



Background

User's demand changes from **Passive Entertainment** to **Active Entertainment**

Passive listening

listen to **good** sound

- high-quality speakers
- surround system

easy to enjoy by technology evolution

Active listening

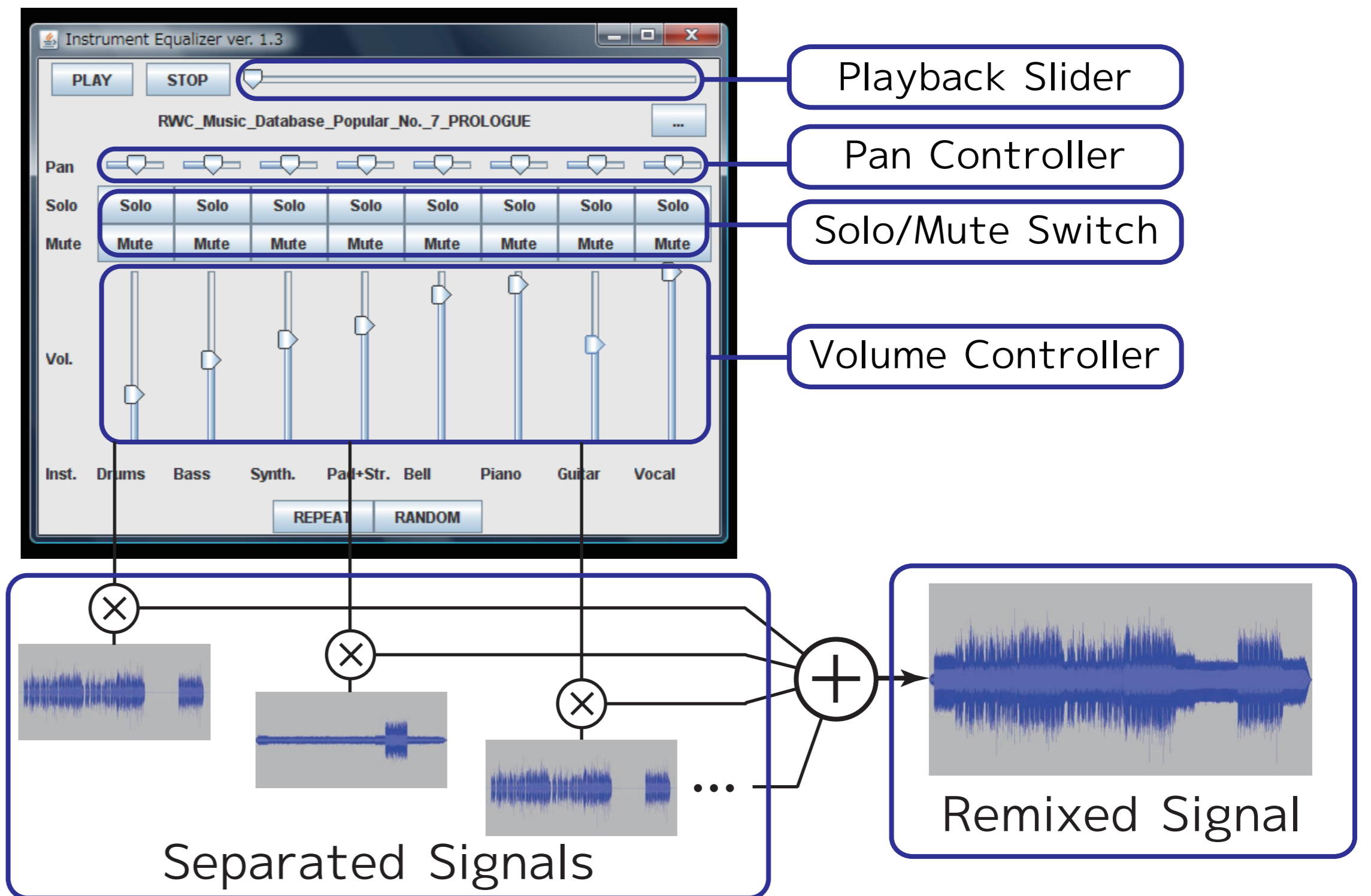
listen to **favorite** sound

- composition, arrangement
- performe a instrument

difficult to enjoy without skill or tools

- ▶ Technology to change the contents of musical pieces
 1. Develop an audio player with instrument's volume controlling functions
 2. Separate all musical instrument sounds from polyphonic musical signals

System Implementation



Other Applications

- Control volumes of instruments according to one's preference
Enjoy like arranger
- Cut off a specific instrument
Create a Minus One Music
- Re-analyze the remixed signal with different mixing balance
Generate an alternative query for the QBE Retrieval



