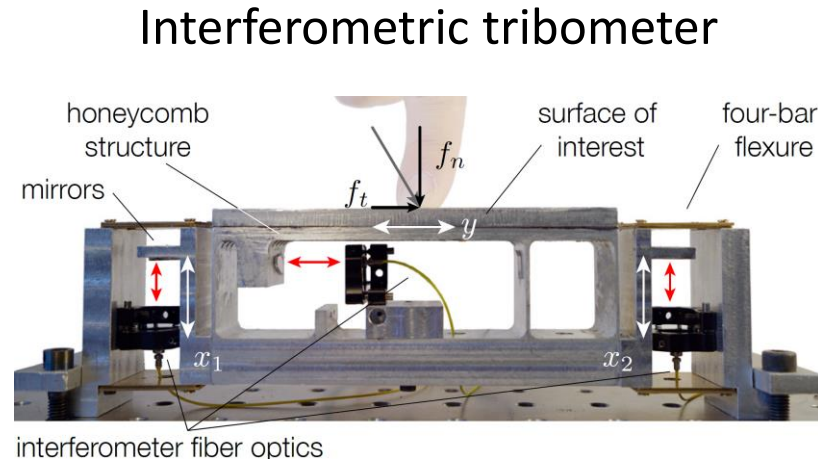
Company: Stellantis (Jocelyn Monnoyer)



# I. Detection threshold



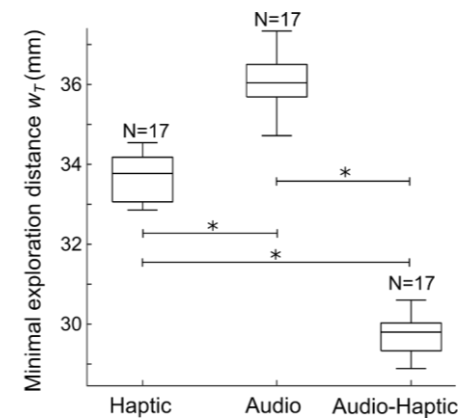
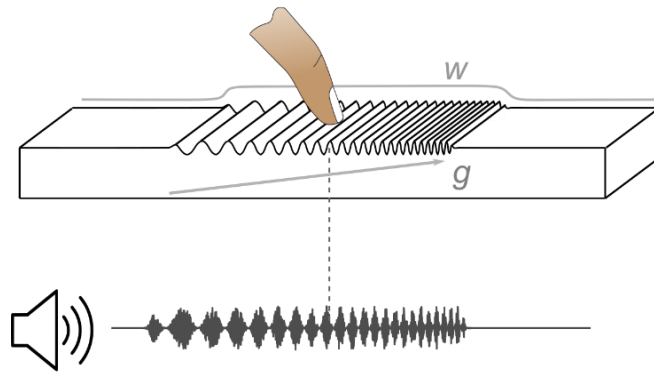
- How detection thresholds evolve with texture spatial frequency ?  
(Technology: ultrasonic friction modulation)



→ Similar to vibrotactile sensitivity

## II. Audio-haptic interaction

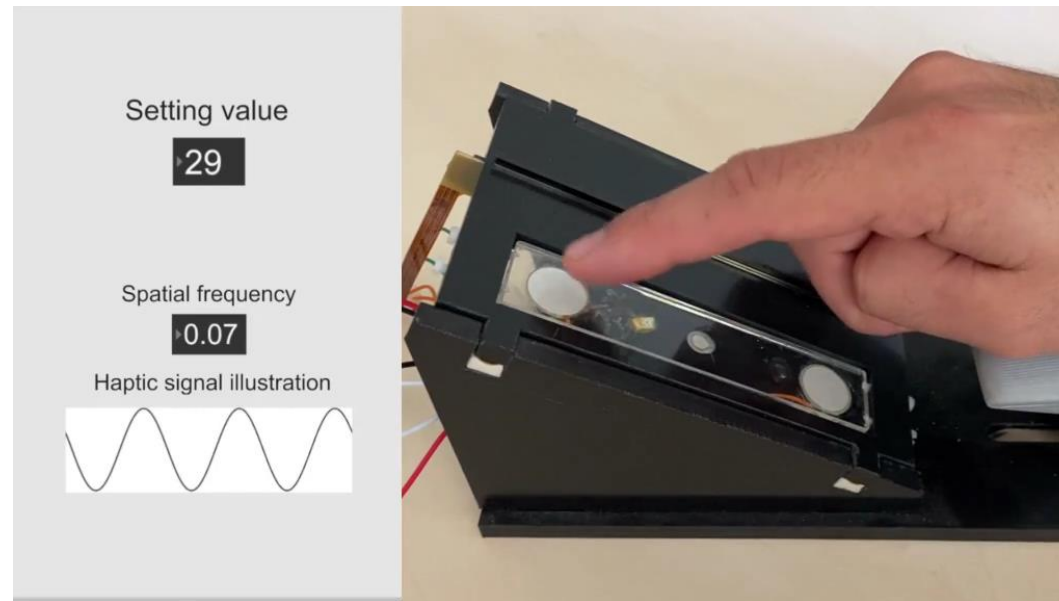
- How to combine audio and friction modulated haptic feedback?



- Perception of haptic gradients = perception of rhythmic changes
- Demonstration of audio-haptic integration

# III. Eyes-free interaction

- How to provide information of a value to the user?



- Users can adjust a setting without vision
- Comparison of different learning procedures with multimodal feedback



Laboratory in Marseille:

- Auditory perception and sound synthesis
- Immersion, 3D sounds and multimodality



Laboratory in Ajaccio:

- Interactive robotics
- Surface Haptics



# Principal perceptual features of vibrations

What makes two vibrations feel different?

Motivations:

- Vibrotactile perception better understanding
- Invariant structures research

Applications :

- Vibration analysis and synthesis
- Vibrotactile signals compression

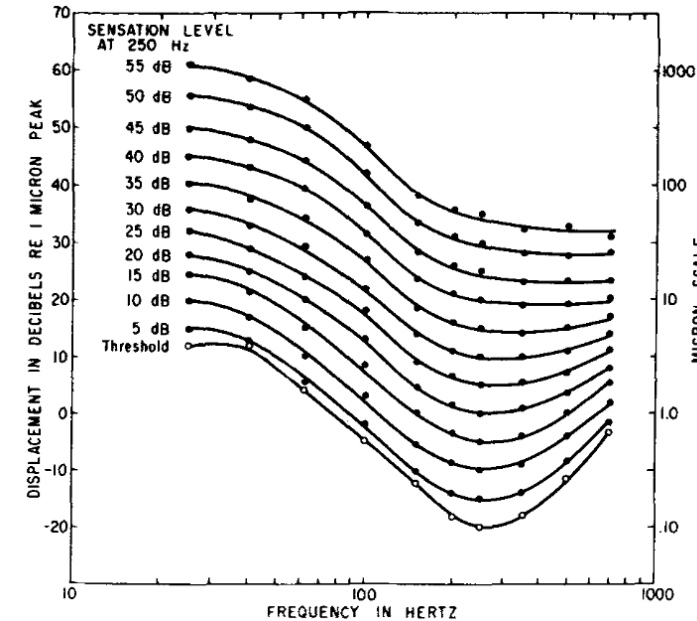
# State of the art – Vibration attributes

## Perception of vibration frequency :

- Independent of the amplitude (Pongrac,2008)
- Weber fraction: between 18% and 20% (Pongrac,2008)

## Perception of vibration intensity:

- Perceived intensity varies frequency (Verrillo, 1969)
- Weber fraction varies between studies from 10% to 30% (Sherrick, 1950; Schiller, 1953; Craig, 1972; Fucci 1982)





# State of the art – Dissimilarities

- Measure of vibration similarity (ST-SIM) based on spectral and temporal similarities, used to assess compression quality. (Hassen and Steinbach, 2020)
- Prediction perceptual similarities between textures from exploration data (forces, vibrations, speed) (Richardson, Vardar, Wallraven and Kuchenbecker, 2022)
- Signal representations to predict musical instrument timbre similarities (Thoret, Caramiaux, Depalle and McAdams, 2020)

