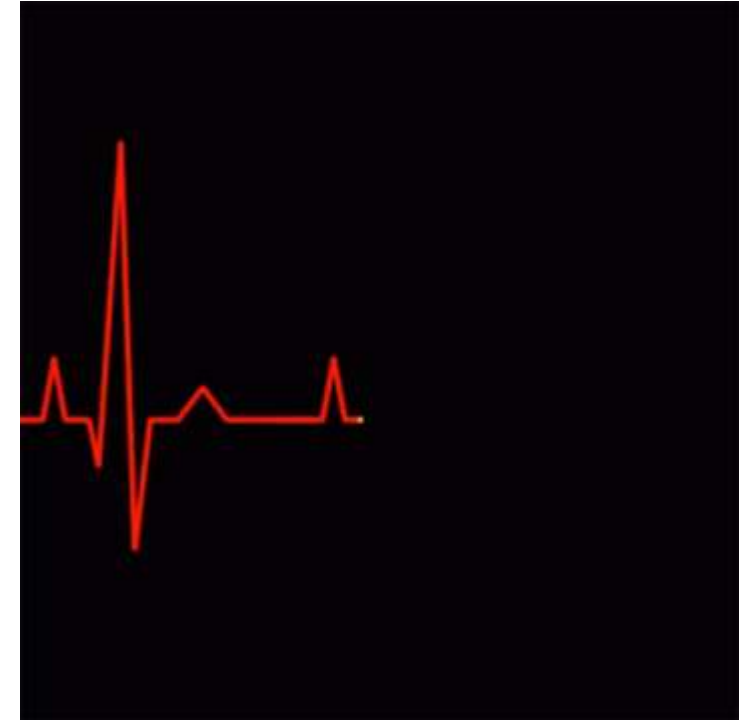


# Signal tempo detection

---

Using convolution

# What is tempo?



## **Tempo Markings** *(in beats per minute)*

40-60	Largo	very slow
60-70	Adagio	slow
70-90	Andante	walking pace
90-110	Moderato	medium
110-140	Allegro	fast
140-160	Vivace	very fast
160+	Presto	reeeeealy fast



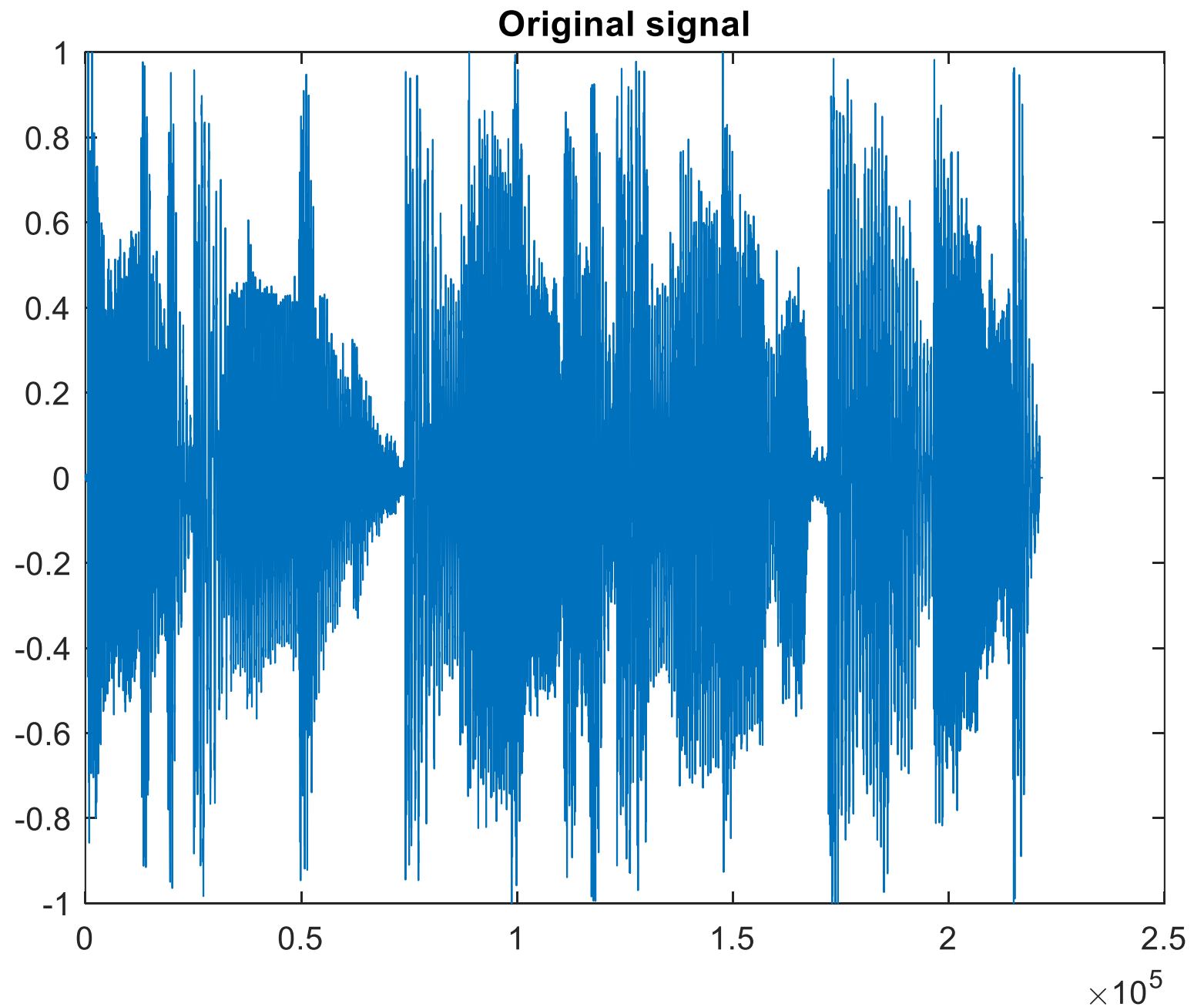
# Methods for tempo finding

- Neural networks
- ODF, PeDF, post-processing paradigm
- Onset detection function, Periodicity detection function
- ODF: Modeling human hearing, detecting sharp energy changes, spectral flux observation
- PeDF: comb filtering, autocorrelation
- Variations on the paradigm
- “Beat this: A beat synchronization project” *Kileen Cheng, Bobak Nazer, Jyoti Uppuluri, Ryan Verret, Rice University*

# “Beat this: A beat synchronization project”

1. Reading the signal
2. Bandpass filtering into 6 frequency bands
3. Full-wave rectification
4. Moving average filtering (Hanning window filtering)
5. Downsampling
6. Derivation
7. Half-wave rectification
8. Convolution
9. Processing the frequency band data

