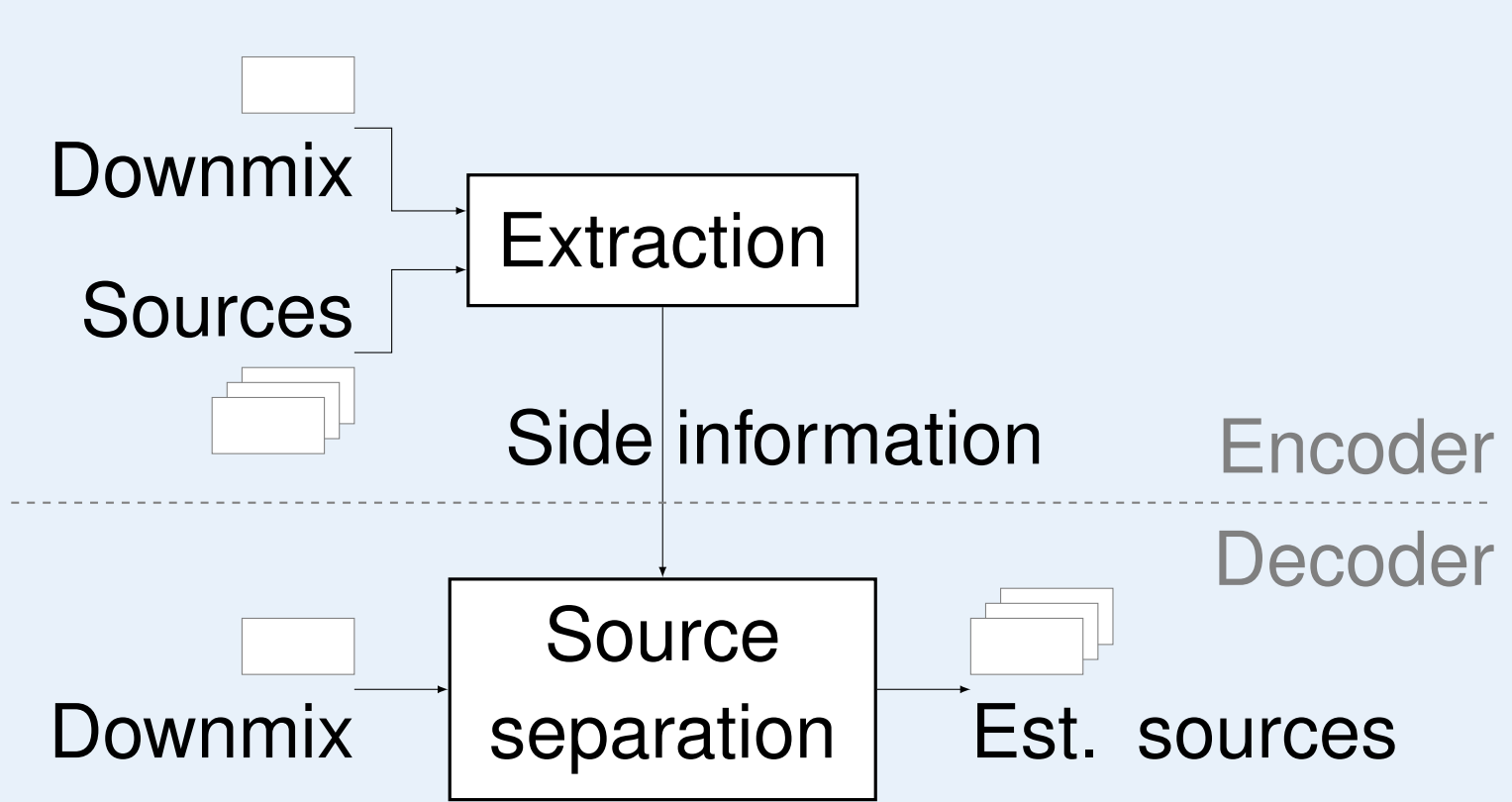


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Introduction



Audio upmixing

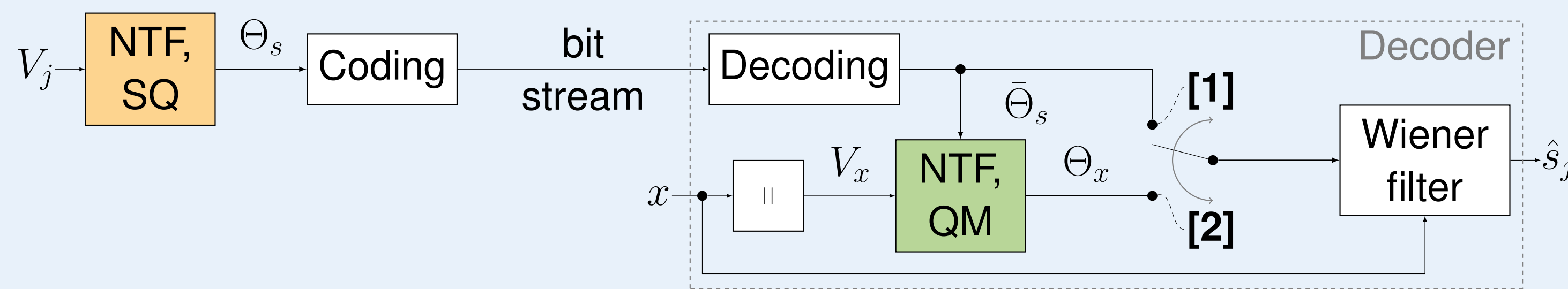
- aims at generating a multichannel signal based on a downmix
- is research topic in both audio coding and audio source separation communities
- enables numerous applications, such as adaptive rendering on loudspeakers arrays, karaoke or active listening.

Parametric Audio Upmixing

Parametric audio upmixing consists of two steps:

- **Encoder:** Sources and downmix perfectly known. Prior work [1], [2] use
 - Nonnegative Tensor Factorization on source spectrogram V_j which computes parameters Θ_s
 - *subsequent* scalar quantization of parameters $\bar{\Theta}_s$.
- **Decoder:** Only downmix x available.
 - [1]: Sources are estimated with Wiener-filtering given downmix and $\bar{\Theta}_s$.
 - [2]: Additional NTF with mix spectrogram V_x as observation. Resulting parameters Θ_x used for Wiener-filtering. Initialization of NTF with $\bar{\Theta}_s$.

Here: Consider quantization of parameters already in design of their (re-)estimation strategy.