# Stimuli presentation

## 18 vibration signals from the Kirsch et al. database

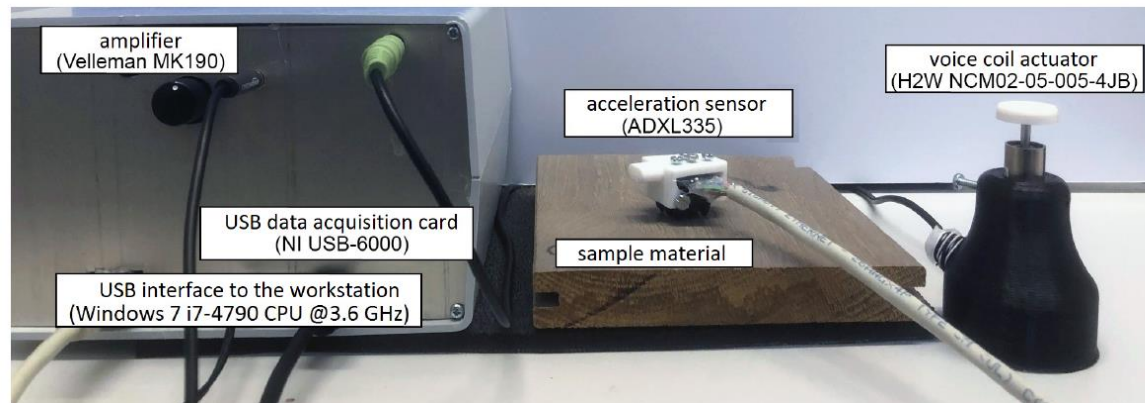
9 textures : rubber, polyester pad, foam, felt, cork, bamboo, baltic brown, anti vib pad, aluminium grid

2 different probes :



1 scanning speed : 100 – 120 mm/s

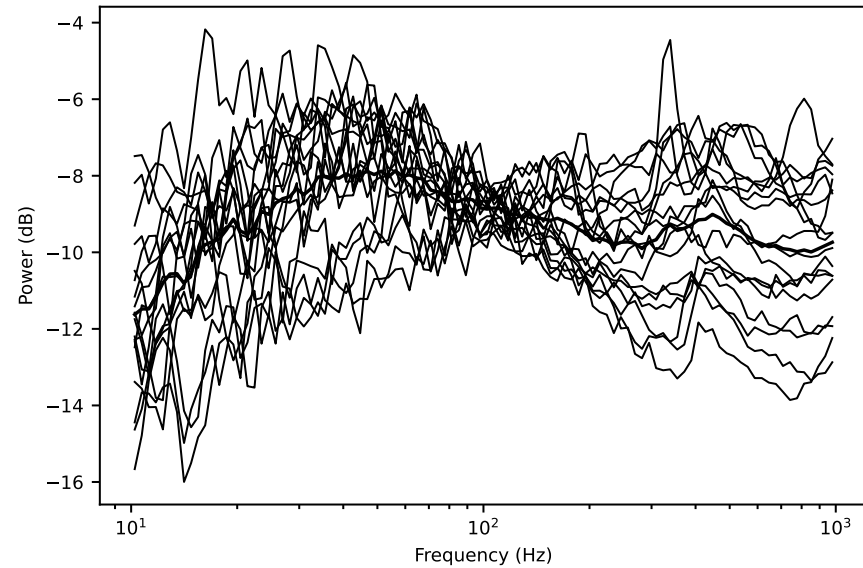
**Stationary signals**, duration = 1 sec, sampling rate = 2800 Hz,



(Kirsch, Noll, Strese, Liu and Steinbach, 2018)

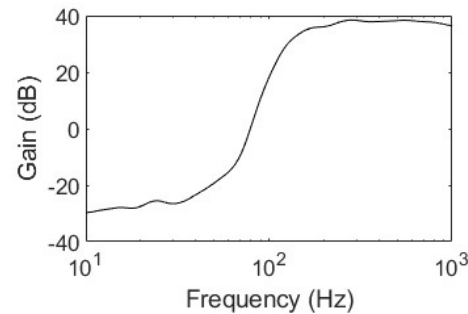
# Stimuli rendering

Original stimuli



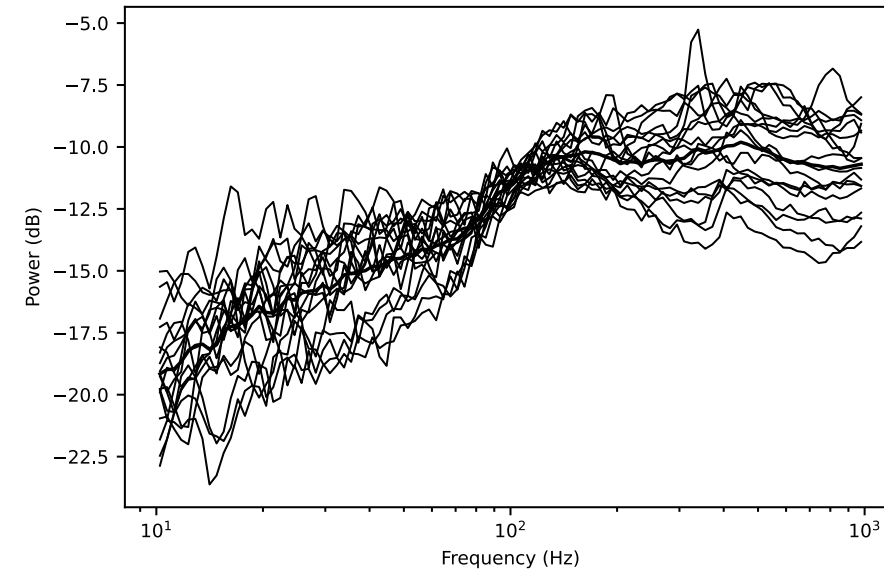
Signals used to produce the stimuli

HapCoil-One (Aktronika)



Actuator frequency response (actuator held between two fingers)

Filtered stimuli



Signals closer to the perceived vibrations - used for the analysis

# Preliminary study : intensity equalization

- Vibration intensity is known as a major perceptive attribute
  - Intensity equalization is required to investigate other attributes
  - Iso-intensity curves for sinusoidal signals (Verrillo,1969 )
  - Intensity model for sinusoidal signals (Wang et al. 2008)
- What about complex/noisy vibrations ?