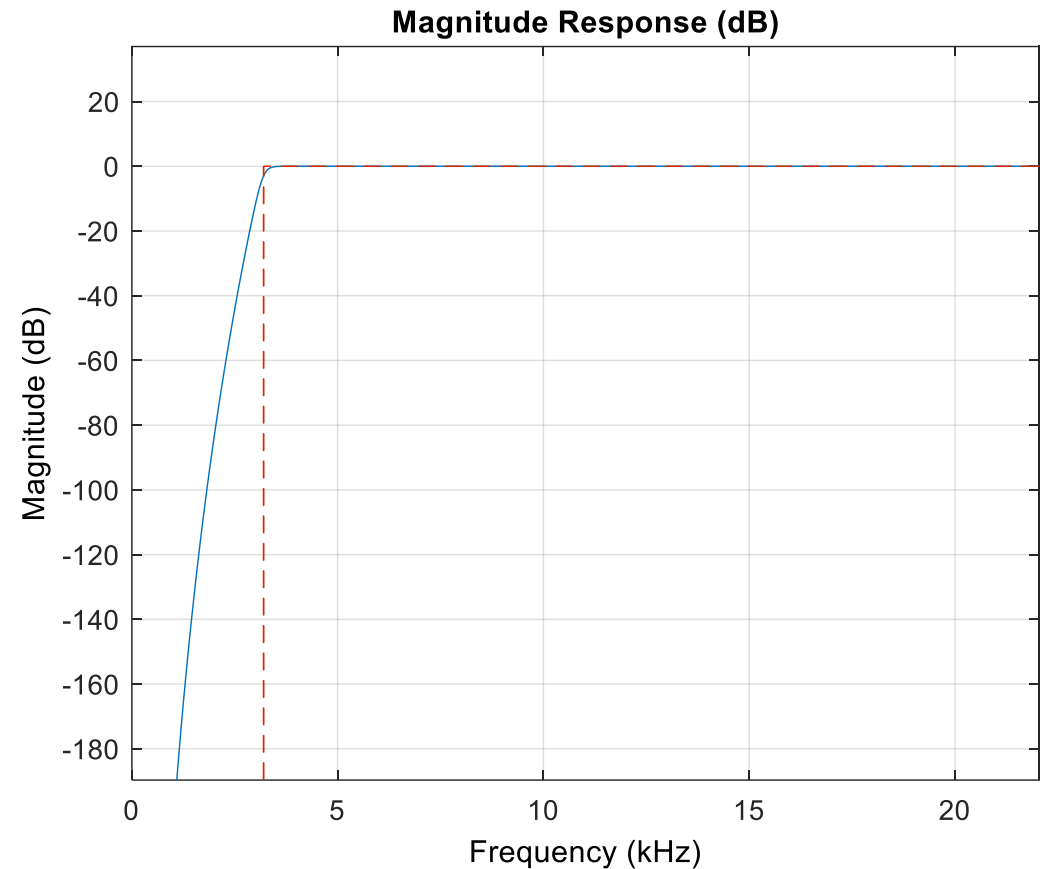
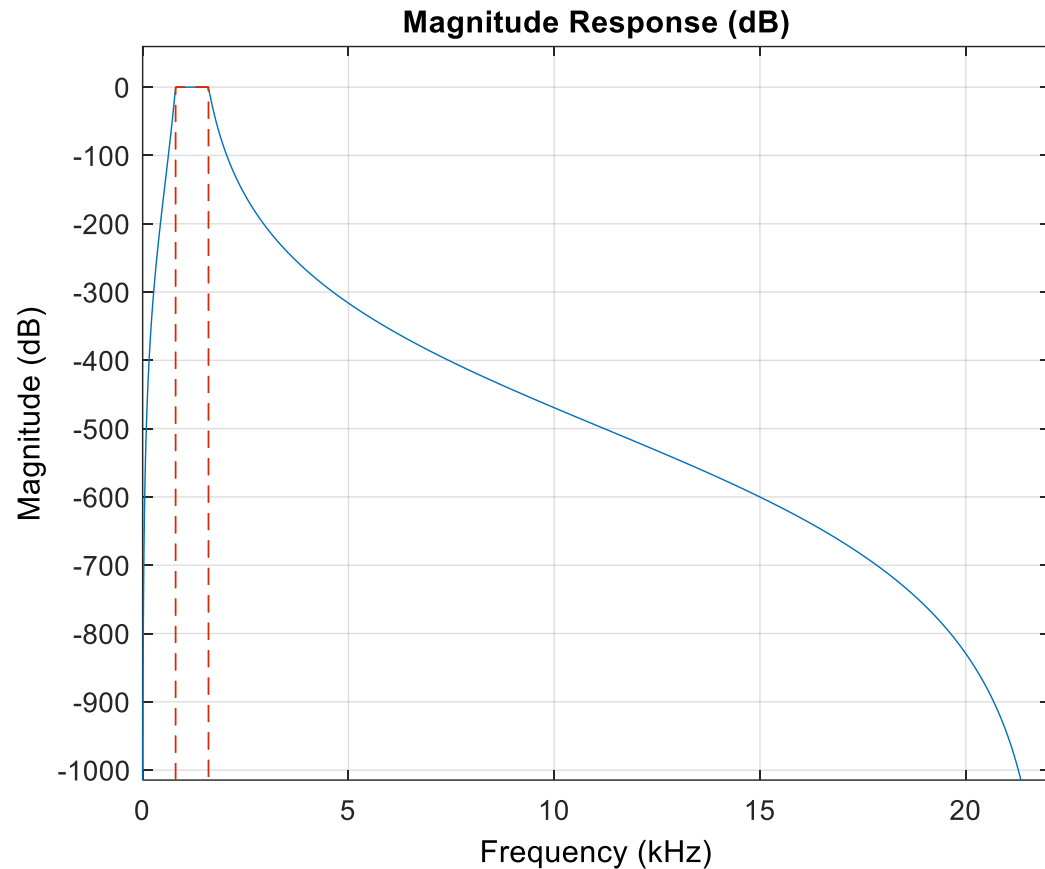
Raw  
signal  
data

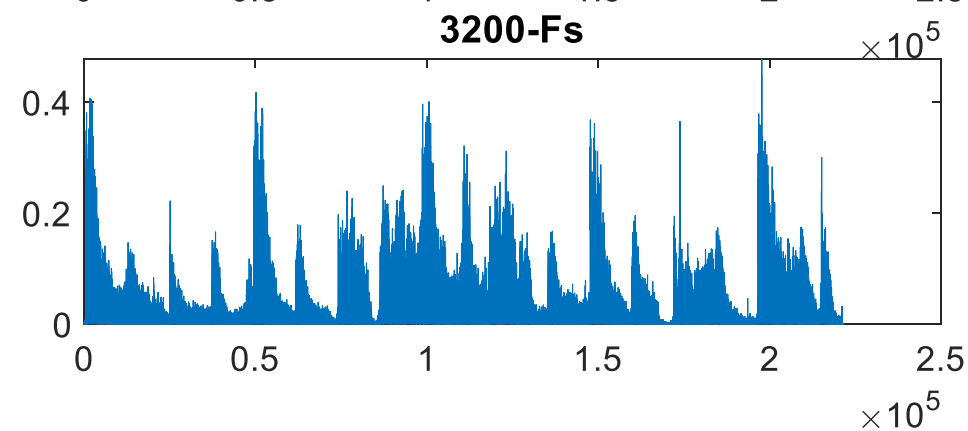
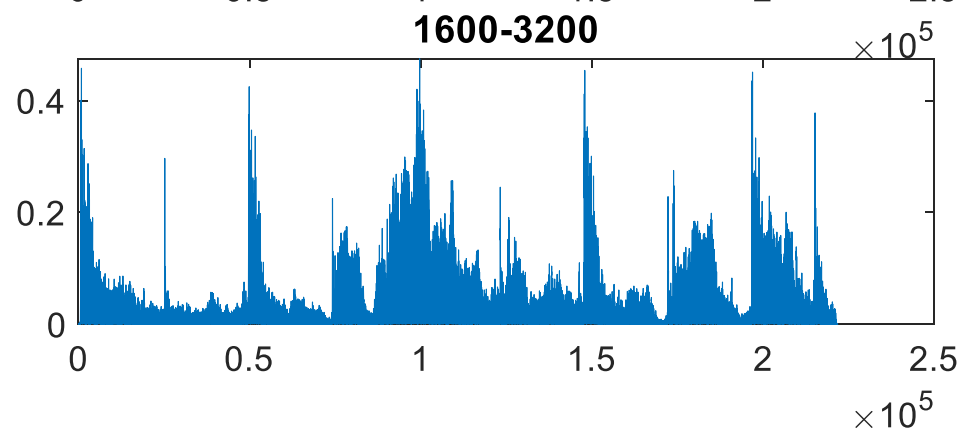
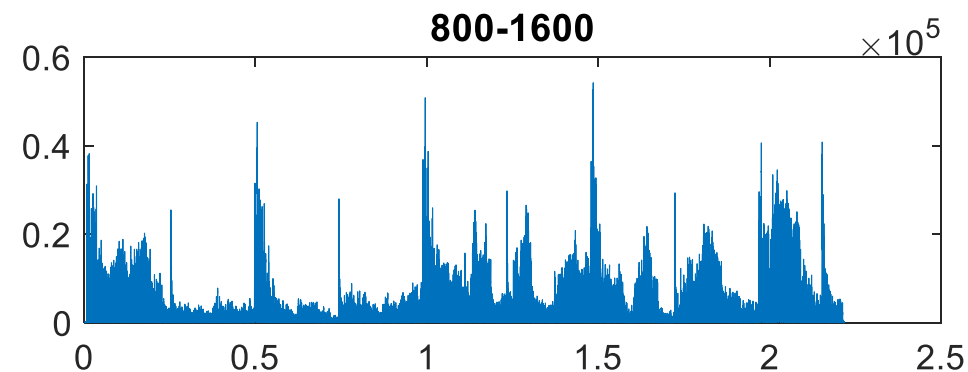
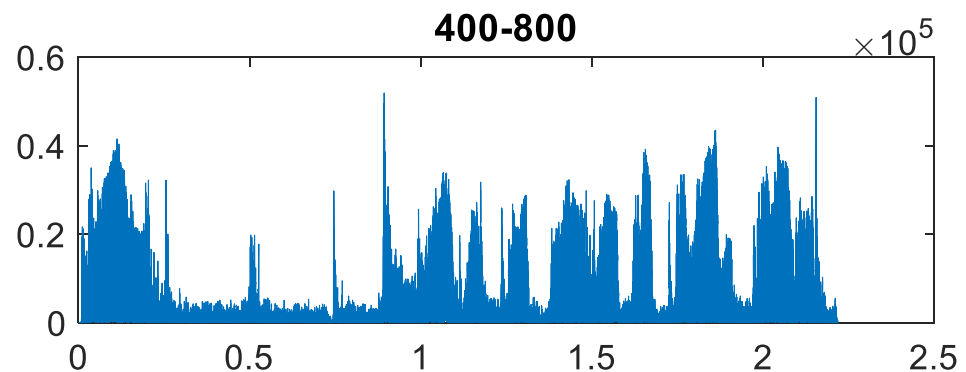
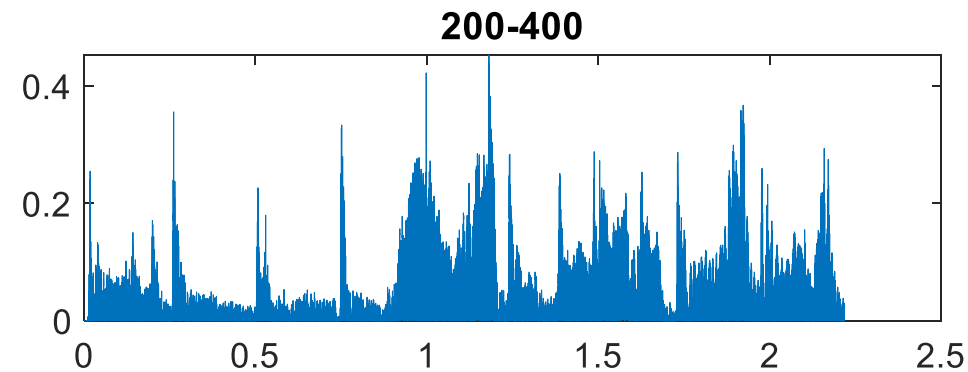
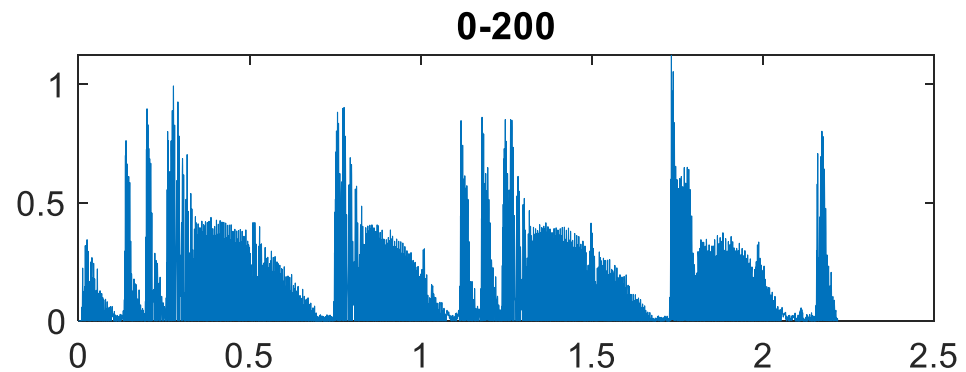


