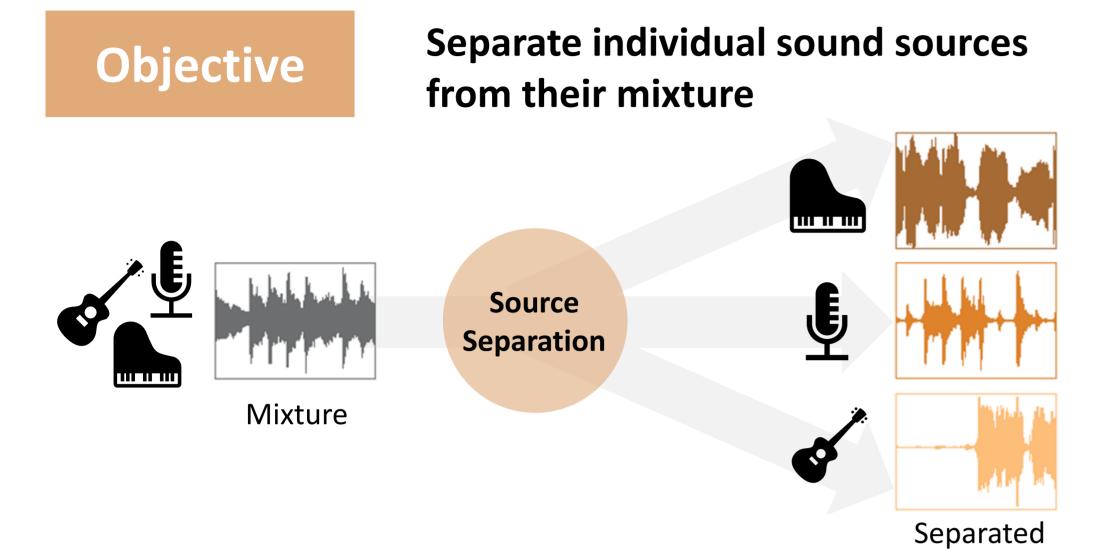
## **Audio Source Separation**

State-of-the-art source separation from Sony that separates music and speech into individual sources.

### Overview and Highlights for 2020



**Open-Unmix** 

**Open-source implementation with** pre-trained models

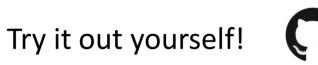
Sources



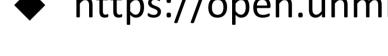
Reference implementation of music separation.

A joint **open source** work of INRIA and Sony.

(NNabla / PyTorch)



https://open.unmix.app ◆ ◆ ◆





### **Performance of latest Sony models** (D3Net, cUMX)

#### Trained on MUSDB18 only

<b>Network Architectures</b>	Open Source	SDR <sup>+</sup>
D3Net [2]		6.01
Nachmani et. al. [3]	<b>~</b>	5.82
X-UMX [4]	<b>*</b> ‡	5.79
Conv-TasNet[5][6]	<b>~</b>	5.73
Demucs [6]	<b>~</b>	5.58
Meta-TasNet [7]	<b>~</b>	5.52

<sup>†:</sup> Averaged SDR between 4 separated sources: vocal, bass, drum and others, calculation follows the median of median convention.

