

# SOUNDS OUT OF PLÄCE? SCORE INDEPENDENT DETECTION OF CONSPICUOUS MISTAKES IN PIANO PERFORMANCES

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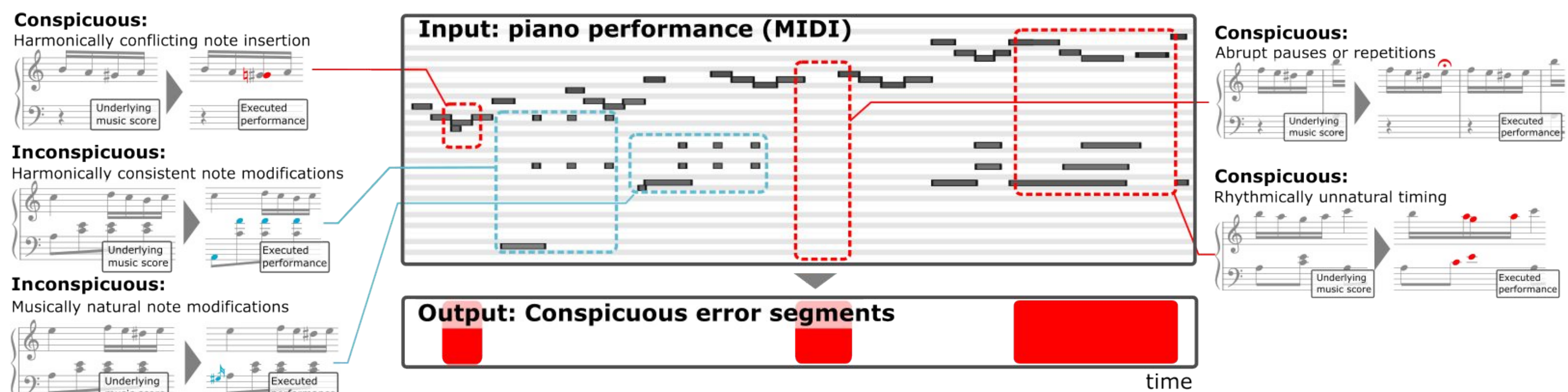
## Paper Goals

Build a **score-independent** conspicuous error detector for **standard piano repertoire of beginner to intermediate students**.