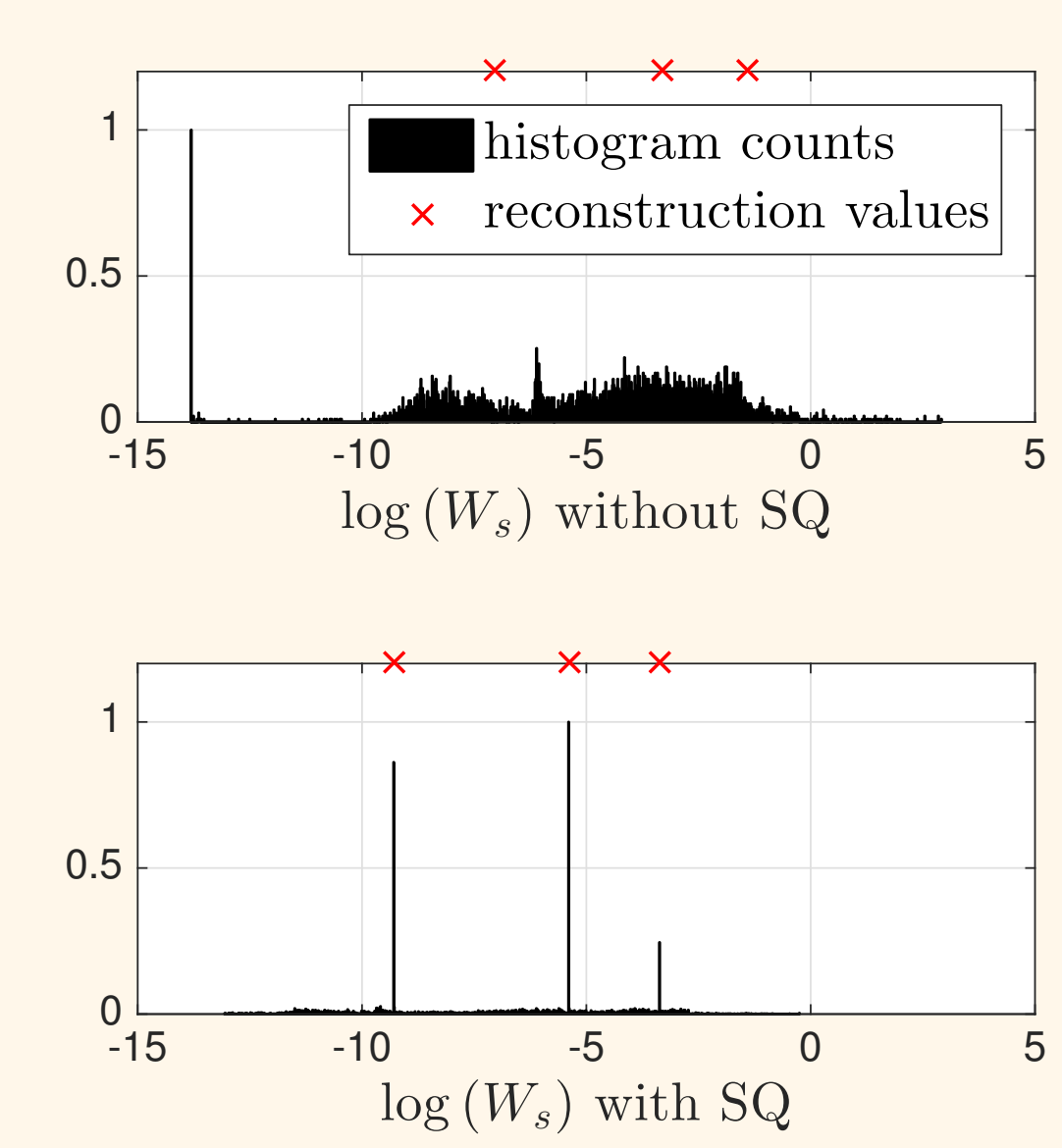
Self-quantization at Encoder

[1], [2]: NTF on sources and quantization of resulting parameters as two *independent* steps.

Self-quantization NTF:
Combination of signal approximation and quantization of parameters at run time.

$$\min d_\beta(V_j | \Theta_s) + \gamma_{sq} [d_\beta(\bar{W}_s | W_s) + d_\beta(\bar{H}_s | H_s)]$$

with $\bar{W}_s \triangleq \exp(q(\log W_s))$, $\bar{H}_s \triangleq \exp(q(\log H_s))$
Quantization $q(x)$ with Lloyd's algorithm.



