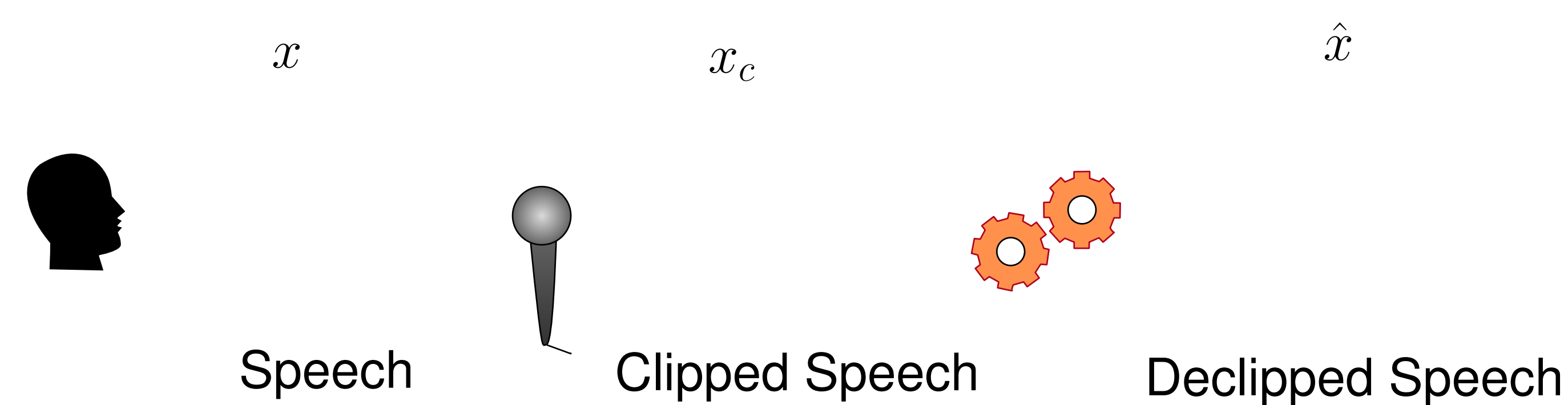


Declipping Speech Using Deep Filtering

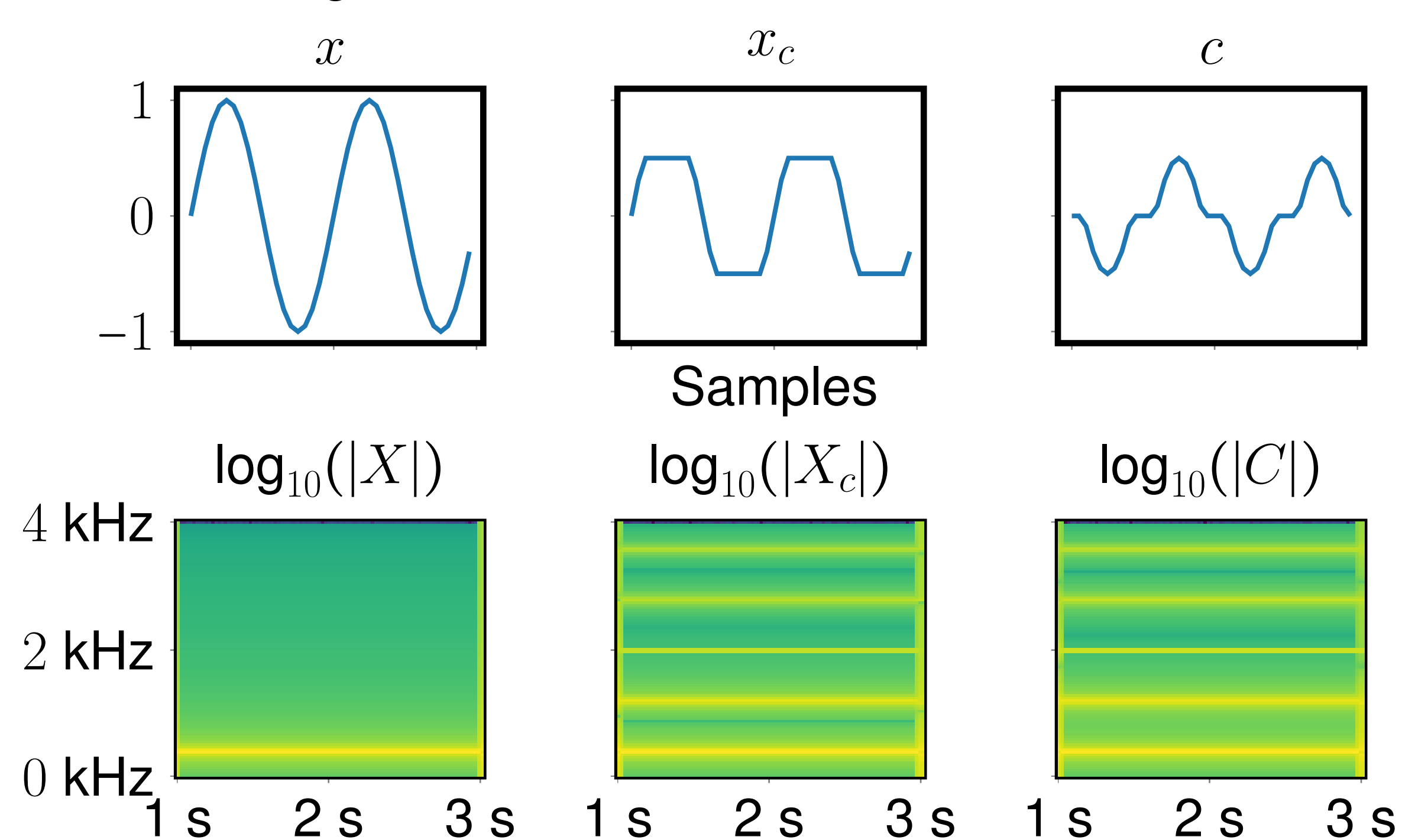
Wolfgang Mack, Emanuel A. P. Habets

1. Introduction



2. Problem Formulation

- Clipping reduces the overall energy.
- ... introduces higher-order harmonics.



- Declipping requires amplification of the fundamental frequency.
- ... attenuation of the harmonics introduced by clipping.
- We formulate declipping as an extraction problem,

