



Figure 3. Transcription example for recording “Ach Lieben Christen” from the Bach10 dataset. (a) The post-processed output of the transcription-prediction system using the 3rd configuration, with the NADE-HF. (b) The pitch ground truth of the recording.

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