# Bandpass filtering

	Type	Half power frequency/ies [Hz]
<b>Filter 1</b>	Low pass IIR	200
<b>Filter 2</b>	Band pass IIR	200, 400
<b>Filter 3</b>	Band pass IIR	400, 800
<b>Filter 4</b>	Band pass IIR	800, 1600
<b>Filter 5</b>	Band pass IIR	1600, 3200
<b>Filter 6</b>	High pass	3200

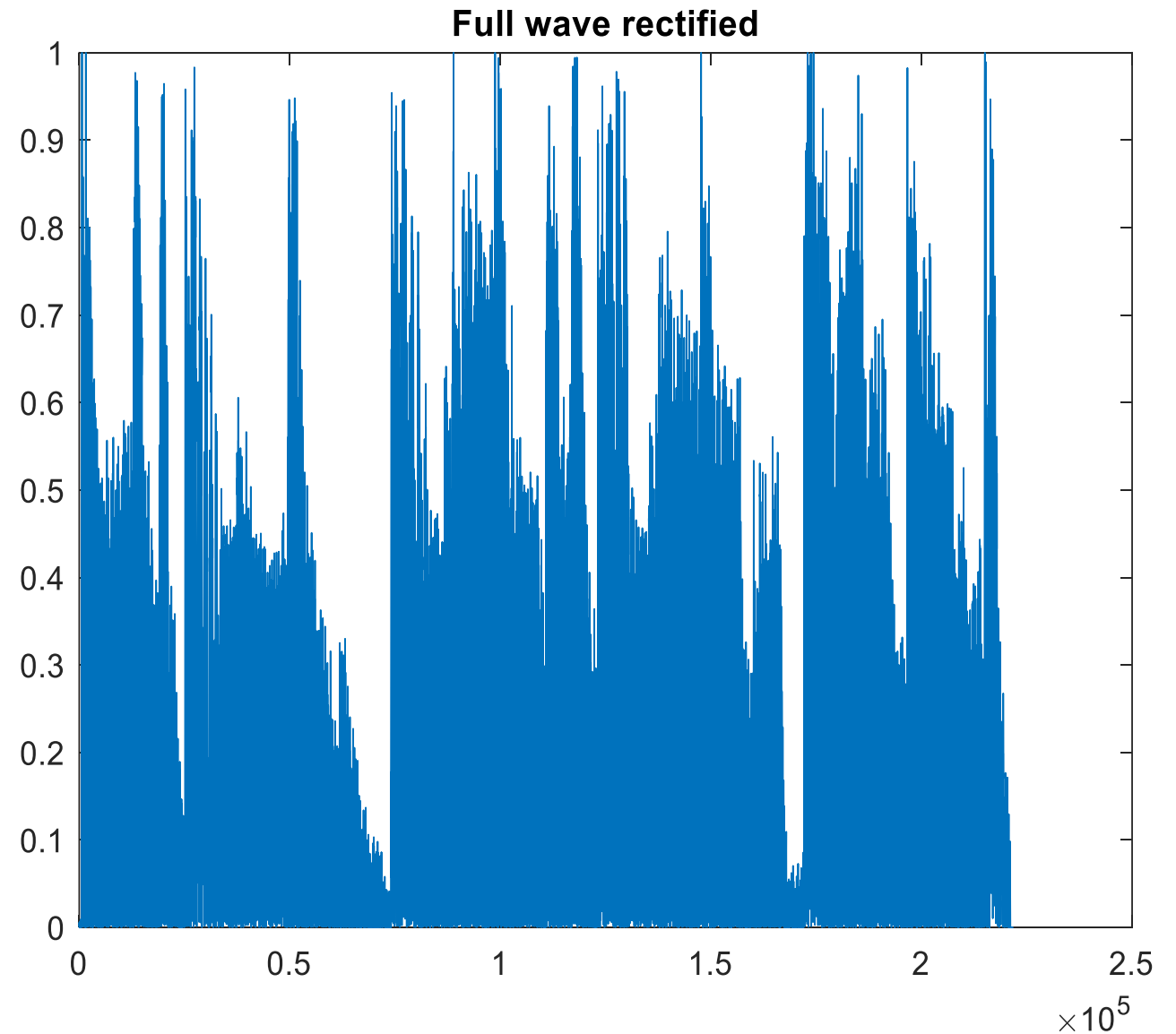
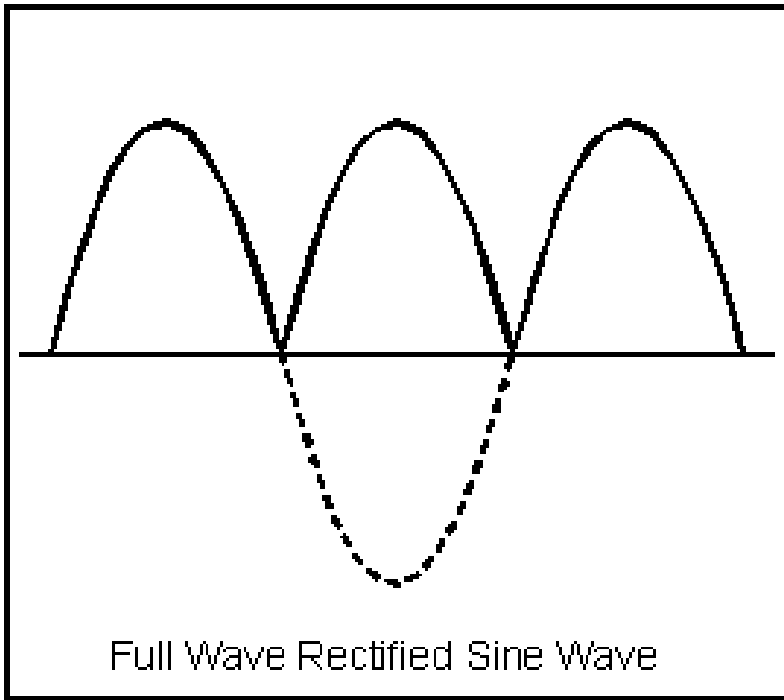
# Bandpass and high-pass filter