# **Application**

### **Business & services established by** employing source separation

Wind Noise Filter

Restoration of **Movie Classics** 

In-app Karaoke†



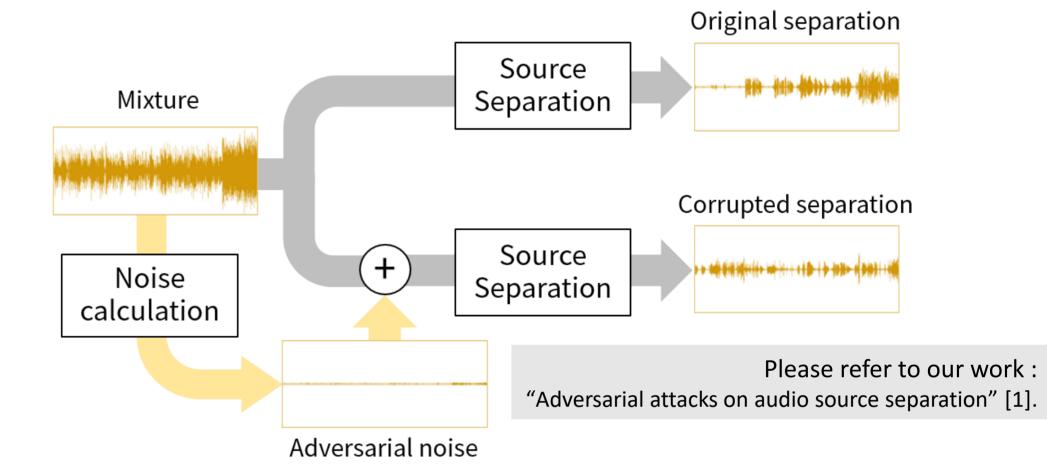




† https://www.ismir2020.net/assets/img/virtual-booth-sonycsl/Sony\_demo\_movie.mp4

# Extension

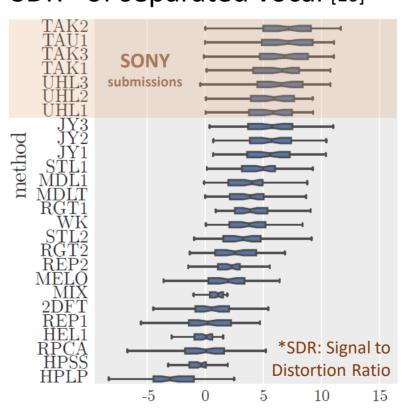
### **Prevention of unauthenticated** separation with adversarial noise