$$X_c = X + C,$$

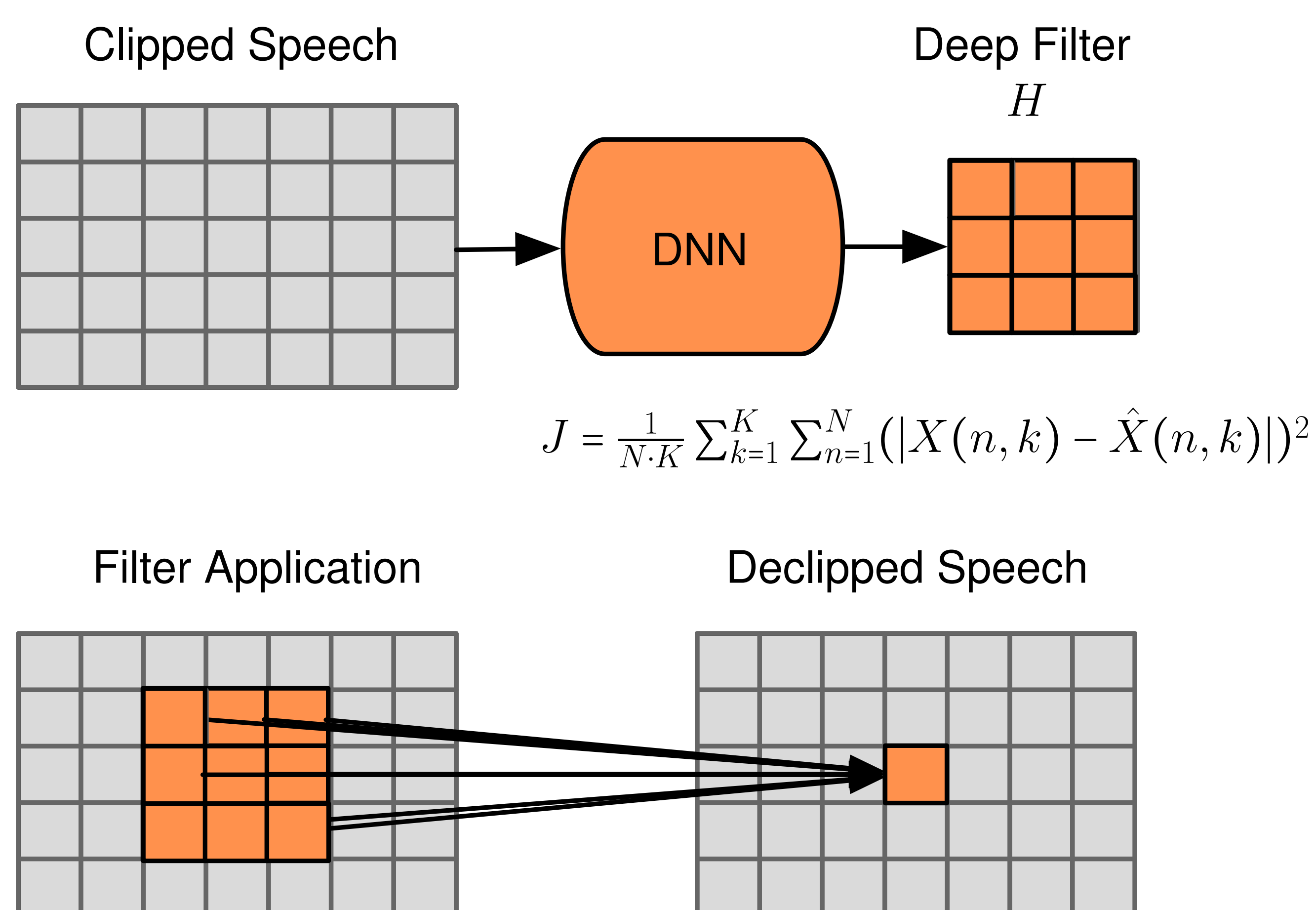
where X is to be extracted from X_c .