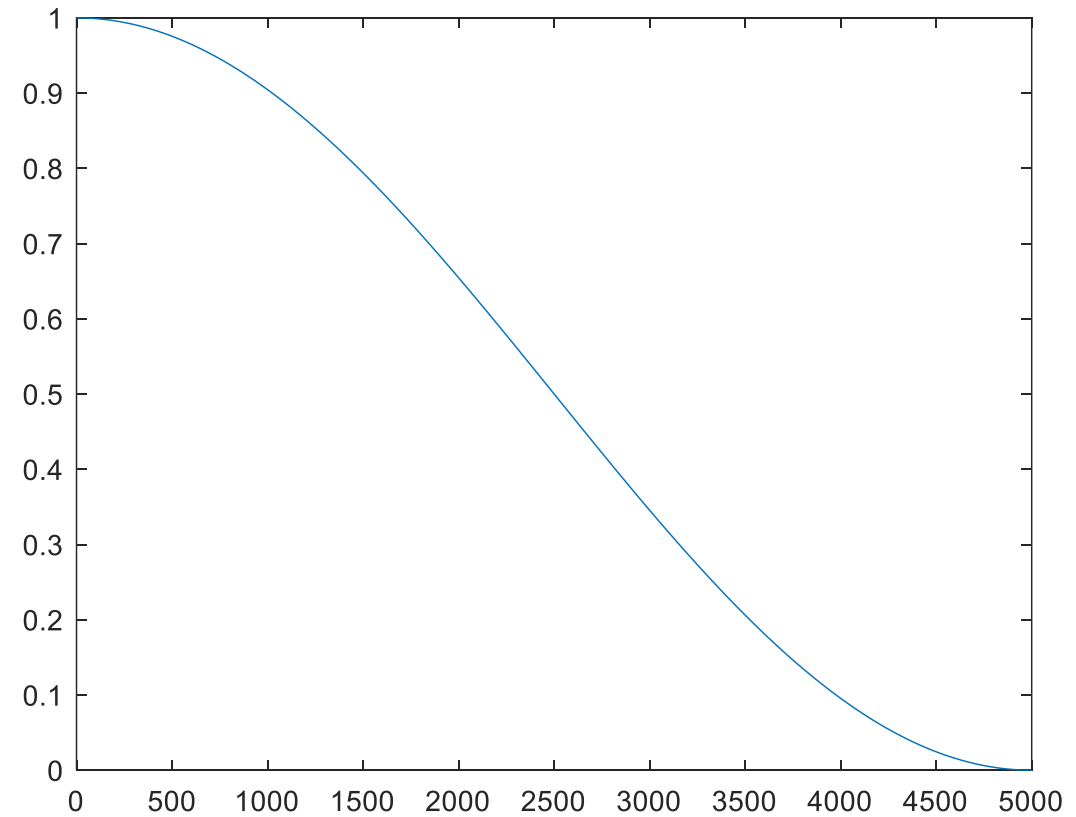
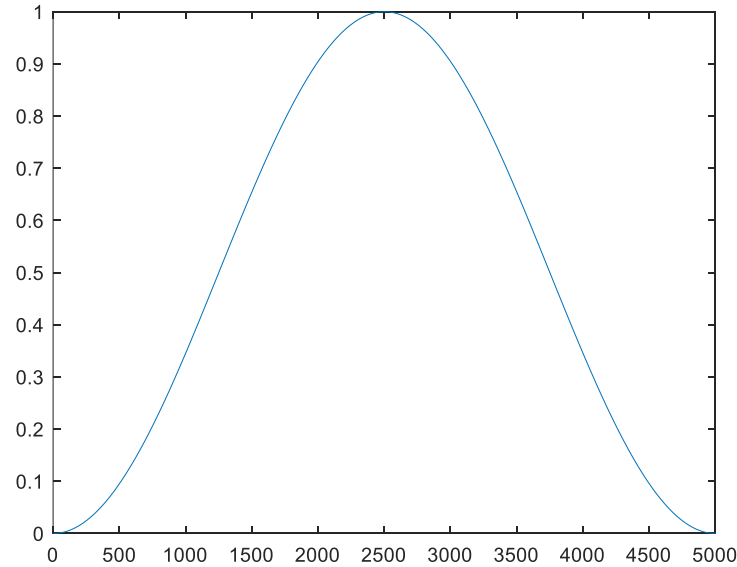
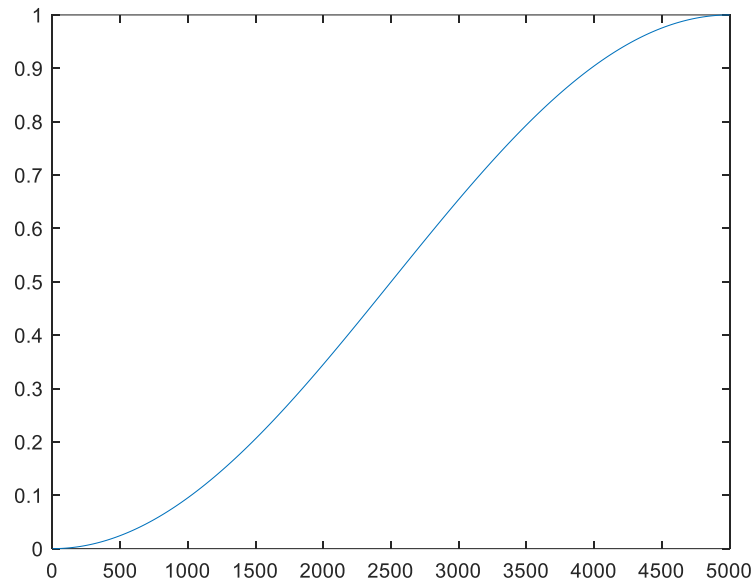