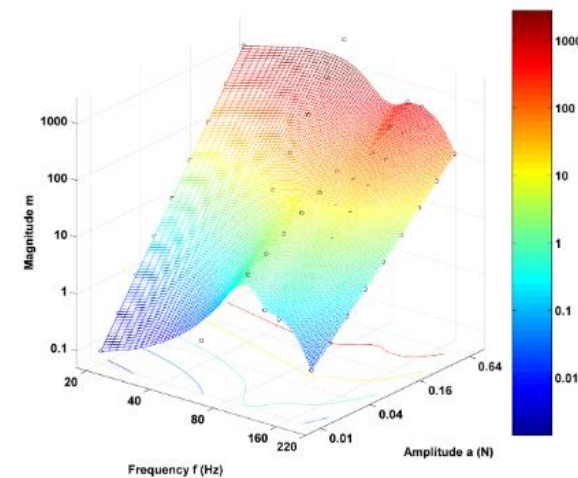
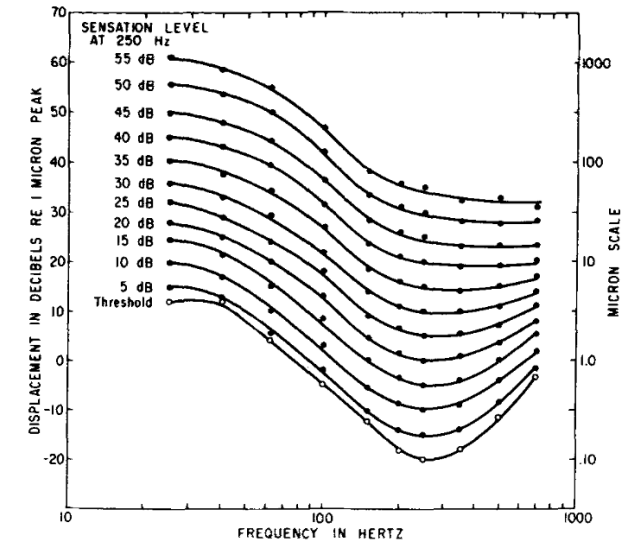
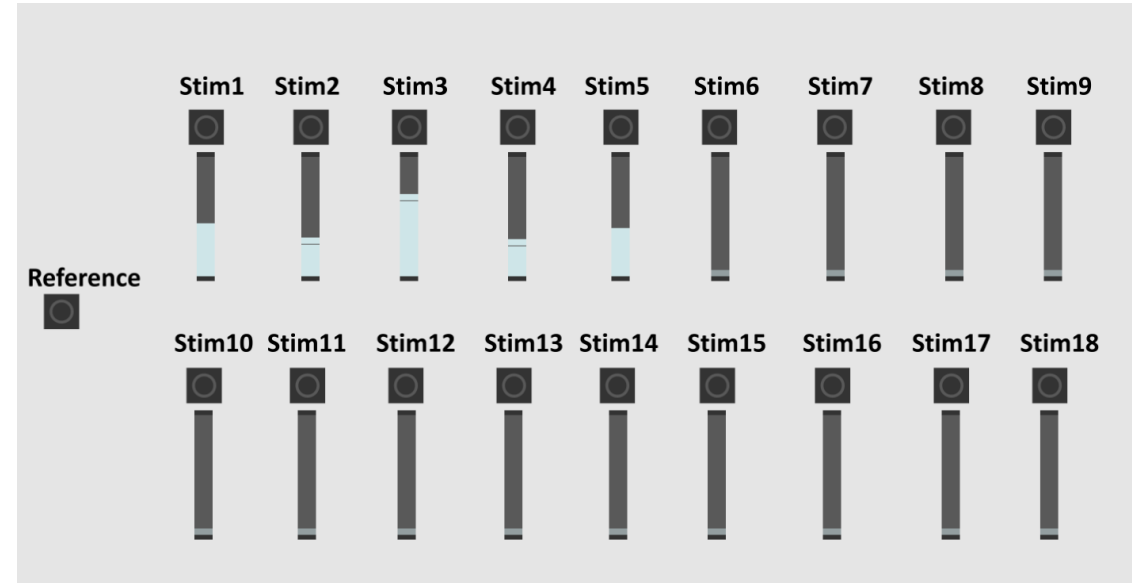


Figure 4: Model II

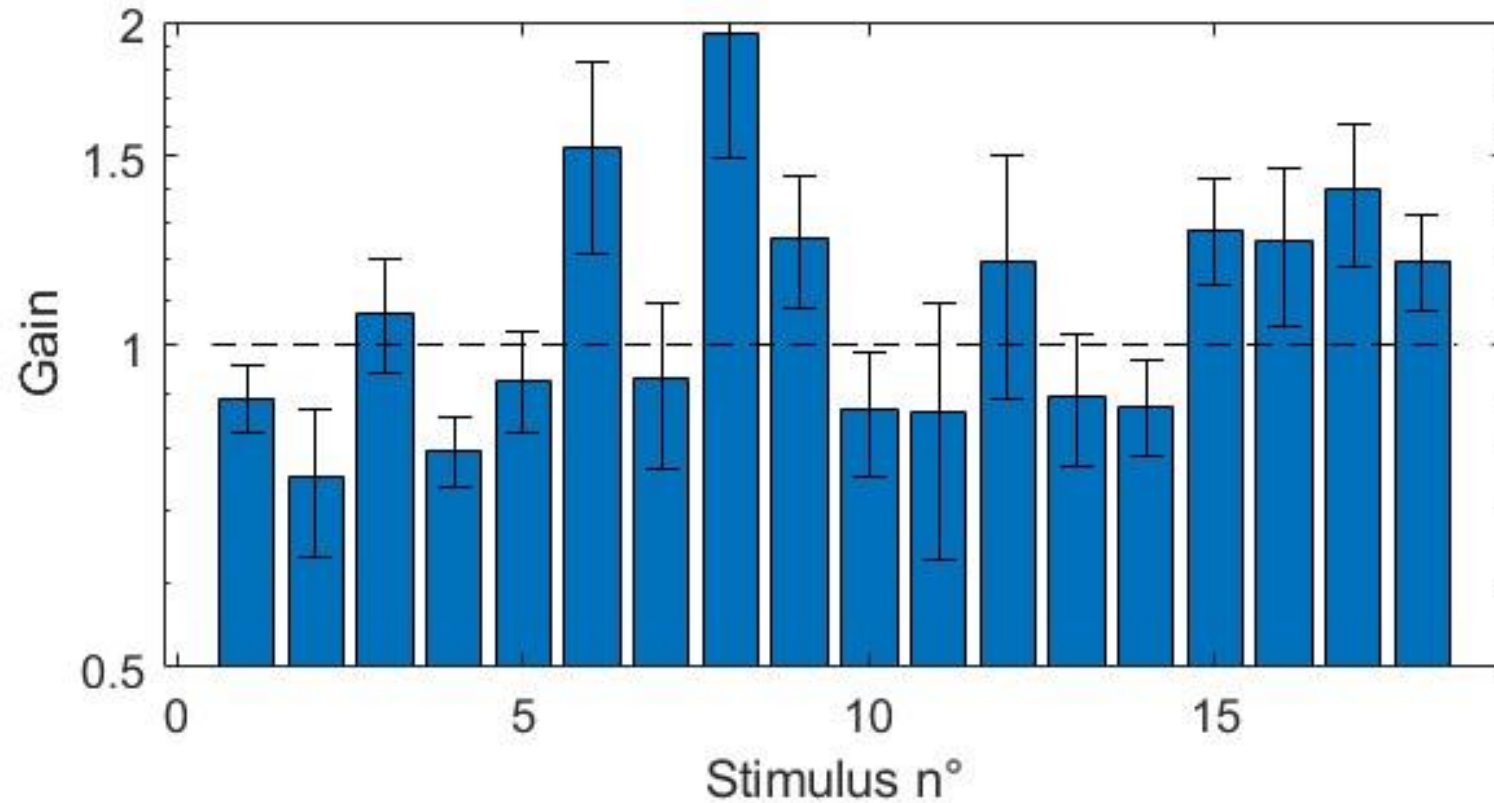
# Experimental protocol

- Preliminary mathematical equalization (std)
- Comparison with a reference (white noise)



- 10 participants
- Between-subjects correlations  $r$  : mean=**0.82** min=0.60 max=0.97