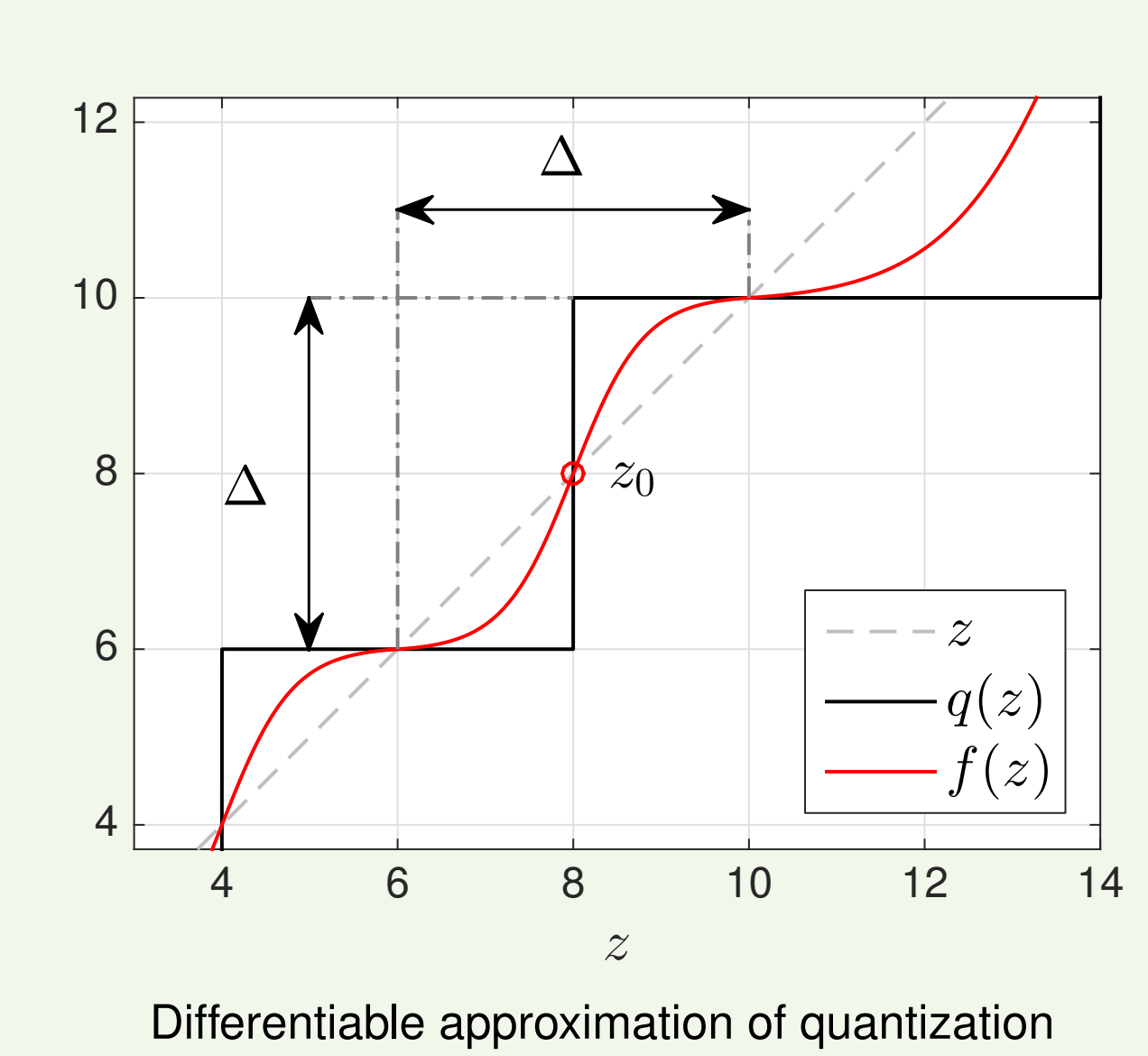
Quantized-matching at Decoder

[2]: Decoder NTF is initialized with (coarsely) quantized $\bar{\Theta}_s$. Θ_x may deviate from target $\bar{\Theta}_s$ too much.