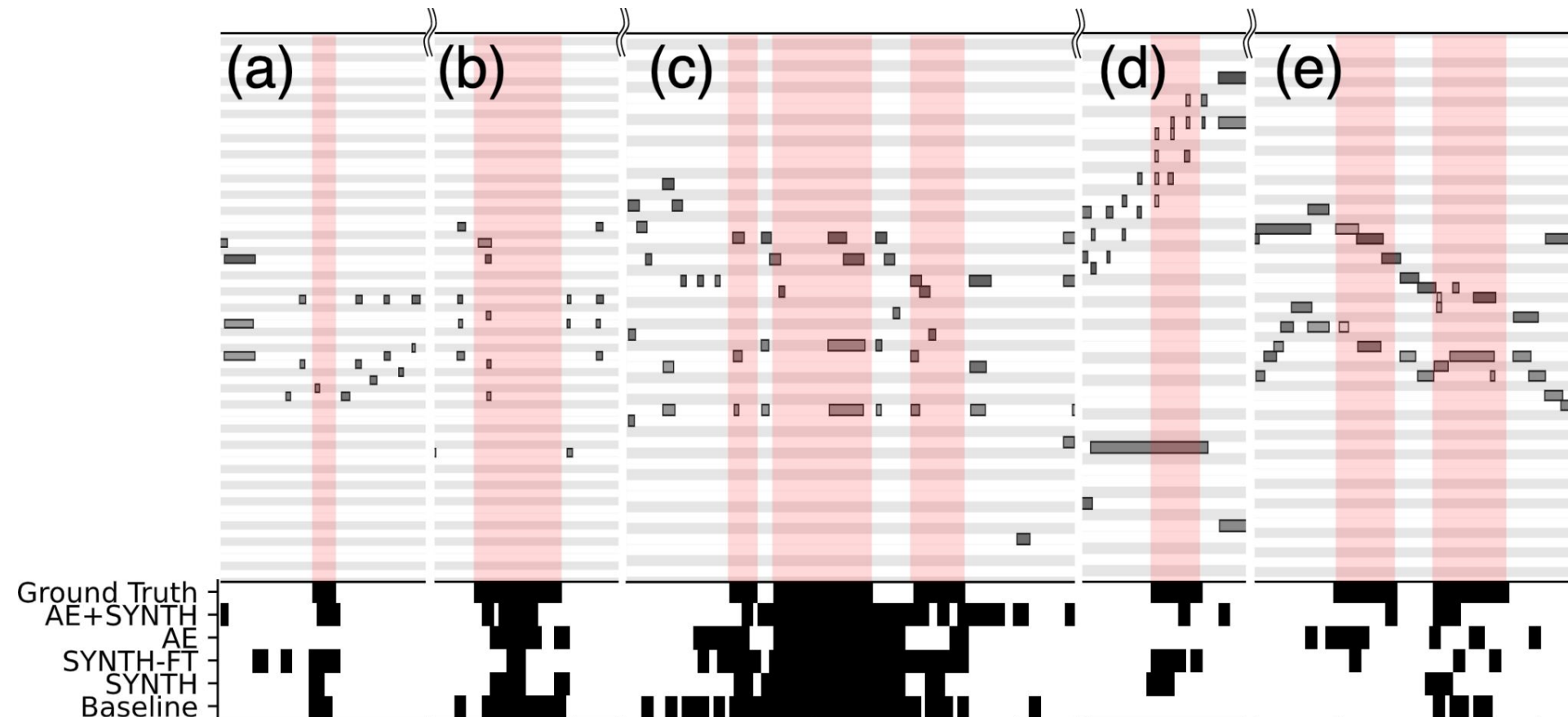
## Premise

Not all piano performance mistakes are equally salient to a listener [1].