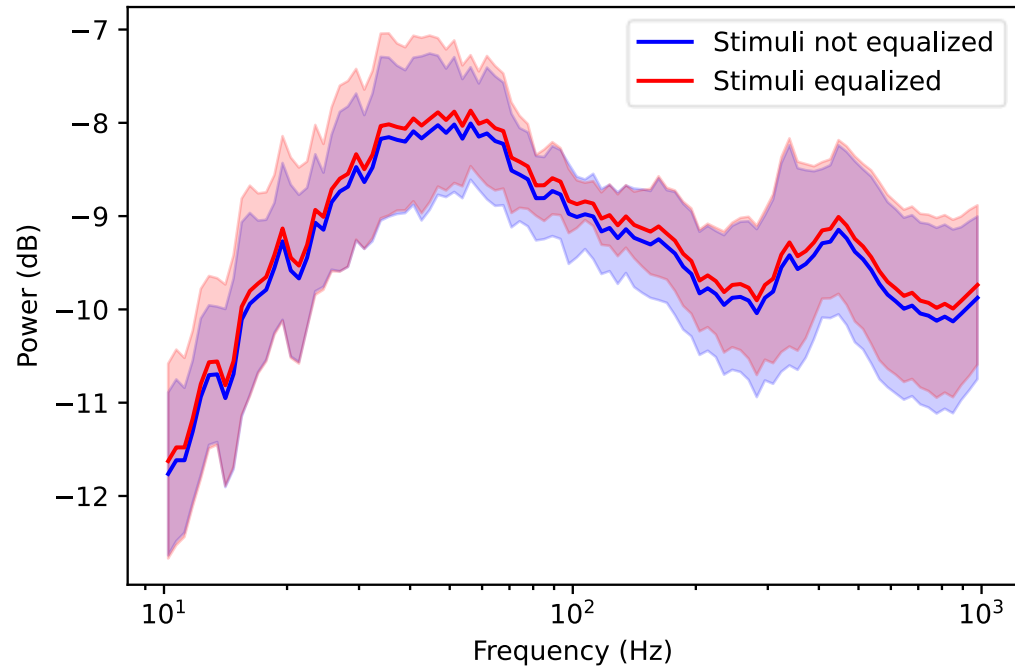
# Intensity equalization results



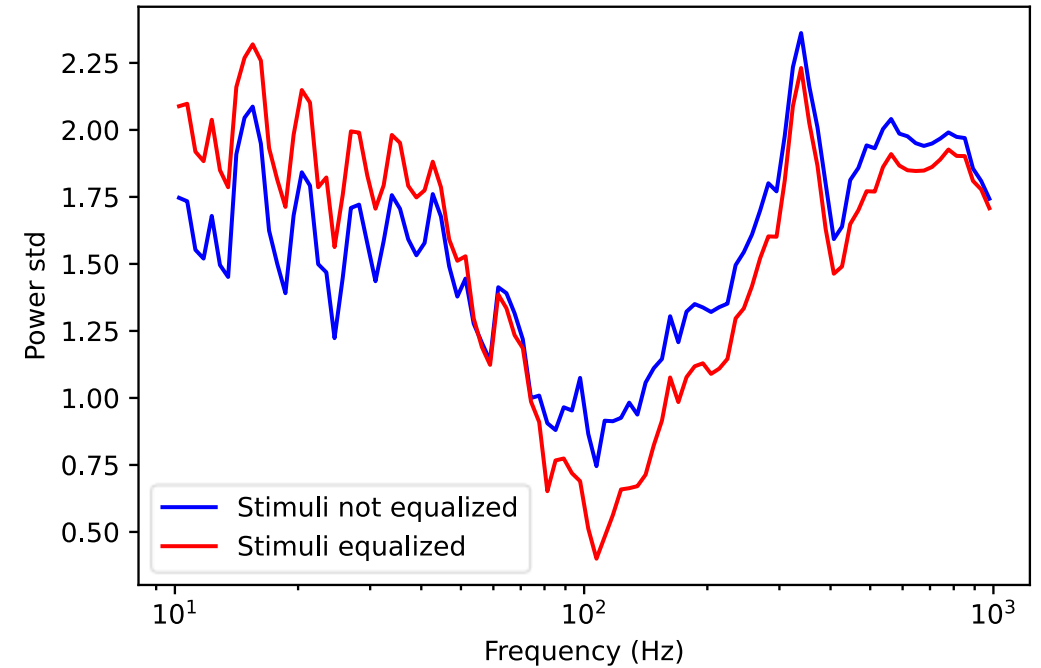
→ Calculation of the mean gain for each stimulus

# Intensity equalization results

## Stimuli spectra



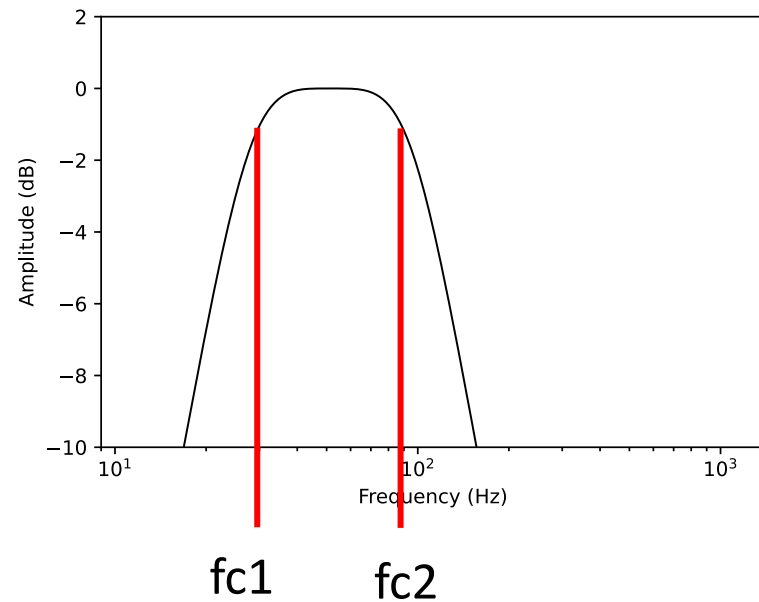
## Stimuli spectra std



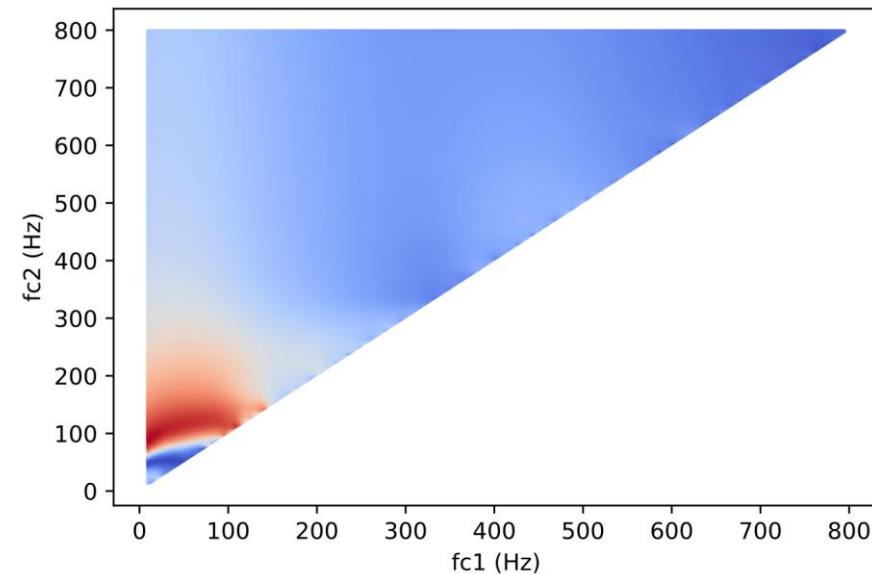
# Can we predict the intensity ratings ?