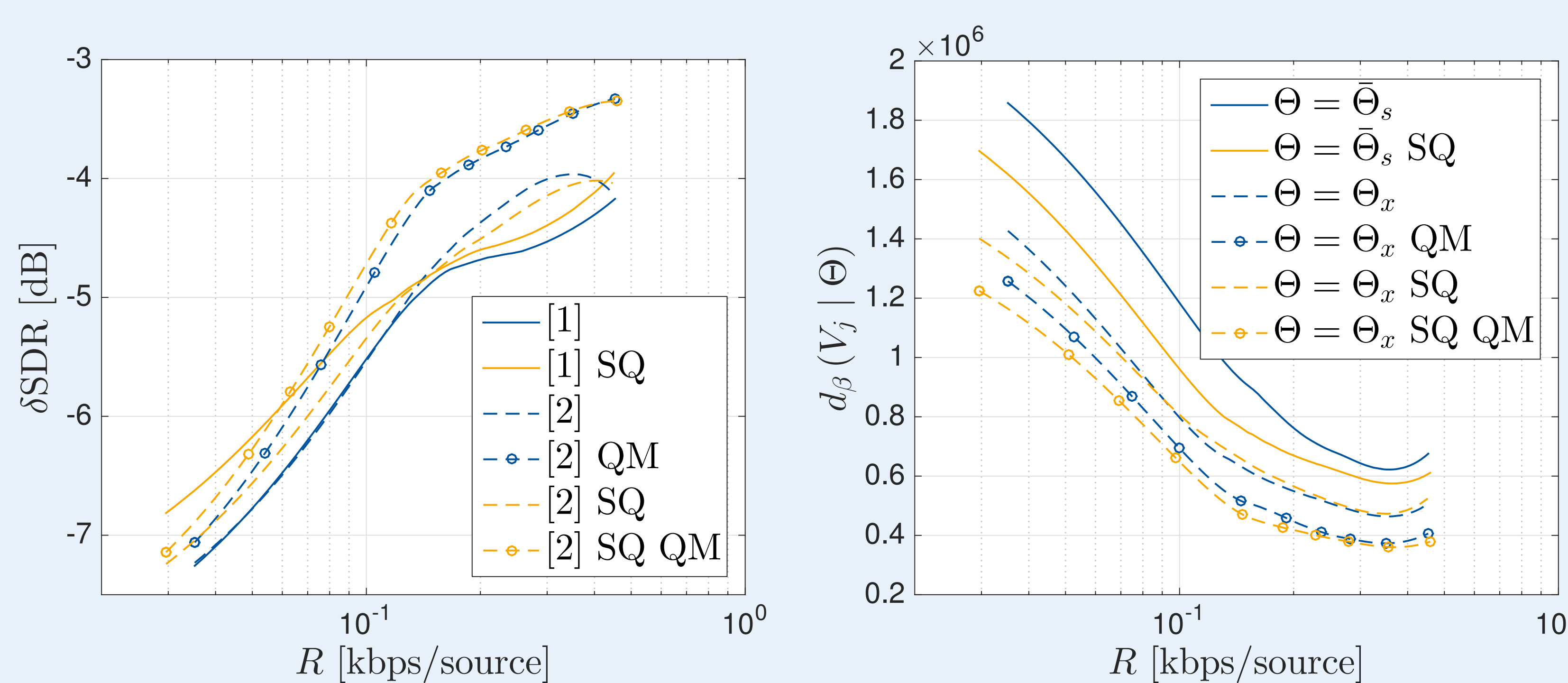
Quantized-matching NTF:
Estimate sources parameters from mix only, constraining them to have same quantization as transmitted values $\bar{\Theta}_s$.
Quantized version of Θ_x shall match $\bar{\Theta}_s$ as much as possible.

$$\min d_\beta(V_x | \Theta_x) + \gamma_{qm} [d_\beta(\bar{W}_x | \tilde{W}_x) + d_\beta(\bar{H}_x | \tilde{H}_x)]$$

with $\tilde{W}_x \triangleq \exp(f(\log W_x))$, $\tilde{H}_x \triangleq \exp(f(\log H_x))$



Experiments



Setup:
Ten mixtures (4 to 7 sources, taken from QUASI database [3]). NTF minimizes Kullback-Leibler divergence ($\beta = 1$) with number of components per source $\in \{1, 2, \dots, 10\}$ and weights $\gamma_{sq}, \gamma_{qm} \in \{10^{-1}, 1, 10, 10^2\}$.

Results:

- Self-quantizing constraint (SQ) leads simultaneously to good signal approximation and parameter quantization.
- SQ not limited to audio upmixing and may be useful whenever NTF is used for signal compression.
- Quantized-matching constraint (QM) prevents deviations from the source NTF parameters in the quantization domain.

[1] A. Liutkus, J. Pintel, R. Badeau, L. Girin, and G. Richard, "Informed source separation through spectrogram coding and data embedding," *Signal Processing*, vol. 92, no. 8, pp. 1937 – 1949, 2012.

[2] C. Rohlfing, J. M. Becker, and M. Wien, "NMF-based informed source separation," in *2016 IEEE International Conference on Acoustics, Speech and Signal Processing (ICASSP)*, Mar. 2016, pp. 474 – 478.

[3] QUASI Database – A musical audio signal Database for Source Separation. <http://www.tsi.telecom-paristech.fr/aao/en/2012/03/12/quasi/>