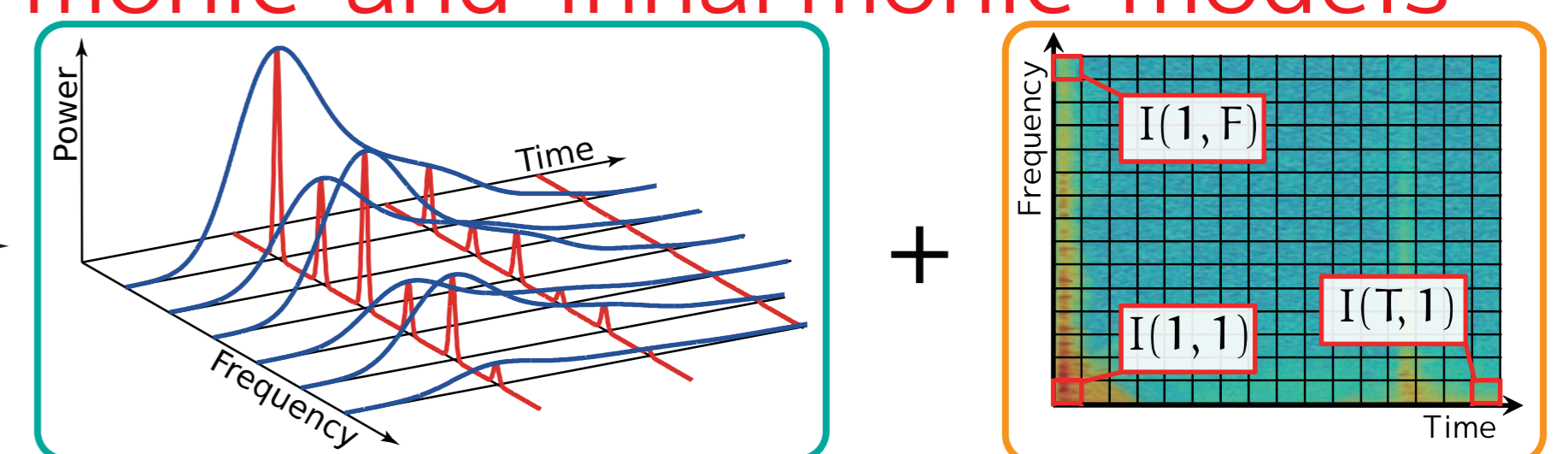
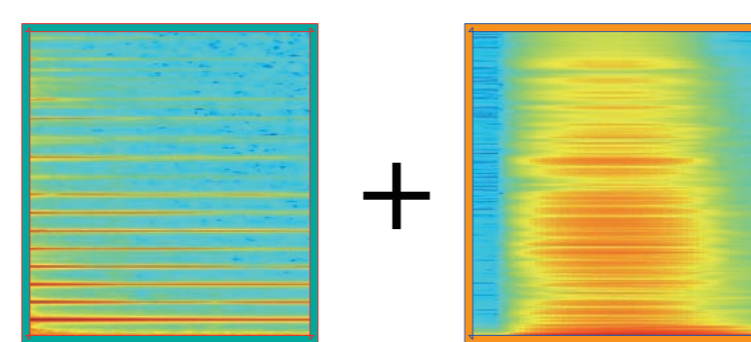
Technical Problems

Problem 1: Mixture of harmonic and inharmonic sounds

- ▶ Construct an integrated tone model consisting of harmonic and inharmonic models

Integrated Tone Model:

$$J(t, f) = H(t, f) + I(t, f)$$



Harmonic Tone Model

$$H(t, f) = \sum_{m=0}^{M-1} \sum_{n=1}^N E(m, t) F(m, n, t, f)$$

Two-dimensional Gaussian Mixture Model

Temporal Power Envelope

$$E(m, t) = \frac{u(m)}{\sqrt{2\pi\varphi}} \exp\left(-\frac{(t - \tau - m\varphi)^2}{2\varphi^2}\right)$$

Frequency Component

$$F(m, n, t, f) = \frac{v(m, n)}{\sqrt{2\pi\sigma}} \exp\left(-\frac{(f - n\omega(t))^2}{2\sigma^2}\right)$$

Inharmonic Tone Model

$$I(t, f) = \begin{bmatrix} I(1, 1) & \dots & I(T, 1) \\ \vdots & & \vdots \\ I(1, F) & \dots & I(T, f) \end{bmatrix}$$

Nonparametric Model

Problem 2: Undesirable local minimal values in the iterative algorithm

- ▶ Design an objective function with multiple constraints for the iteration algorithm

Observed Spectrogram: $\Delta(k, t, f)$
 Integrated Model: $J_k(t, f)$
 Distribution Function: $X(t, f)$
 (separate $\Delta(k, t, f)$ to each note)

Minimize the Kullback-Leibler Divergence between $J_k(t, f)$ and $X(t, f)$ and costs corresponding to constraints

- Smoothness of the inharmonic model
- Intra-instrument timbre consistency
- Continuity of F0 trajectory