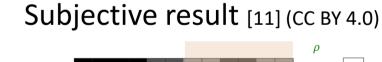


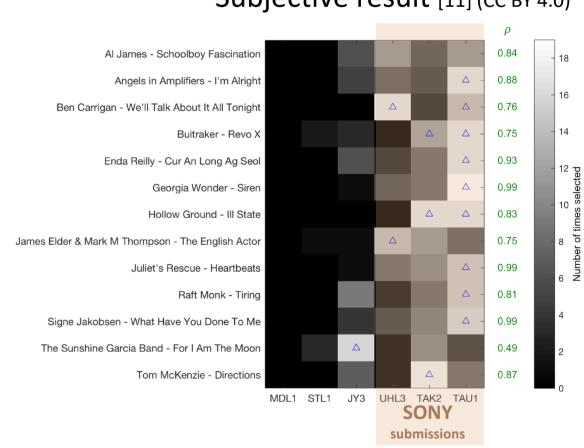
## **SiSEC Records**

### Top score in the SiSEC MUS task 3 times in a row (TAK, TAU, UHL)

#### SDR\* of separated vocal [10]



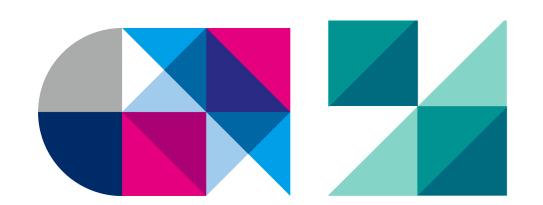




### References

- 1. N. Takahashi, S. Inoue and Y. Mitsufuji "Adversarial attacks on audio source separation," arXiv preprint arXiv:2010.03164, 2020
- 2. N. Takahashi and Y. Mitsufuji, "D3Net: Densely Connected Multidilated DenseNet for Music Source Separation," arXiv preprint arXiv:2010.01733, 2020
- 3. E. Nachmani, Y. Adi, and L. Wolf, "Voice separation with an unknown number of multiple speakers," in Proc. ICML2020
  - R. Sawata, S. Uhlich, S. Takahashi and Y. Mitsufuji, "All for One and One for All: Improving Music Separation by Bridging Networks," arXiv preprint arXiv:2010.04228, 2020
- 5. Y. Luo and N. Mesgarani, "Conv-TasNet: Surpassing Ideal Time—Frequency Magnitude Masking for Speech Separation," in IEEE/ACM TASLP, vol. 27, no. 8, Aug. 2019.
- 6. A. Defossez, N. Usunier, L. Bottou, and F. Bach, "Music Source Separation in the Waveform Domain," arXiv preprint arXiv:1911.13254, 2019
- 7. D. Samuel, A. Ganeshan, and J. Naradowsky, "Meta-learning Extractors for Music Source Separation," in Proc. ICASSP 2020
- 8. F.-R. Stöter, S. Uhlich, A. Liutkus and Y. Mitsufuji, "Open-Unmix A Reference Implementation for Music Source Separation," Journal of Open Source Software 2019
- 9. R. Hennequin, A. Khlif, F. Voituret and M. Moussallam "Spleeter: A Fast And State-of-the Art Music Source Separation Tool With Pre-trained Models" Late-Breaking/Demo ISMIR 2019
- 10. F.-R. Stöter, A. Liutkus, and N. Ito. "The 2018 Signal Separation Evaluation Campaign," LVA/ICA 2018
- 11. D. Ward et al. "SISEC 2018: state of the art in musical audio source separation Subjective selection of the best algorithm," *Proceedings of the 4th Workshop on Intelligent Music Production 2018*

<sup>‡:</sup> Will be available online soon.