## Concept



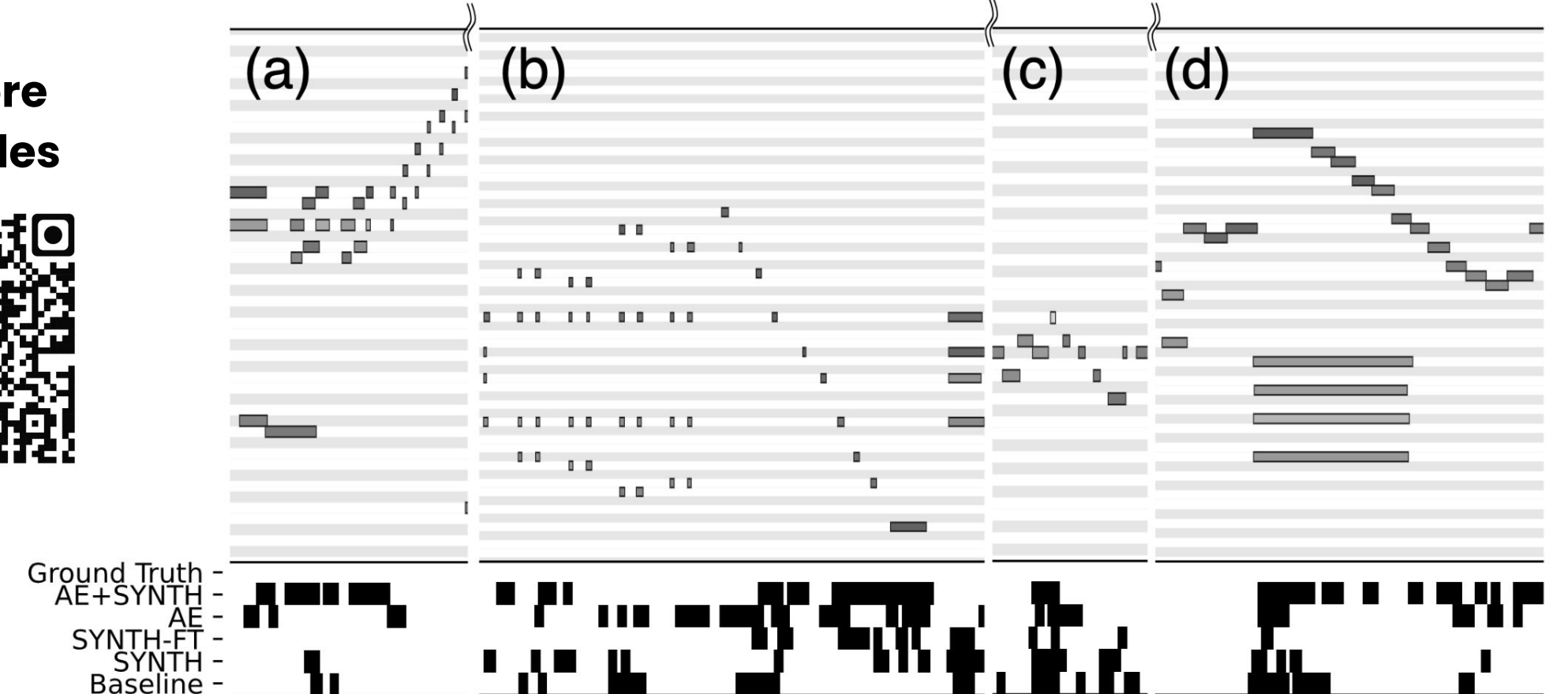
## Good Results



For More Examples



## Bad Results



## Data Collection

### Train Data

- **Sight Reading Data (SR):** 103 sight reading performances. (379 minutes).
- **Performance Data (PF):** 245 performances of 3 minutes each (723 minutes).

### Annotation procedure

- 2 annotators with music background.
- Asked to only annotate obvious mistakes.

### Eval Eval

- **Burgmüller Data (BM):** 50 performances of from Op 100 (25 recorded twice).

### Annotation procedure

- Alignment to music score conducted first.
- 1 annotator with a music background asked to manually review the labels wrt the sheet music and make corrections.

## Augmentation Strategies

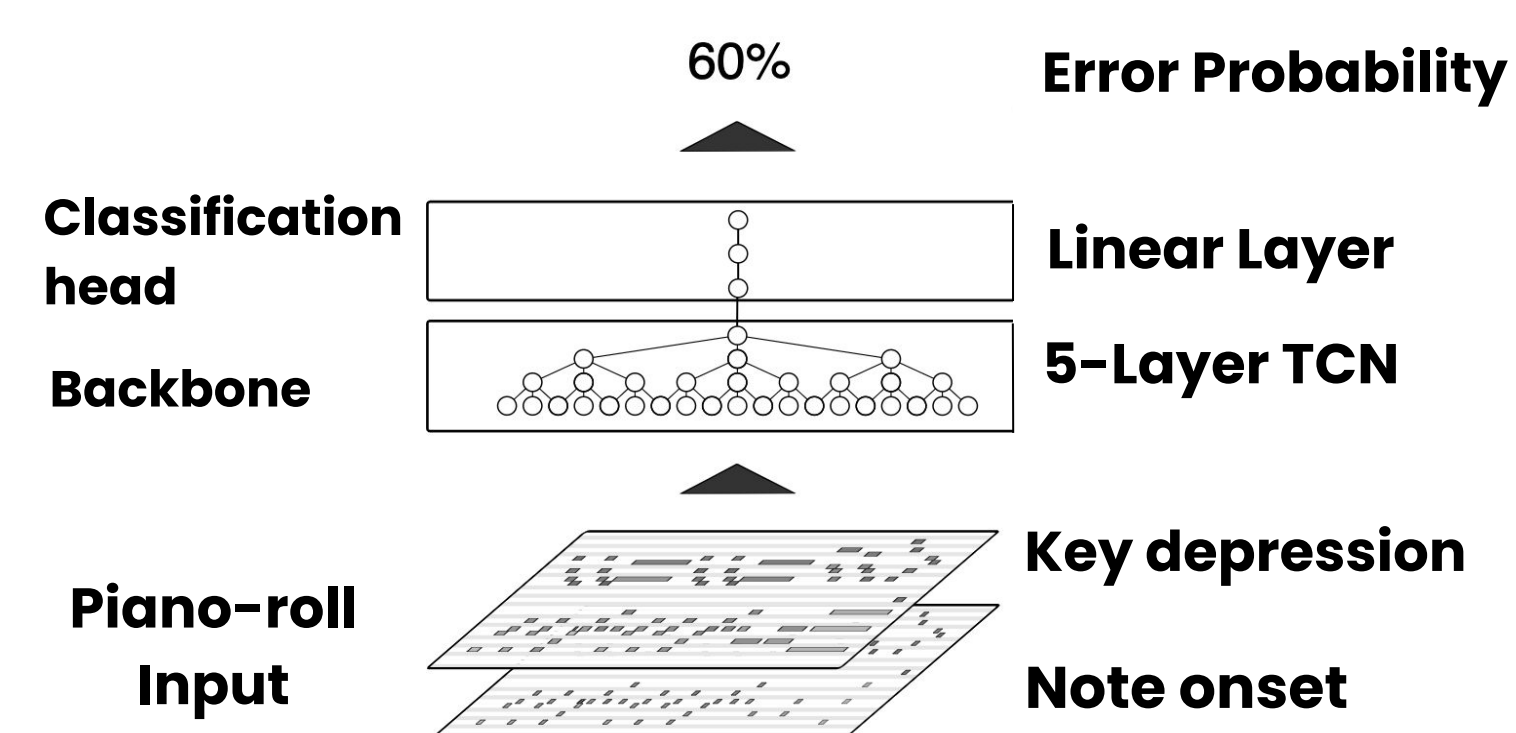
**Systematic adjustments** resembling the mistakes of adult beginner learners were applied to a set of **mistake-free** performances. (**AUG**)