3. Proposed Method [1]

- The declipped speech estimate \hat{X} is obtained from X_c by

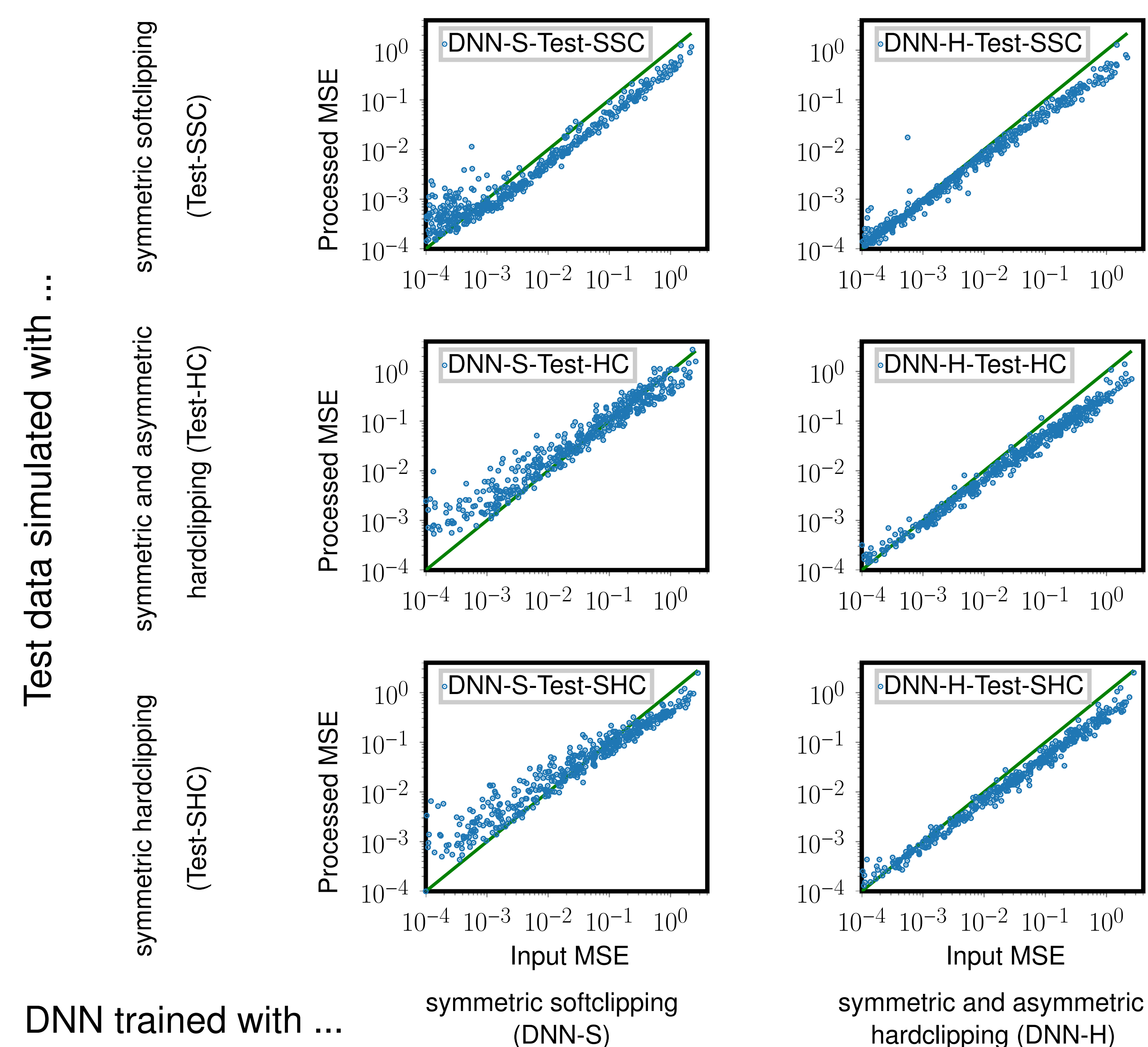
$$\hat{X}(n, k) = \sum_{i=-I}^I \sum_{l=-L}^L H_{n,k}^*(l + L, i + I) \cdot X_c(n - l, k - i),$$

where L and I define the filter spread in time and frequency.