- Looking for the best filter to predict the results

Band pass filter with varying cut-off frequencies



Evolution of the correlation with fc1 and fc 2

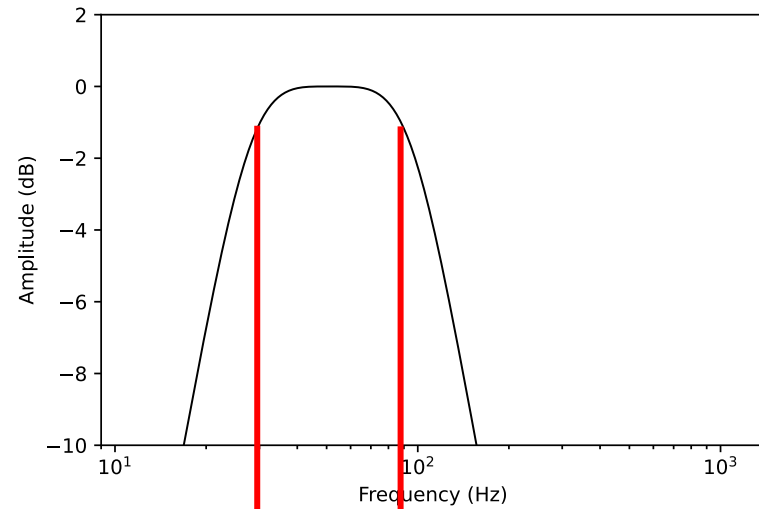




# Can we predict the intensity ratings ?

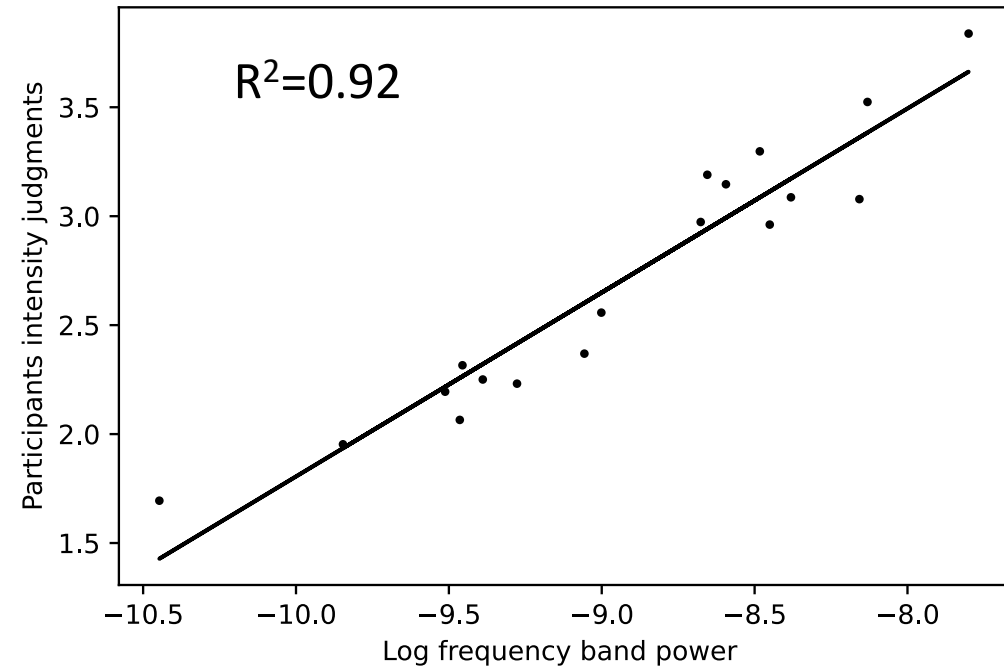
- Looking for the best filter to predict the results

Band pass filter with varying cut-off frequencies



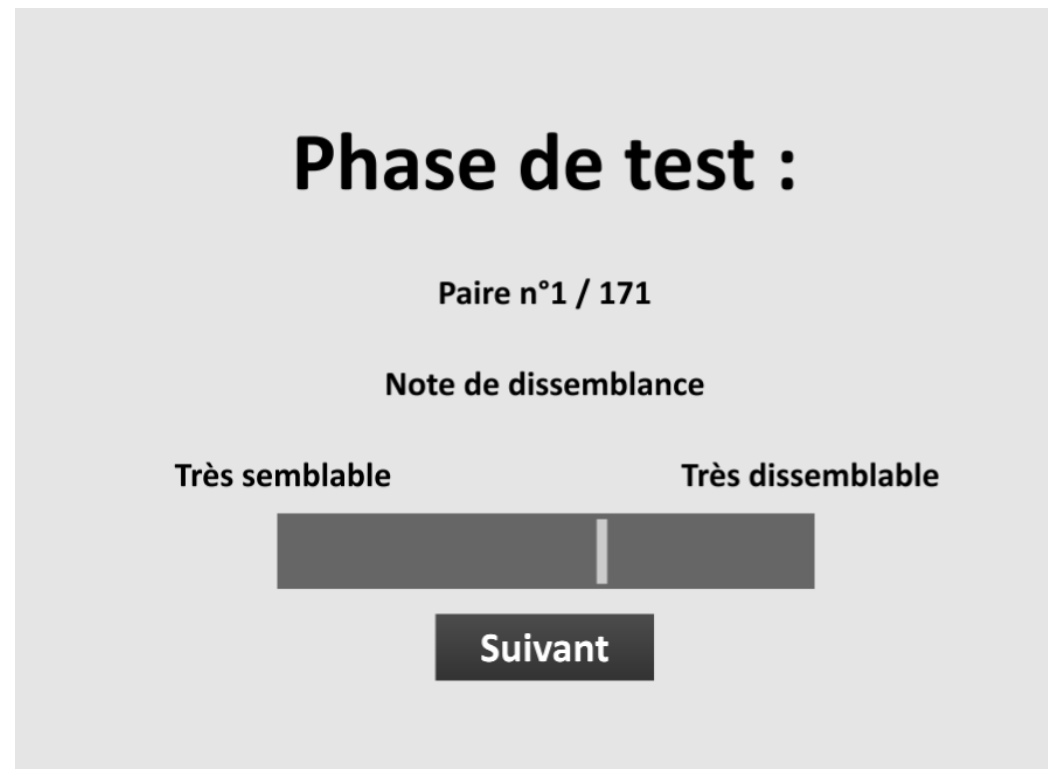
fc1=25 Hz    fc2=110 Hz

Linear regression



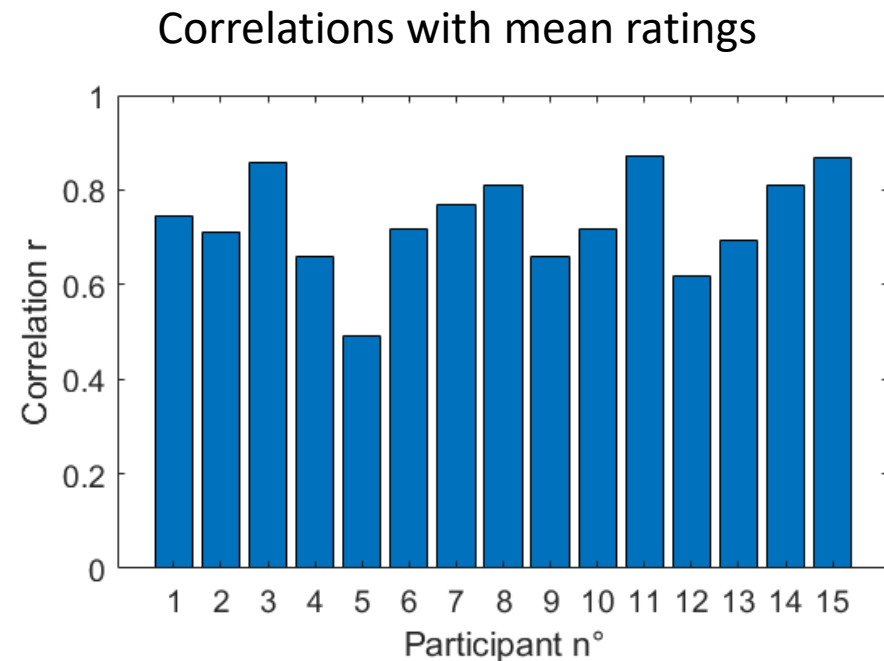
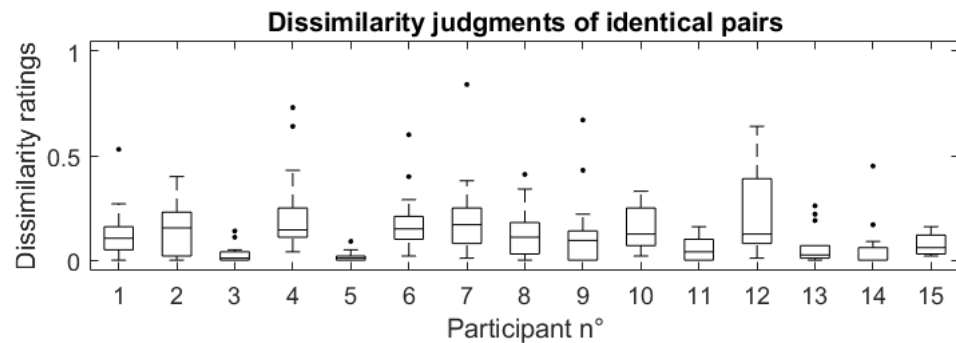
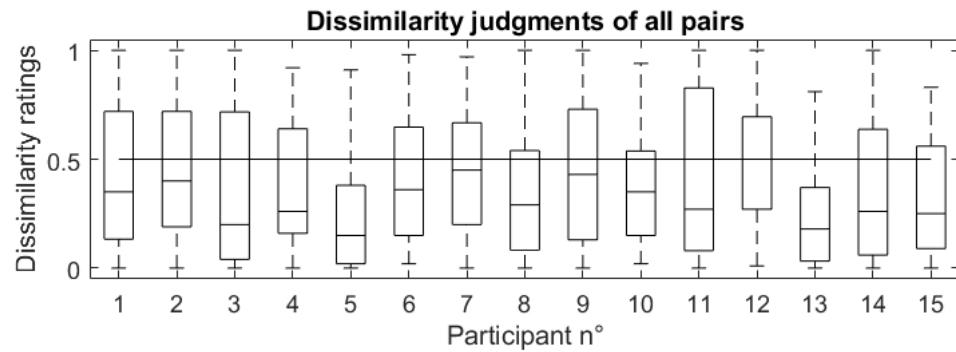
# Dissimilarity experiment