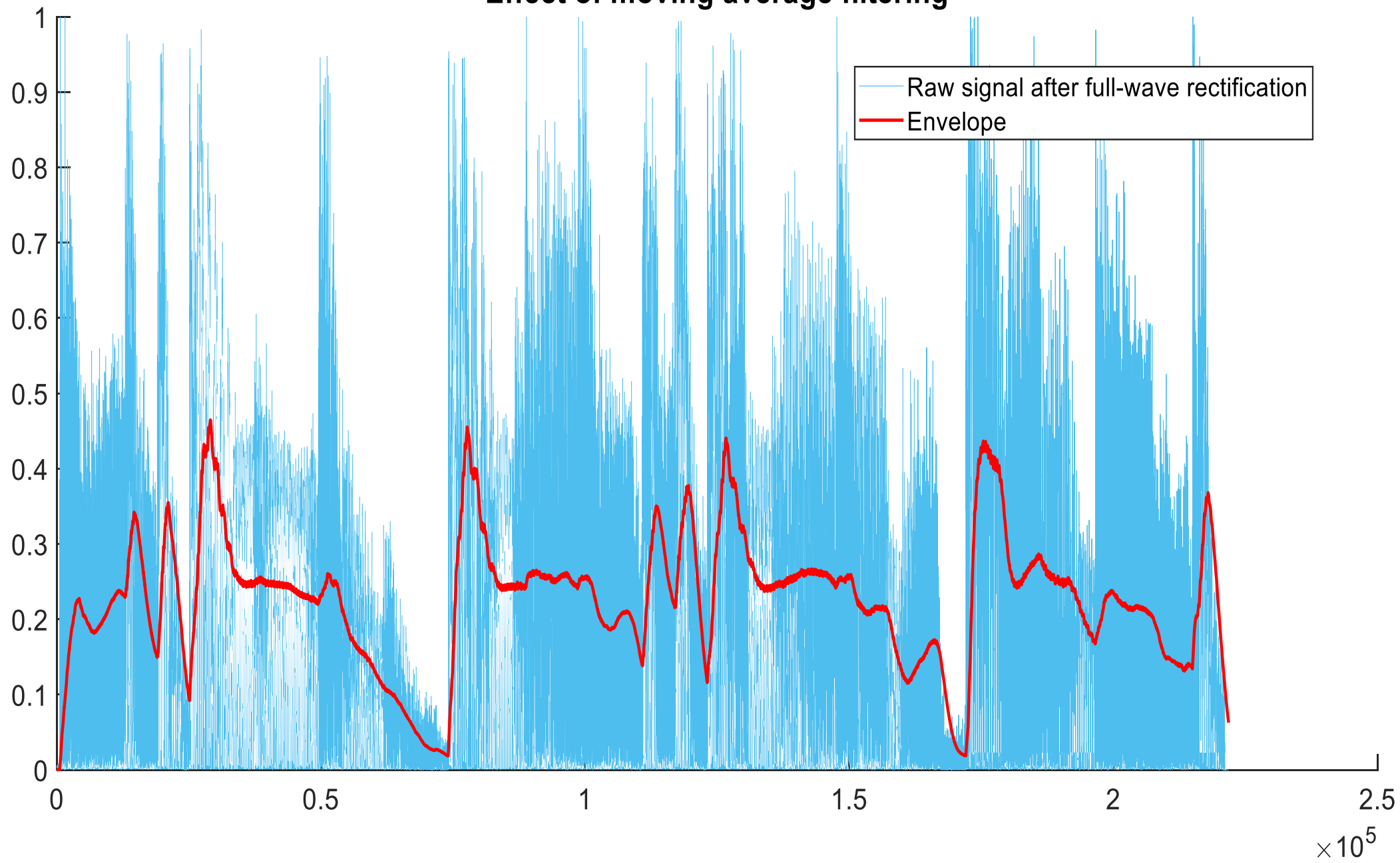
# Full wave rectification



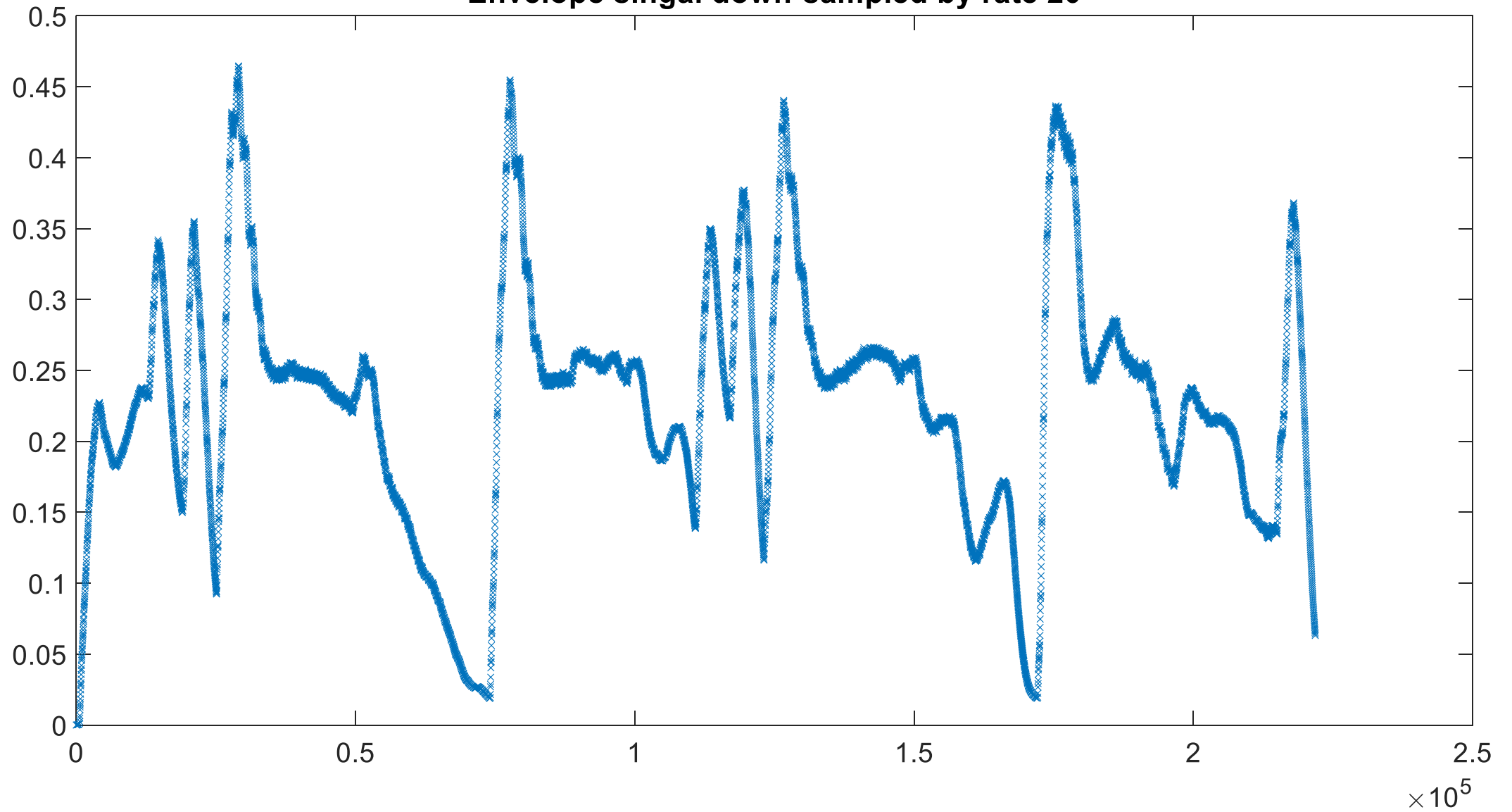
# Moving average filter



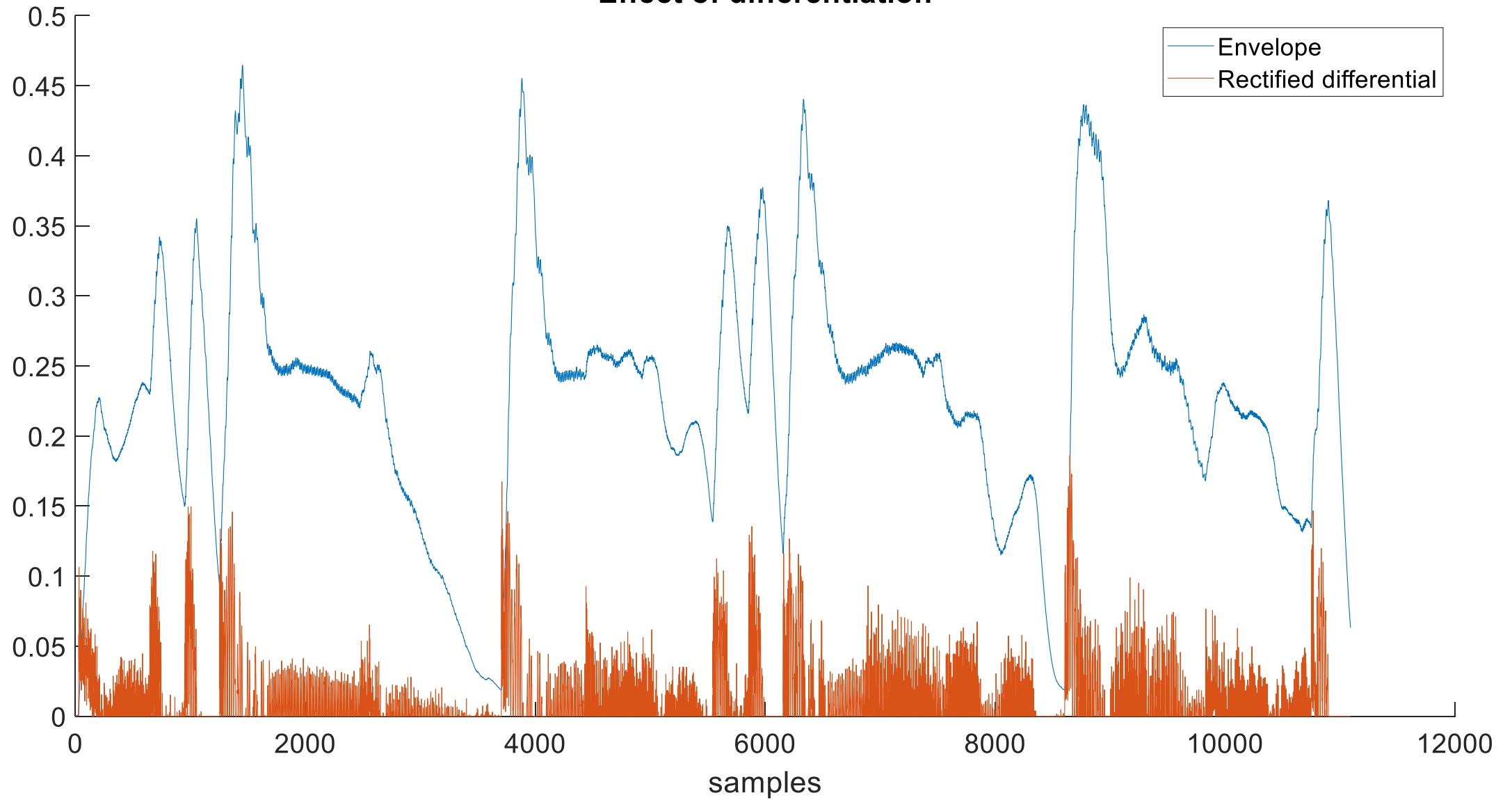
# Effect of moving average filtering

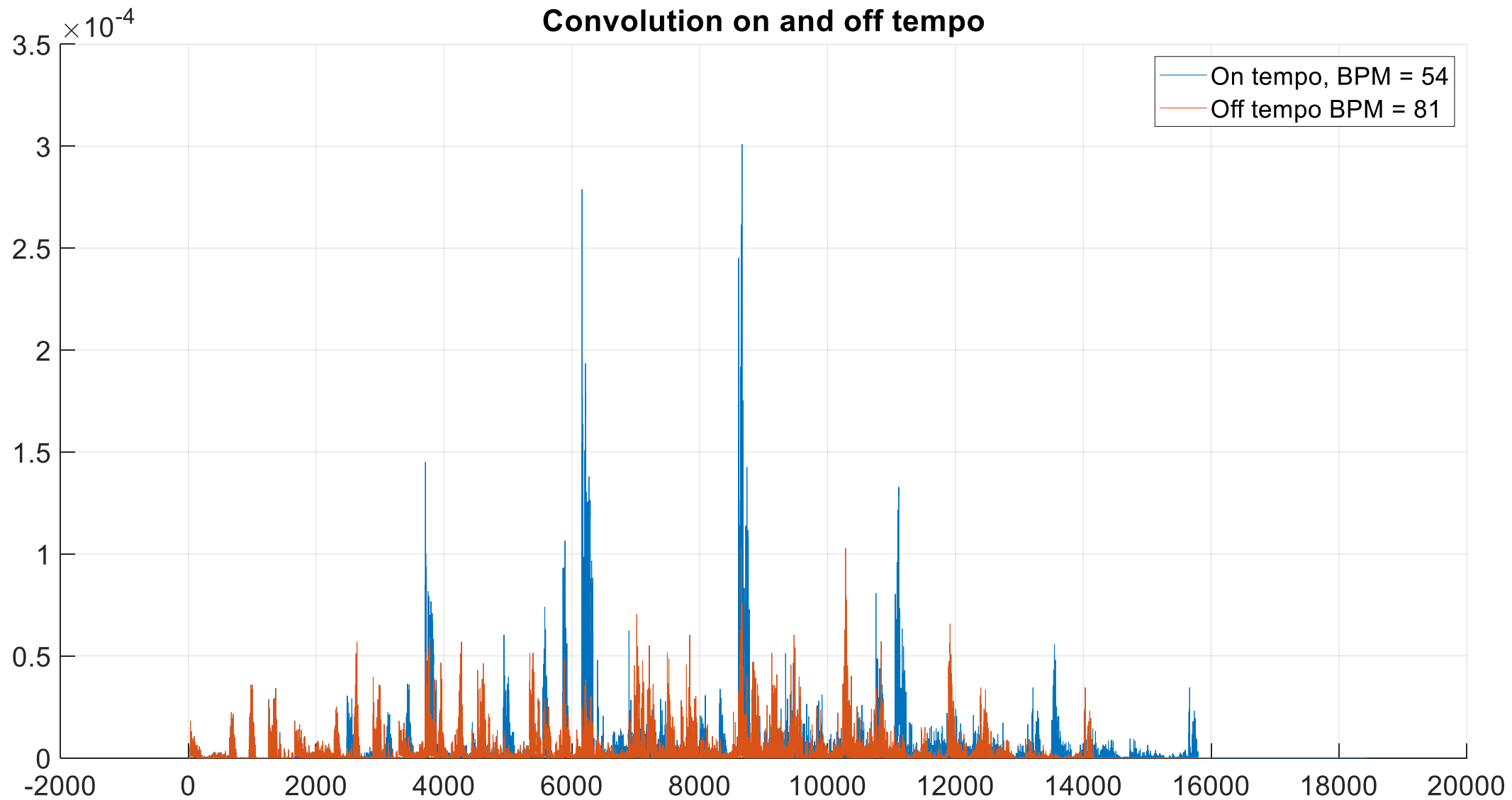