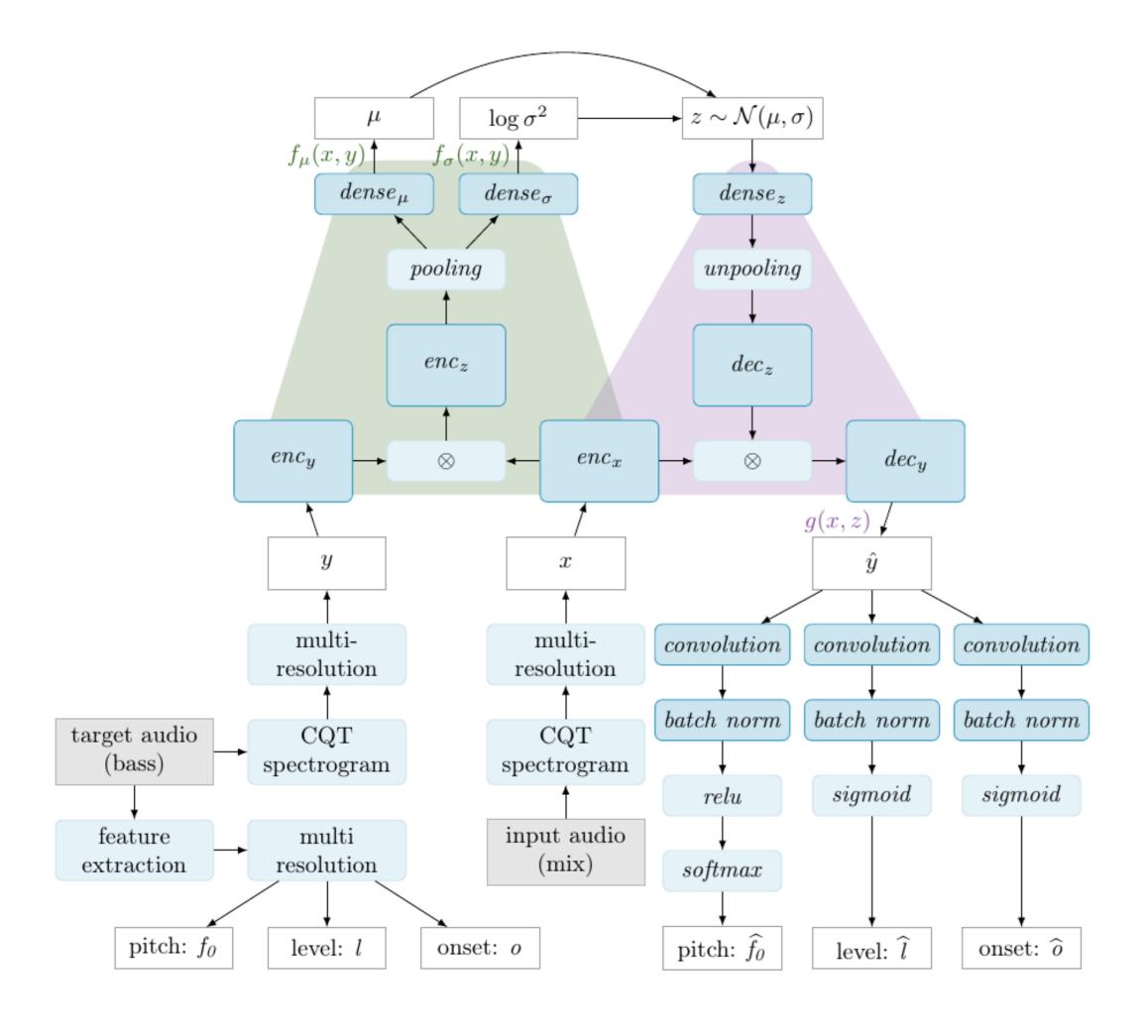
# Sony CSL Music Team

Compose music with the help of A.I. technology. We work with artists, for artists.

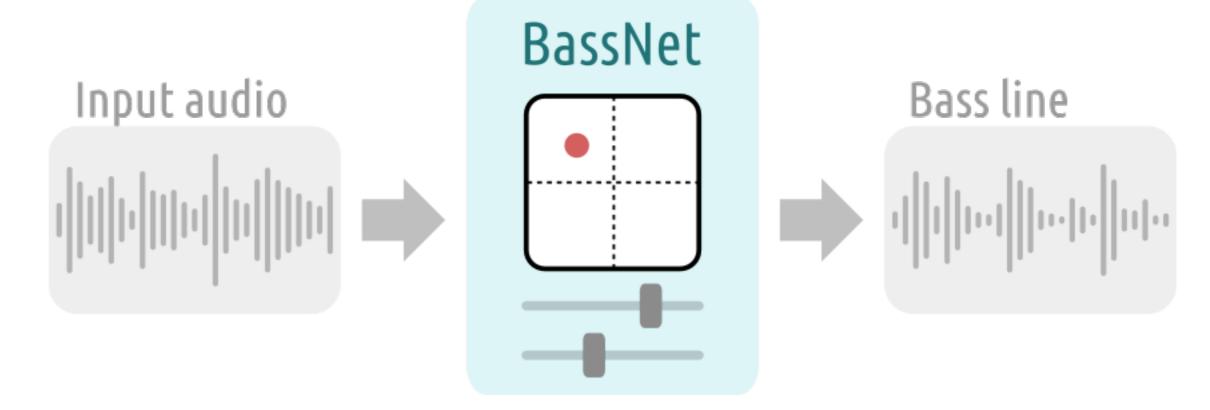
### **Highlight for Fall 2020**

#### BassNet

A Variational Gated Autoencoder for Conditional Generation of Bass Guitar Tracks with Learned Interactive Control.



M. Grachten, S. Lattner, E. Deruty (2020). <u>BassNet: A Variational Gated Autoencoder for Conditional Generation of Bass Guitar Tracks with Learned Interactive Control</u>. Applied Sciences, Special Issue "Deep Learning for Applications in Acoustics: Modeling, Synthesis, and Listening", 10(18):6627.



- You can input any audio.
- No restrictions on tempo or timing, BassNet follows your material.
- Explore and tweak bass lines interactively while the music is playing.
- Control note density, articulation, timbre and more.
- Export bass lines in audio and MIDI format to use in your DAW project.
- MIDI includes tuning, dynamics and pitch bend information.

Visit bit.ly/csl-bassnet

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