- Judgments of dissimilarities between two vibrations (With equalized stimuli)
- Pair-wise comparison (18 stimuli → 171 pairs)
- Training session (30 pairs)



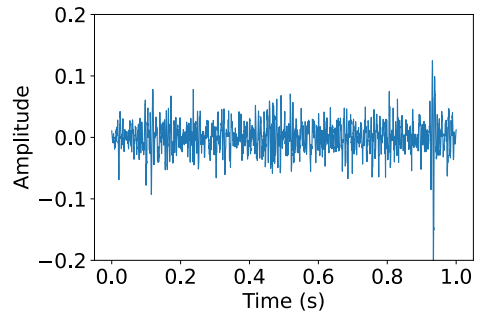
# Participants

- 15 participants
- Between-subjects correlations  $r$  : mean=**0.51** min=0.17 max=0.84
- Mean judgment of identical pairs: 0.12

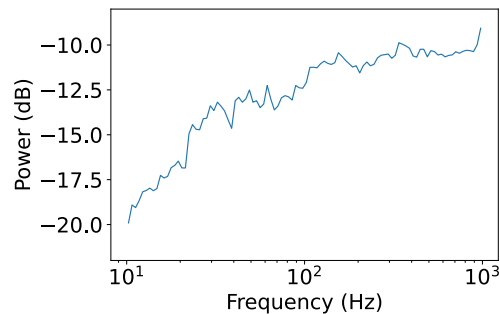
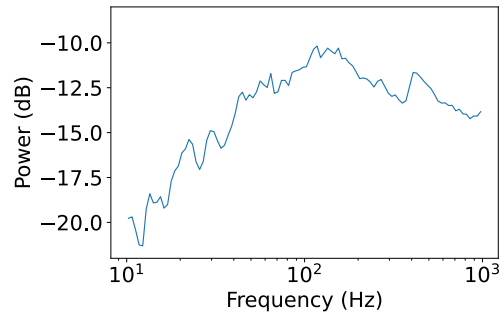


# Participant ratings prediction methodology

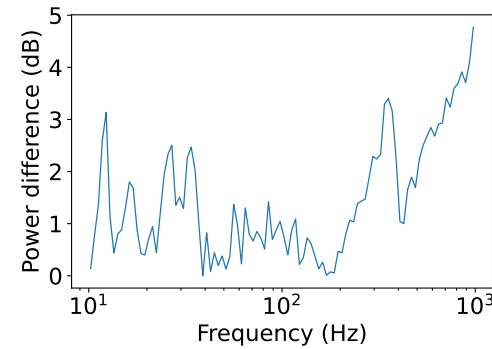
Temporal signals



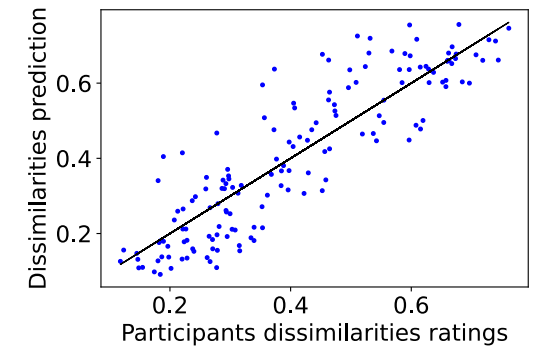
Representation:  
Power by frequency band



Distance between  
the 2 representations



Regression



Participants dissimilarity  
ratings from the experiment

# Participant rating prediction methodology

For two vibration signals  $x$  and  $y$  :

- Calculation of the powers  $P_i(x)$  and  $P_i(y)$  in each frequency band  $i$ .
- Local difference in each frequency band:

$$d_i(x, y) = \sqrt{(P_i(x) - P_i(y))^2}$$

- Global dissimilarity estimation:

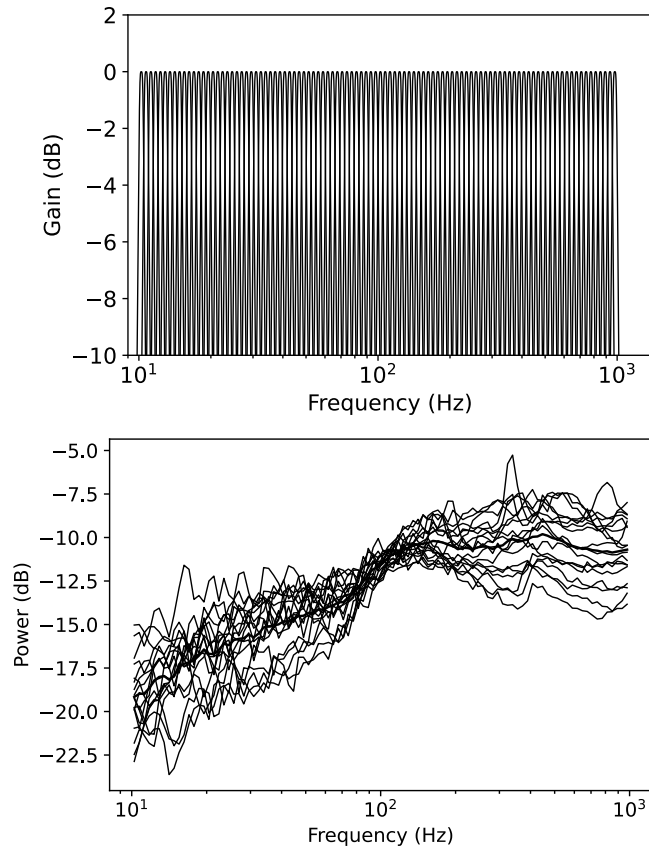
$$D(x, y) = \sum_i w_i d_i(x, y) \quad \text{with } w_i > 0$$

- Analysis to find the optimal weights  $w_i$  to fit dissimilarity judgments  
Lasso Regression (regression with regularization)