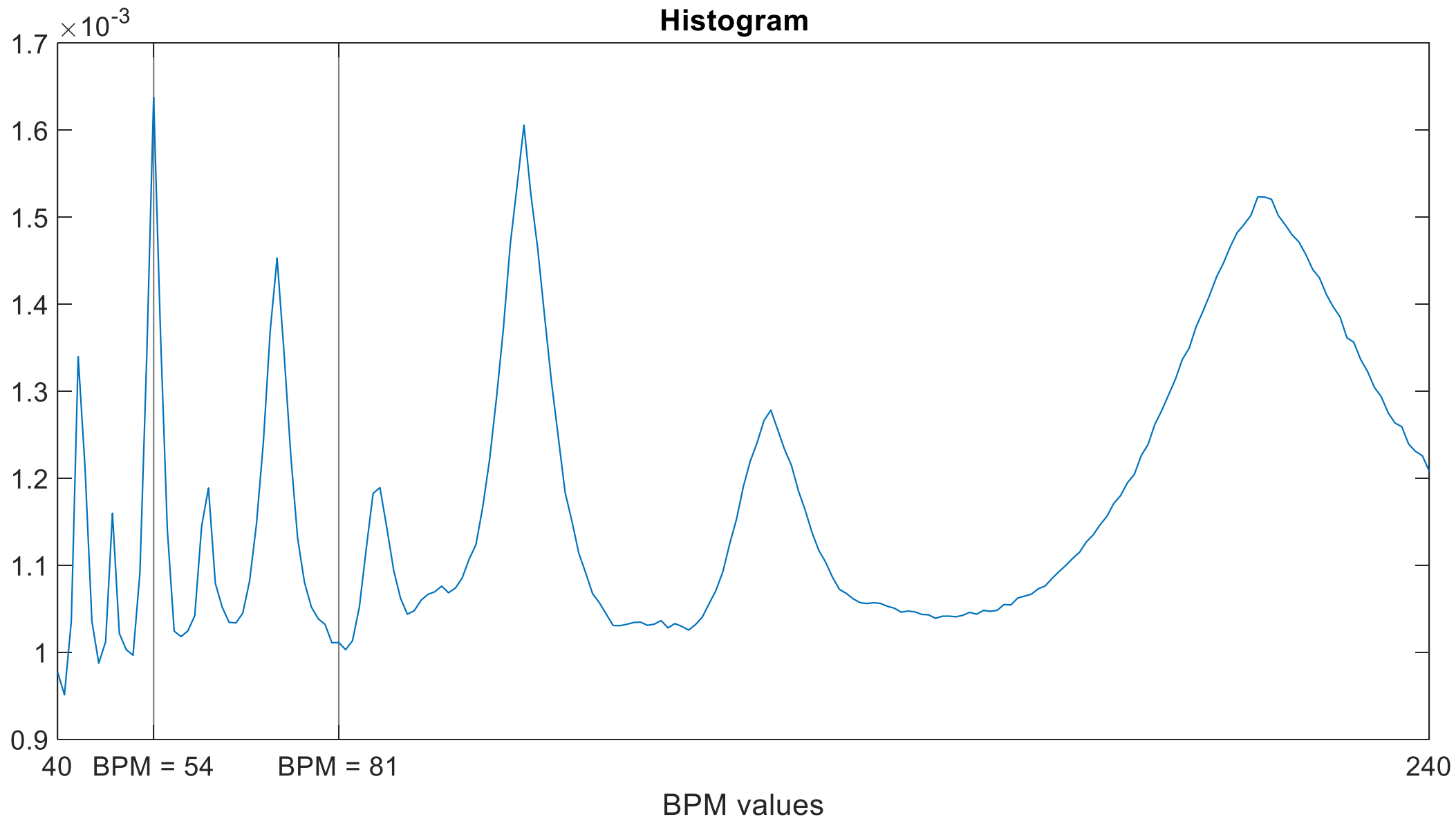
Envelope singal down-sampled by rate 20



## Effect of differentiation



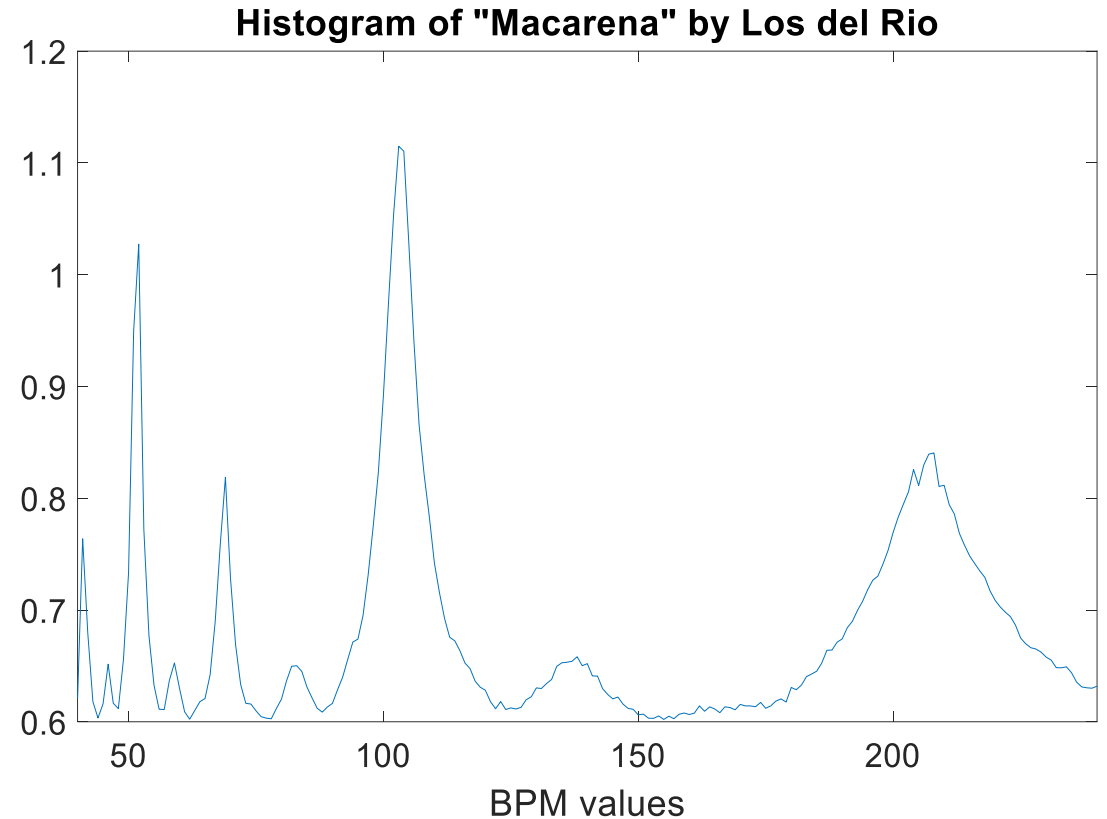




# Three methods of frequency band data processing

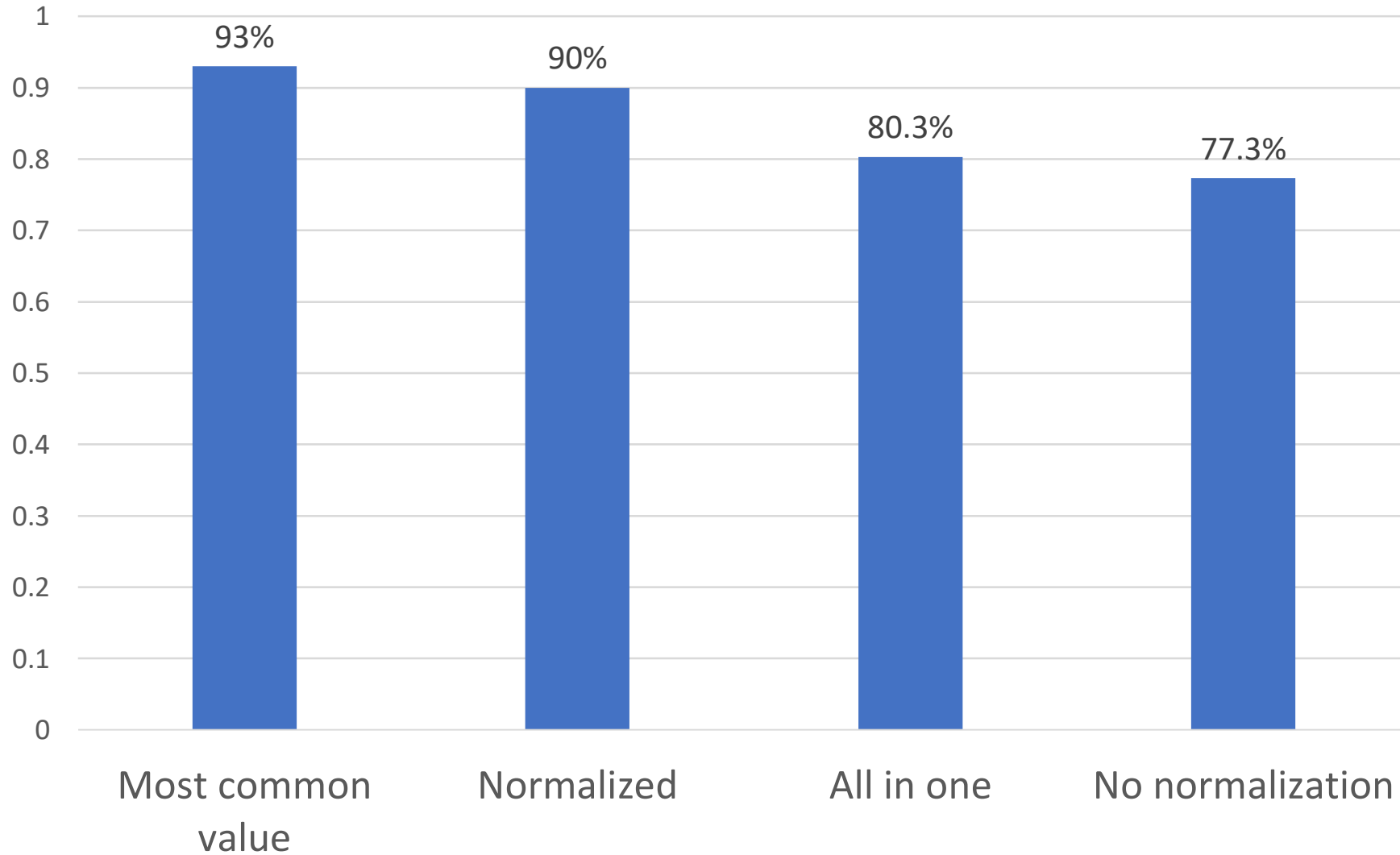