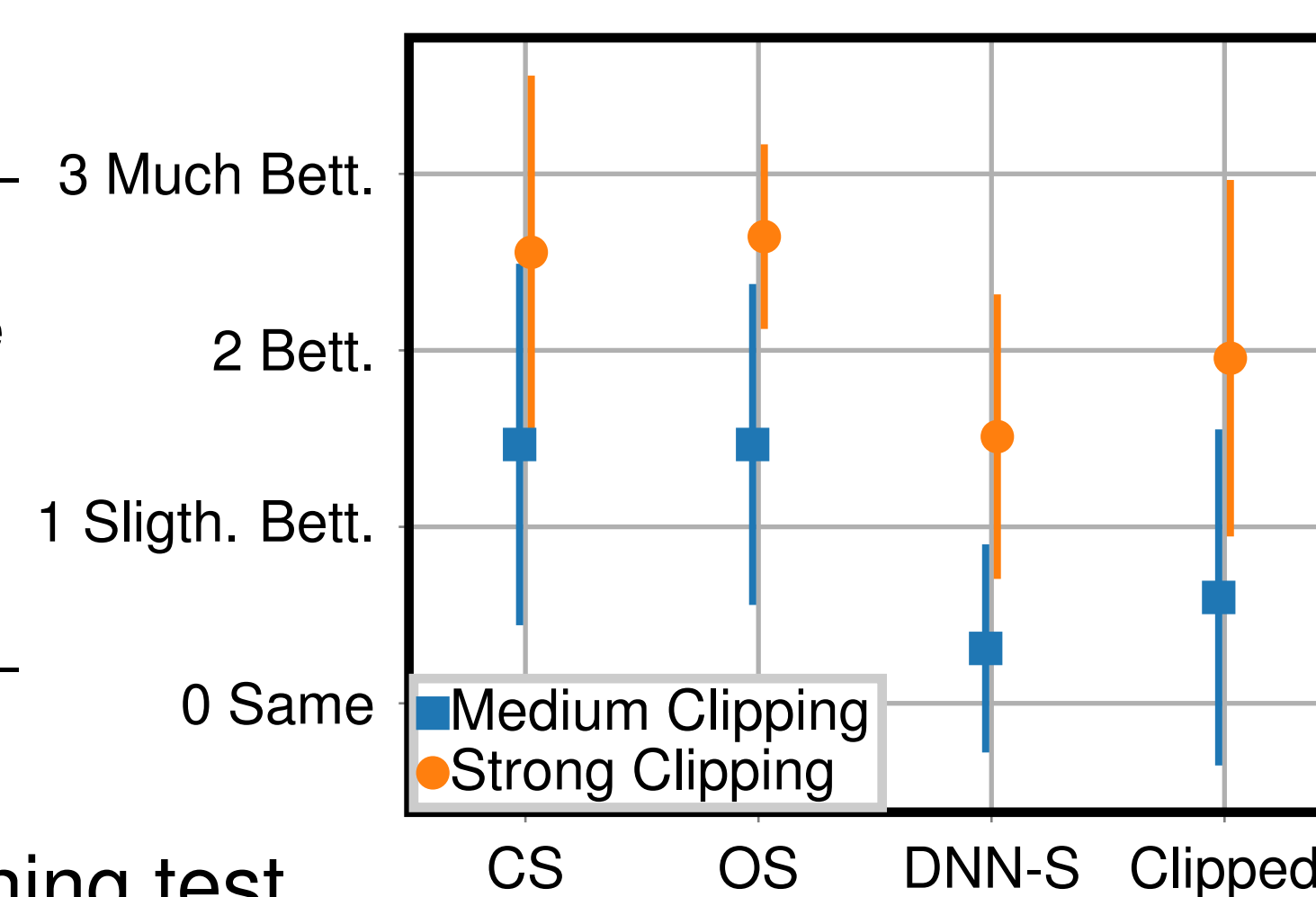
$$J = \frac{1}{N \cdot K} \sum_{k=1}^K \sum_{n=1}^N (|X(n, k) - \hat{X}(n, k)|)^2$$

4. Performance Evaluation - Simulated Clipped Speech



5. Performance Evaluation - Measured Clipped Speech

	Medium Clipping		Strong Clipping	
	p (%)	Effect size	p (%)	Effect size
OS	3.3	.50	0.2	.65
CS	0.4	.61	0.2	.64
DNN-S	6.5	.45	0.3	.63
Clipped	4.9	.47	0.3	.63



- DNN-H is compared to all other Methods with a preference listening test using five seconds long measured clipped speech from 2 males and 1 female.
- The evaluation is performed using a Wilcoxon signed-rank test (15 participants).

6. Conclusions

Artificial and real clipped speech can be declipped with a multi-dimensional complex STFT filter (deep filter), which is applied to the clipped speech STFT. The deep filter is obtained by a DNN optimized to minimize the reconstruction MSE.

Audio examples are available on <https://www.audiolabs-erlangen.de/resources/2019-WASPAA-Declipping>

[1] W. Mack and E. A. P. Habets, Deep filtering: Signal extraction using complex time-frequency filters, <https://arxiv.org/abs/1904.08369>, Apr. 19.