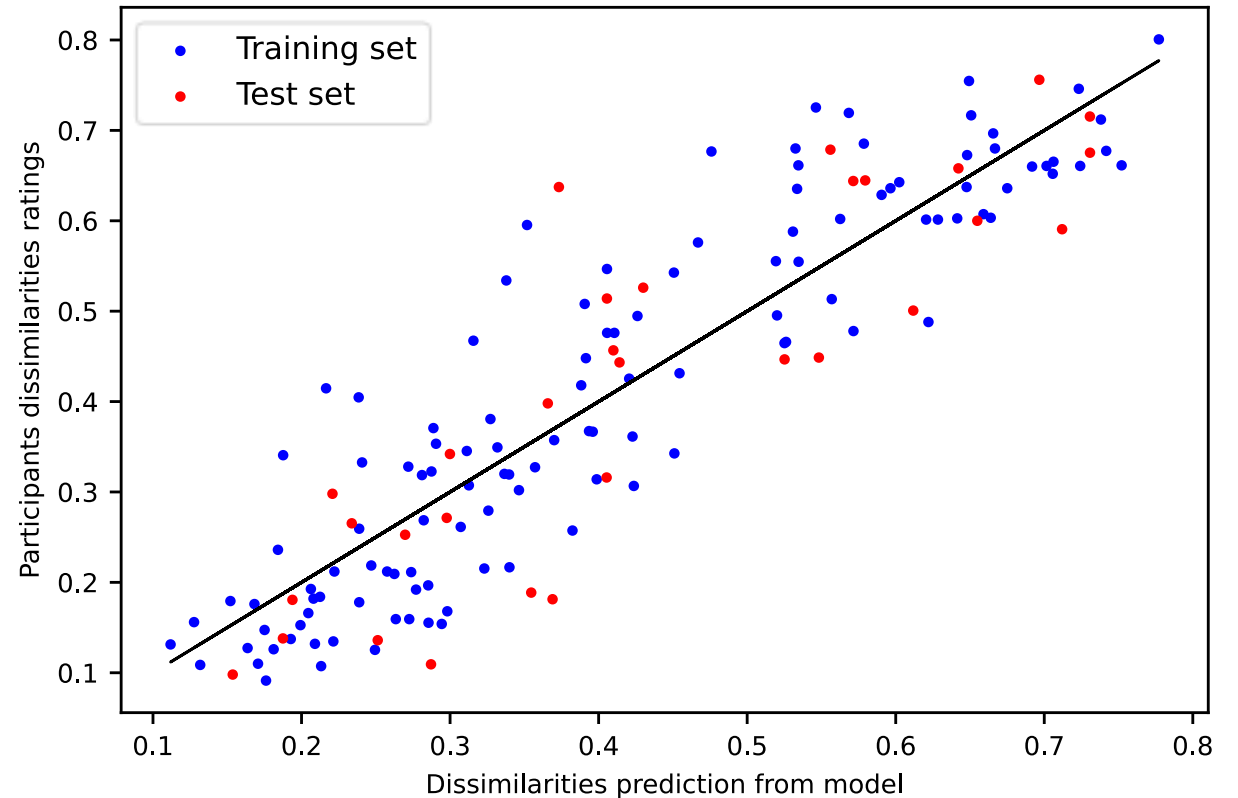
# Can we predict participants ratings ?

Representation :