1. No normalization method
2. Normalized method
3. Most common value method

1. All in one method

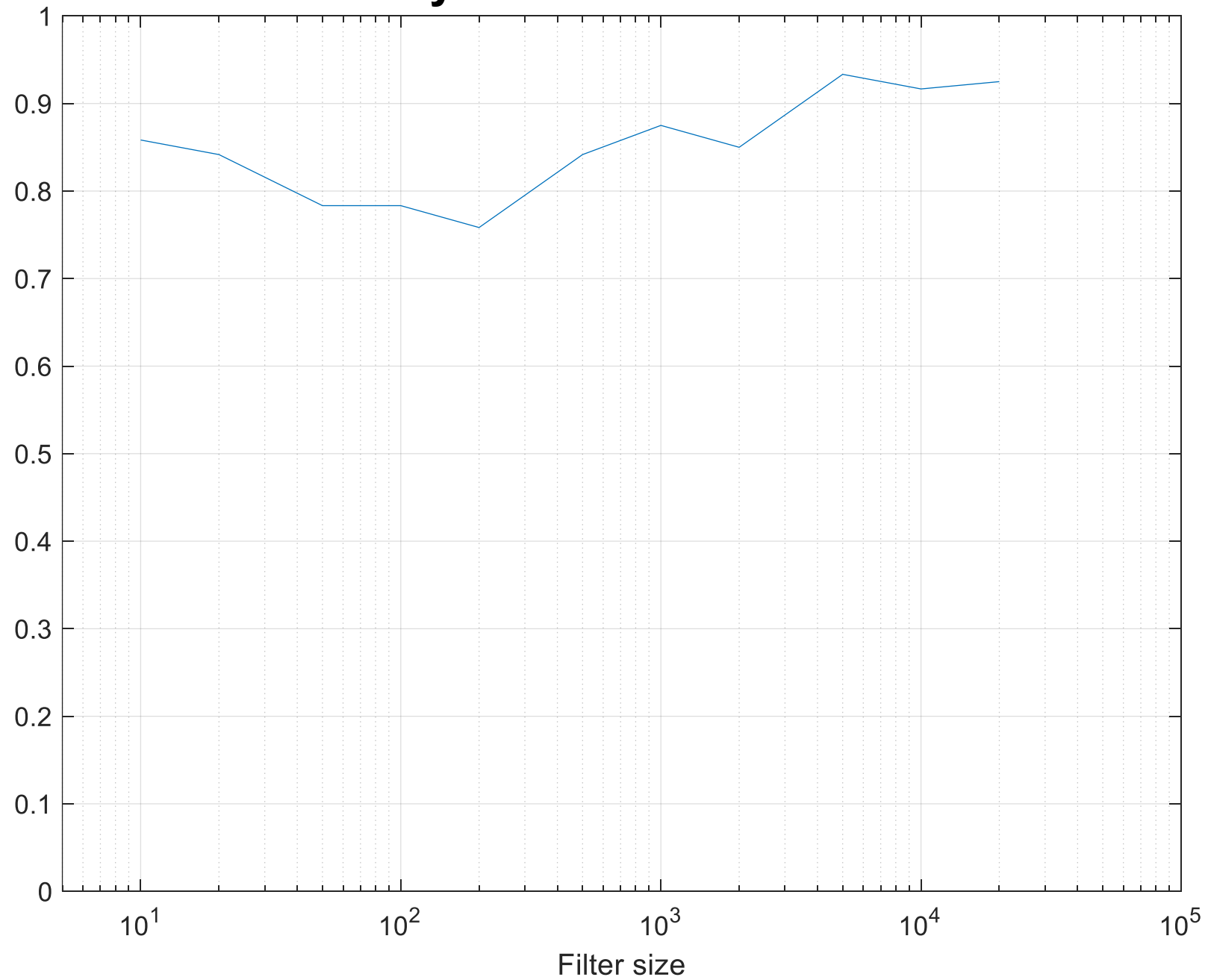




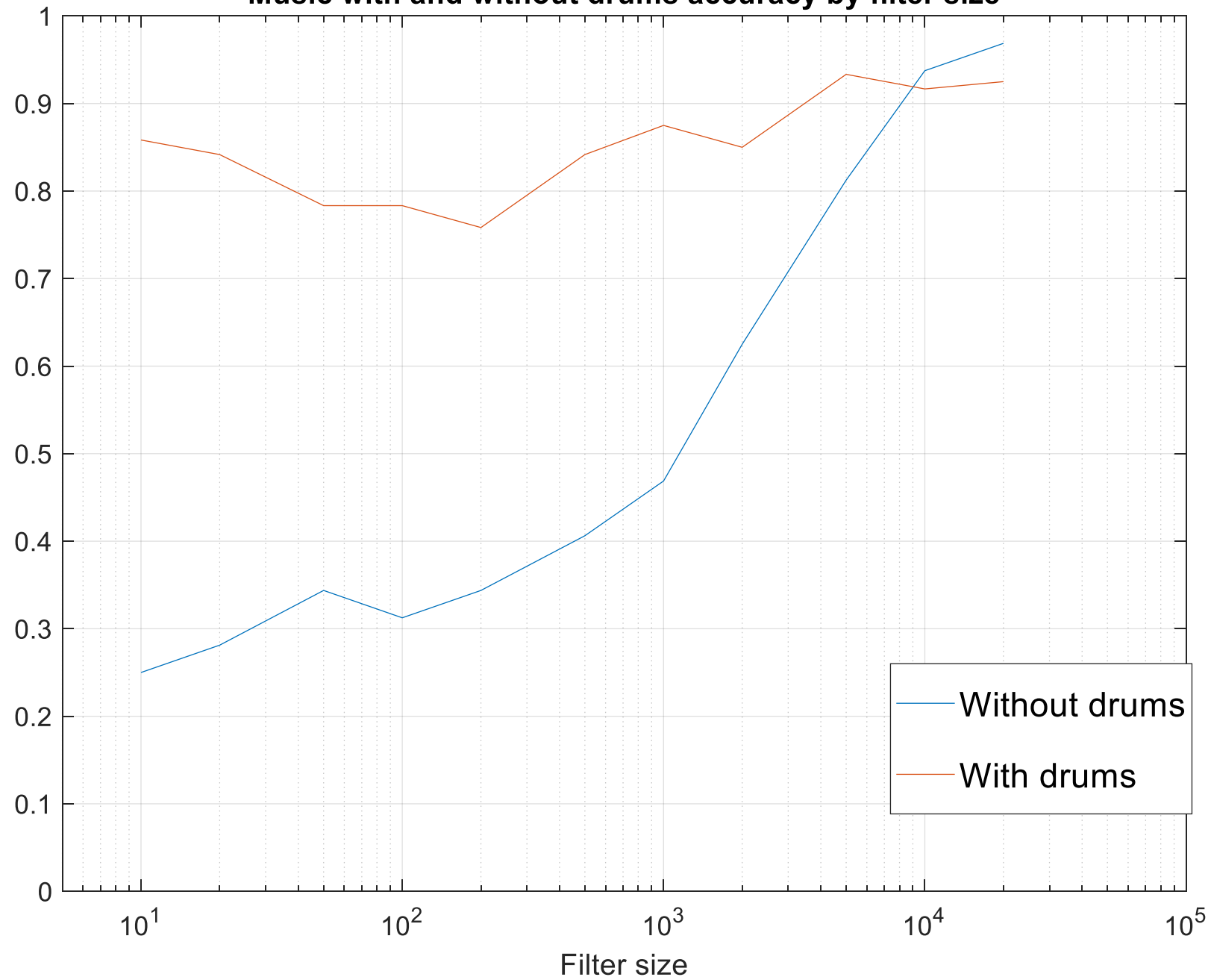
# Accuracy across histogram post-processing method