- Note mistakes: **Omissions, insertions, substitutions**
- Stops and hesitations: silences and repetitions of the last played note.

## Models

- **Baseline:** SR and PF data
- **SYNTH:** SR, PF, and AUG
- **SYNTH (FT):**
  - Pretrain with AUG,
  - FT with SR and PF
- **AE:**
  - Train TCN Autoencoder with data similar to PF
  - Use encoder as classifier backbone, and fine-tune with SR and PF
- **AE+SYNTH:** same as AE, but fine tune with SR, PF, and AUG.

## Architecture



## Results

| Method    | Precision   | Recall      | F-measure   |
|-----------|-------------|-------------|-------------|
| Baseline  | <b>0.79</b> | <b>0.80</b> | <b>0.78</b> |
| SYNTH     | 0.65        | 0.76        | 0.69        |
| SYNTH(FT) | 0.61        | 0.69        | 0.62        |
| AE        | 0.55        | 0.59        | 0.55        |
| AE+SYNTH  | 0.44        | 0.65        | 0.51        |

(a) SR Data

| Method    | Precision   | Recall      | F-measure   |
|-----------|-------------|-------------|-------------|
| Baseline  | 0.28        | 0.46        | 0.33        |
| SYNTH     | 0.27        | 0.54        | 0.34        |
| SYNTH(FT) | <b>0.30</b> | 0.61        | <b>0.38</b> |
| AE        | 0.28        | 0.52        | 0.34        |
| AE+SYNTH  | 0.27        | <b>0.63</b> | 0.36        |

(b) PF Data

| Method    | Precision   | Recall      | F-measure   |
|-----------|-------------|-------------|-------------|
| Baseline  | 0.26        | 0.36        | 0.26        |
| SYNTH     | 0.26        | <b>0.69</b> | 0.35        |
| SYNTH(FT) | 0.26        | 0.49        | 0.32        |
| AE        | 0.27        | 0.46        | 0.31        |
| AE+SYNTH  | <b>0.28</b> | 0.52        | <b>0.35</b> |

(c) BM Data

[1] B. H. Repp, "The art of inaccuracy: Why pianists' errors are difficult to hear", Music Perception: An Interdisciplinary Journal, vol. 14, p. 161–183, 1996