Power by frequency band

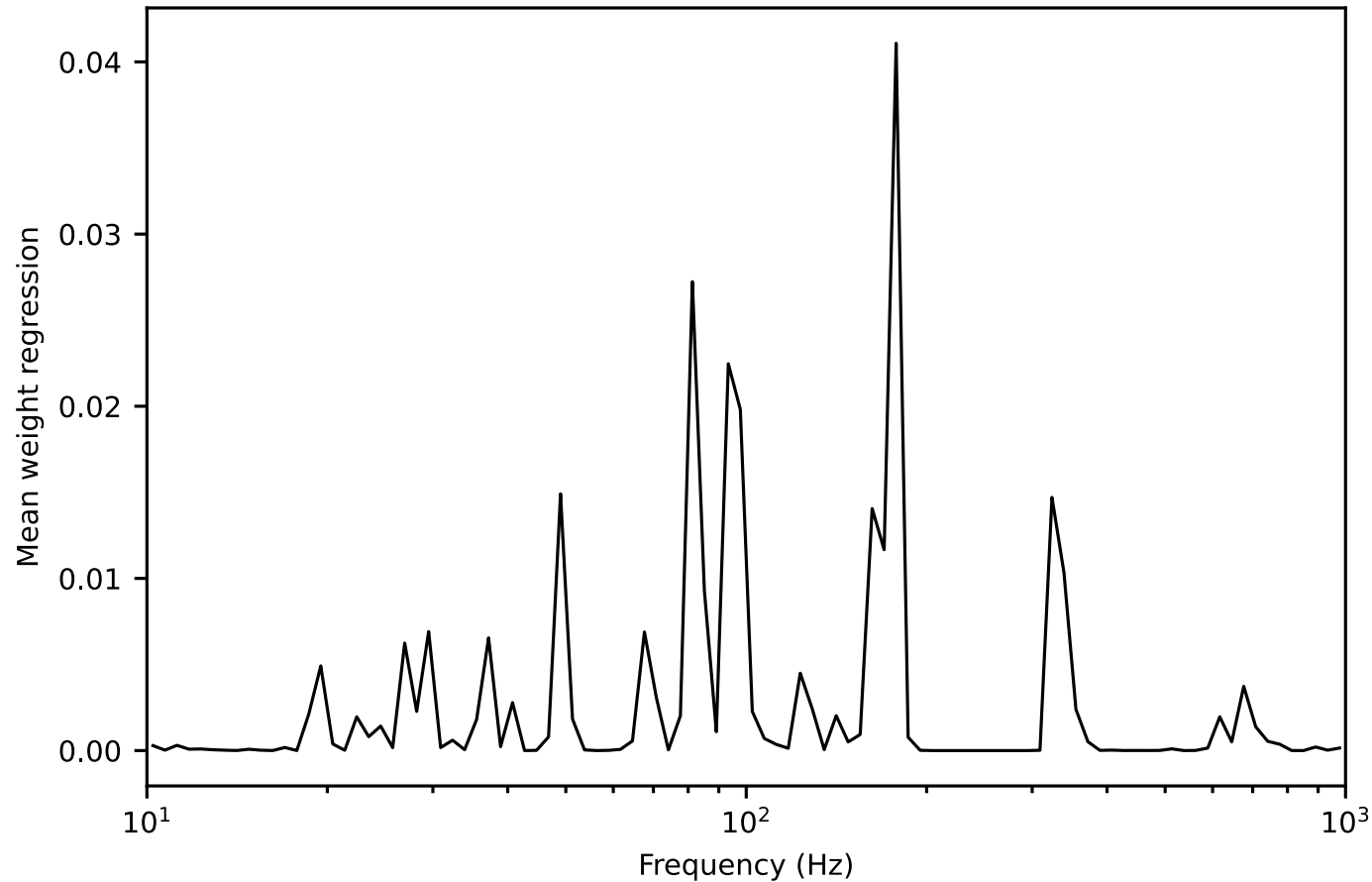


Lasso regression result: mean  $R^2(\text{test}) = 0.77$



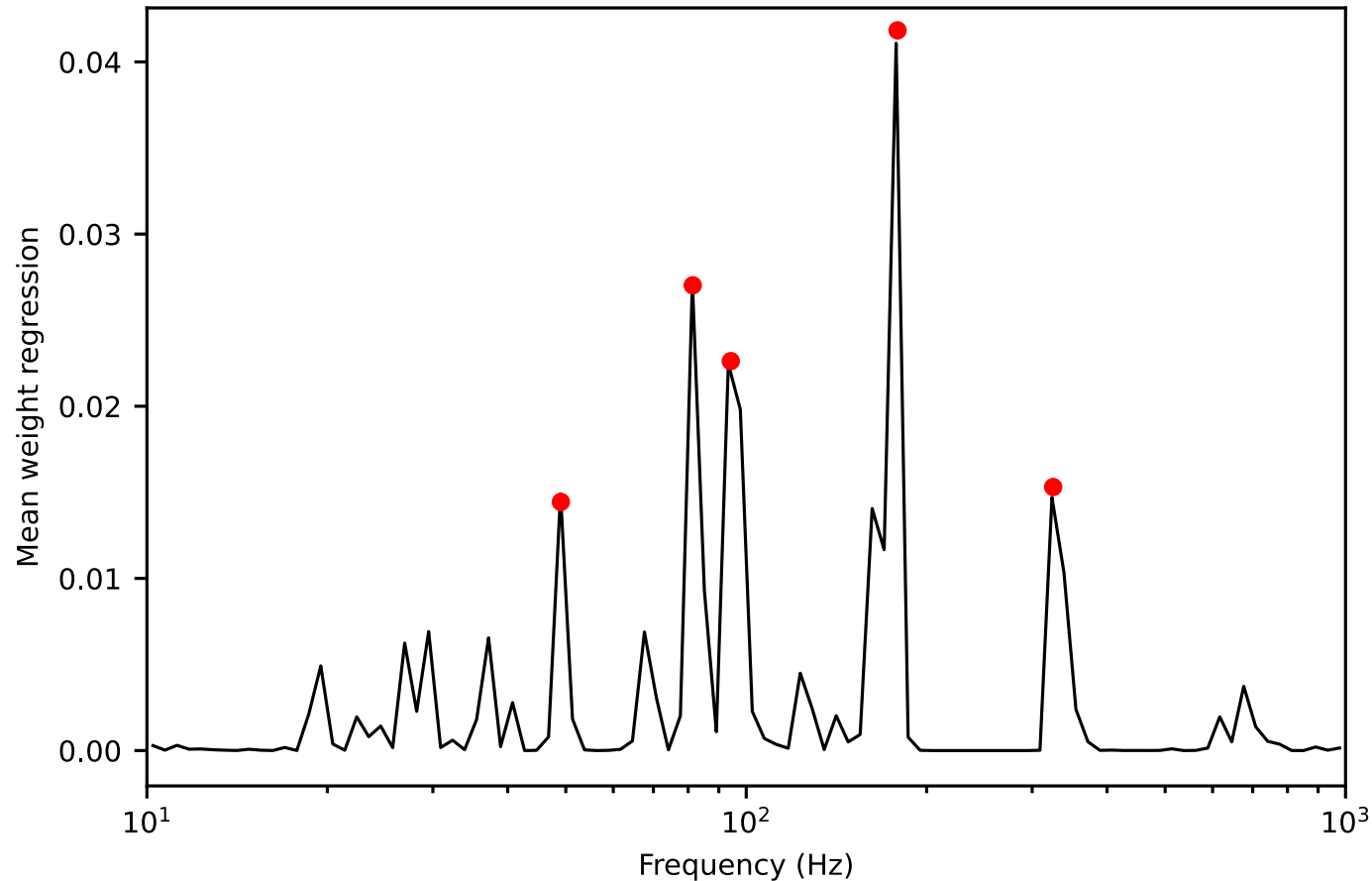
# What is used for the prediction ?

Interpretation of the weights  $w_i$  applied to each frequency band

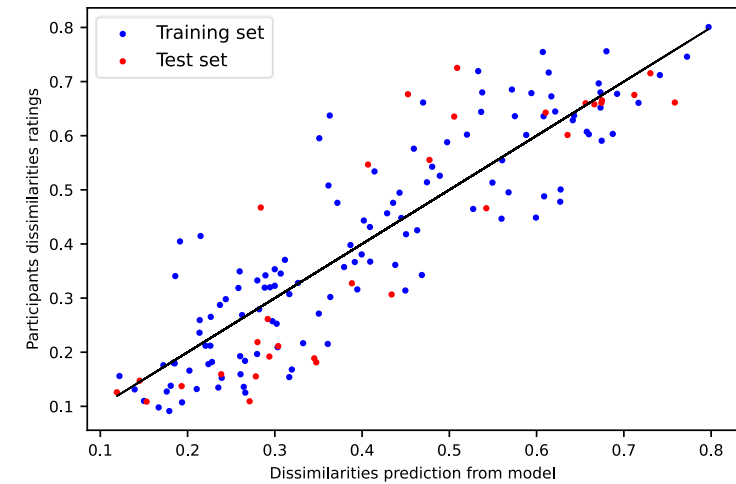


# What is used for the prediction ?

Interpretation of the weights  $w_i$  applied to each frequency band



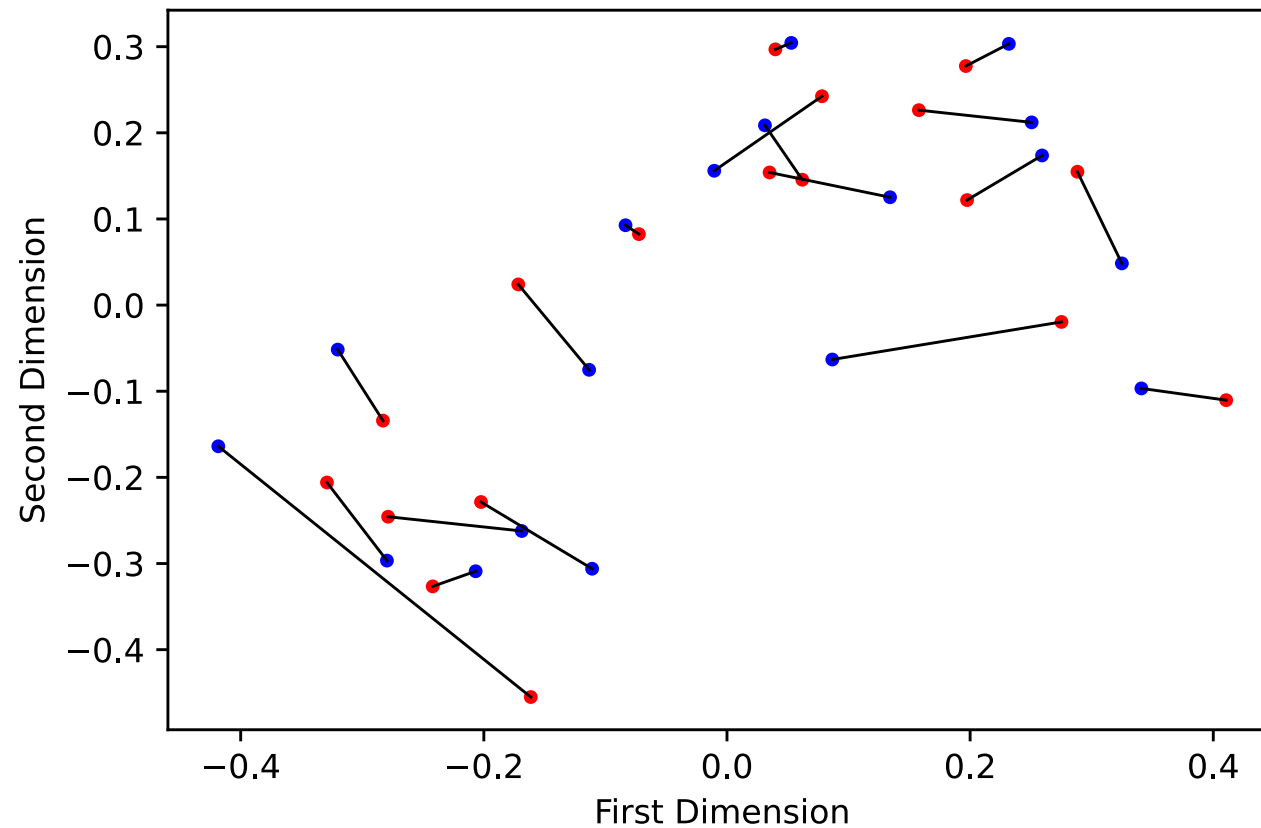
Regression with only 5  
frequency bands  
Mean  $R^2(\text{test}) = 0.78$





# Multidimensional scaling (MDS)

Red = participant ratings, Blue = prediction (model with 5 frequency bands)



# Conclusion and discussion

## **Perception of vibration intensity**

- Prediction of participants intensity judgments ( $R^2=0.92$ )
- Importance of the 25-110 Hz range

## **Perception of dissemblance**

- Prediction of participants dissimilarity judgments ( $R^2=0.78$ )
- Prominence of some frequency bands (50, 80, 100, 180, 330 Hz)
- Potential of the approach for signal compression

## **Limitations:**

- Dependence on the dataset
- Does not consider finger movement

# Future work: resynthesis

Are these 5 bands necessary? (substrative synthesis)

Are these 5 bands sufficient? (additive synthesis)