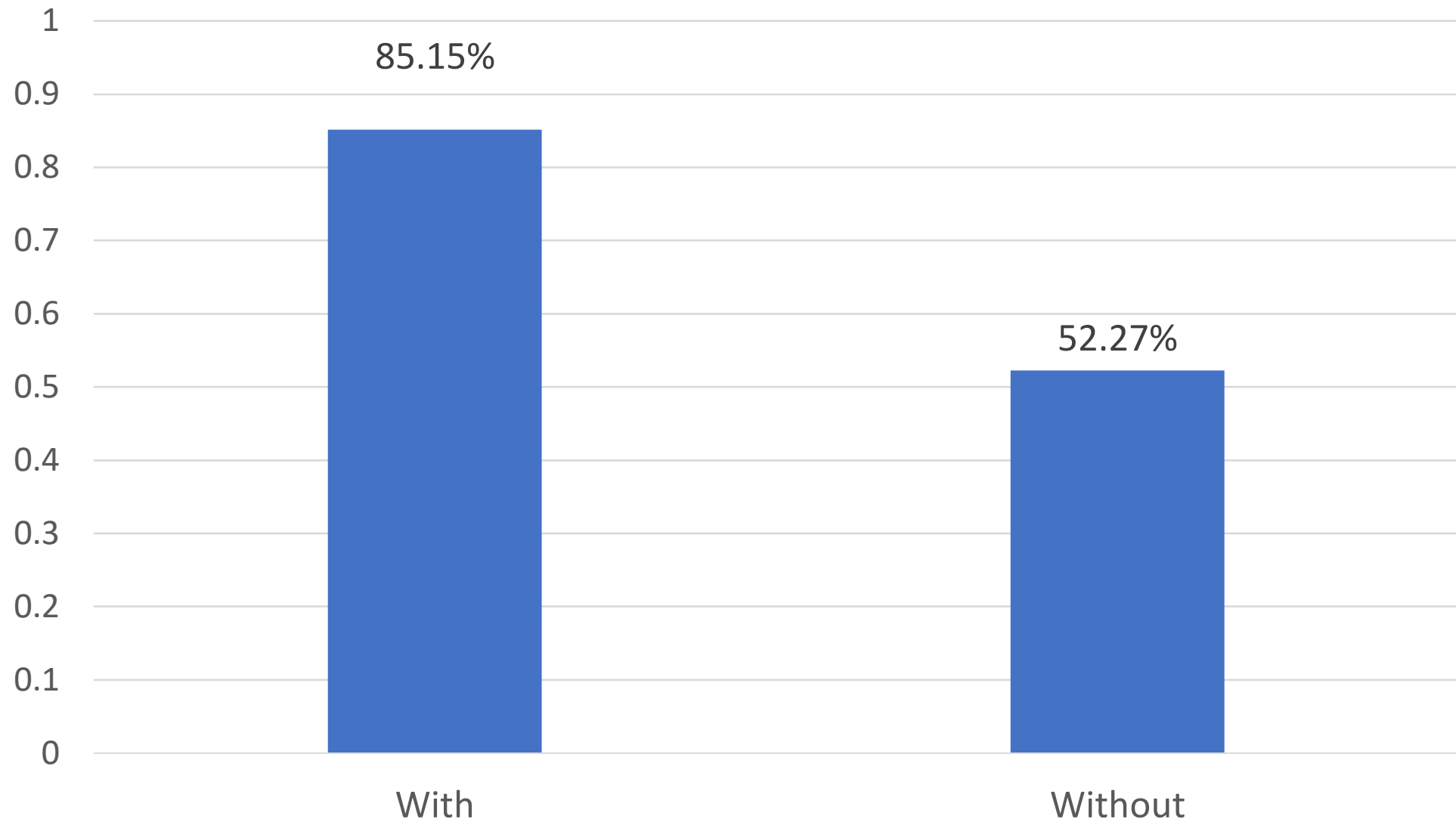
**Accuracy accross filter sizes in %**



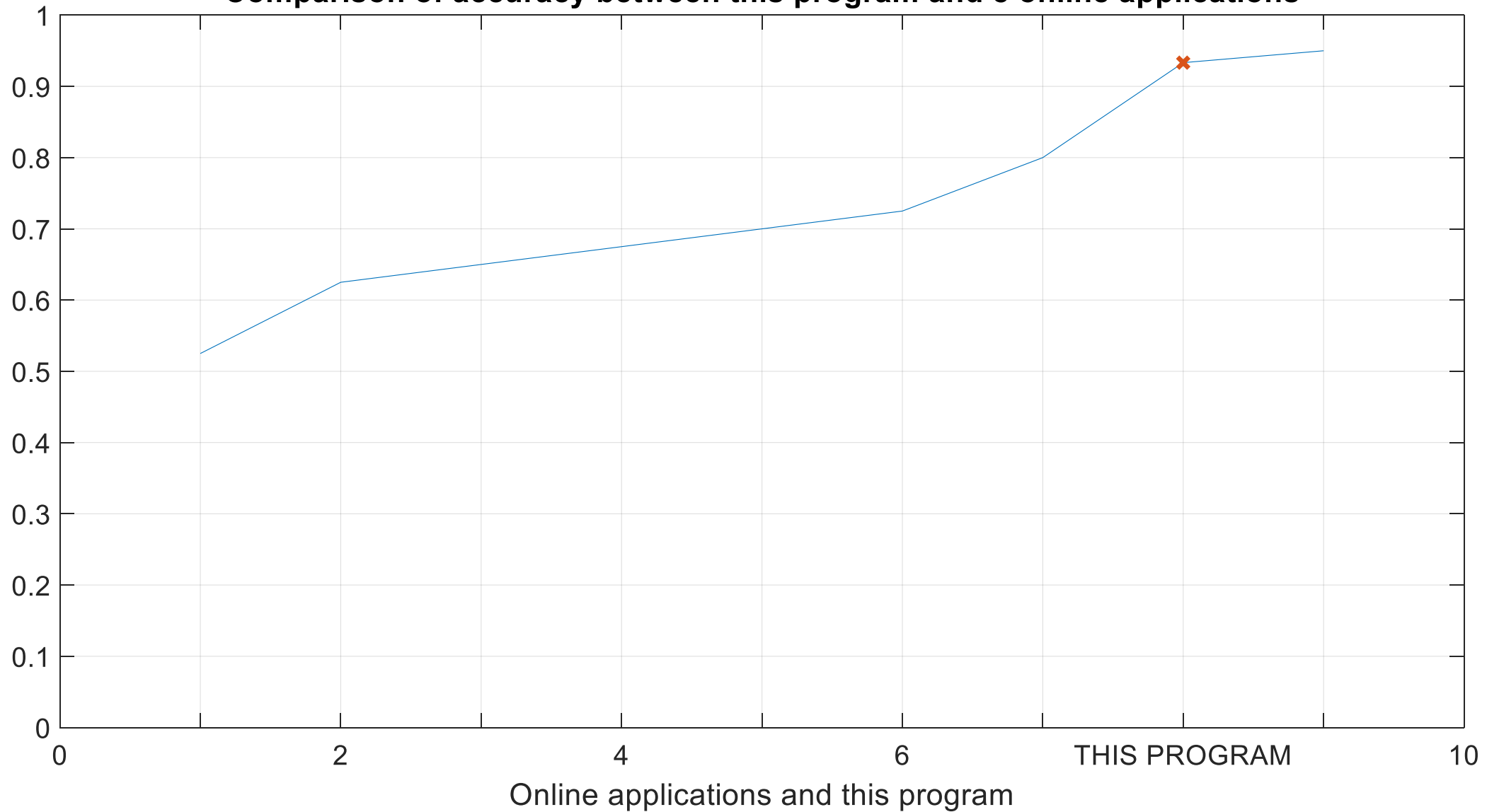
**Music with and without drums accuracy by filter size**



Overall accuracy depending on type of music



**Comparison of accuracy between this program and 8 online applications**



# Further improvements

- optimizing other parameters such as frequency band values
- time domain partition analogous to frequency domain partition
- implementation in hardware

Thank you for your attention!