# Concept-Based Techniques for "Musicologist-friendly" Explanations in a Deep Music Classifier

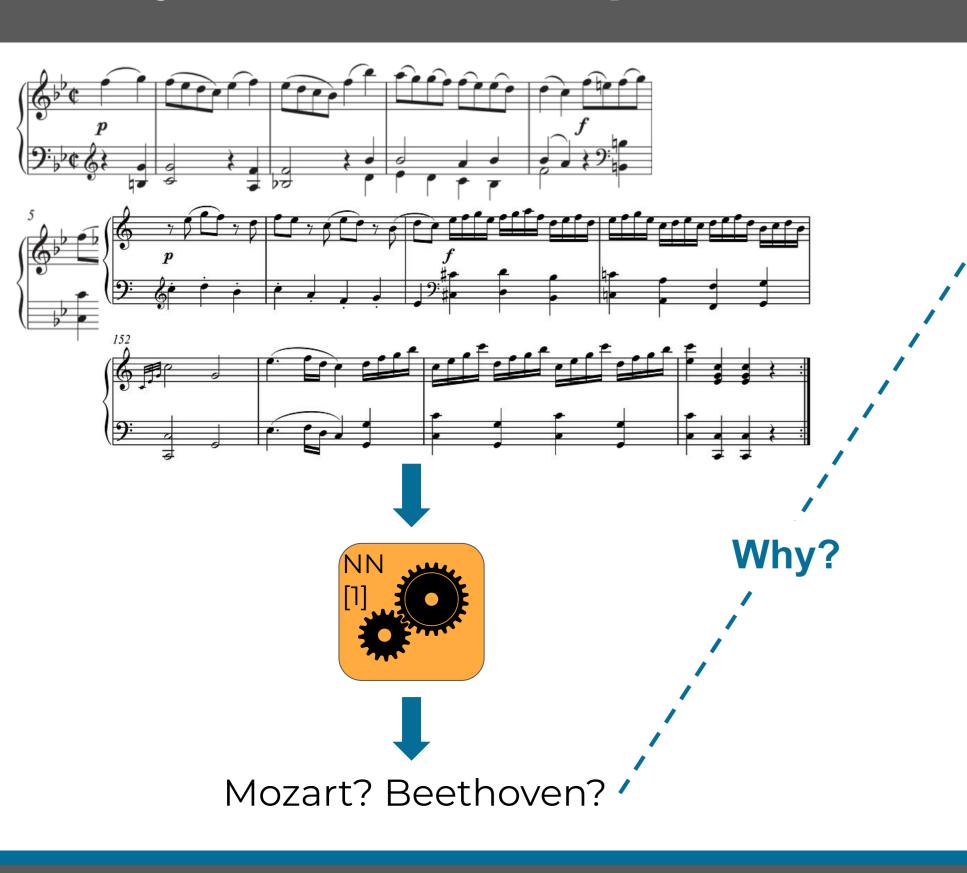


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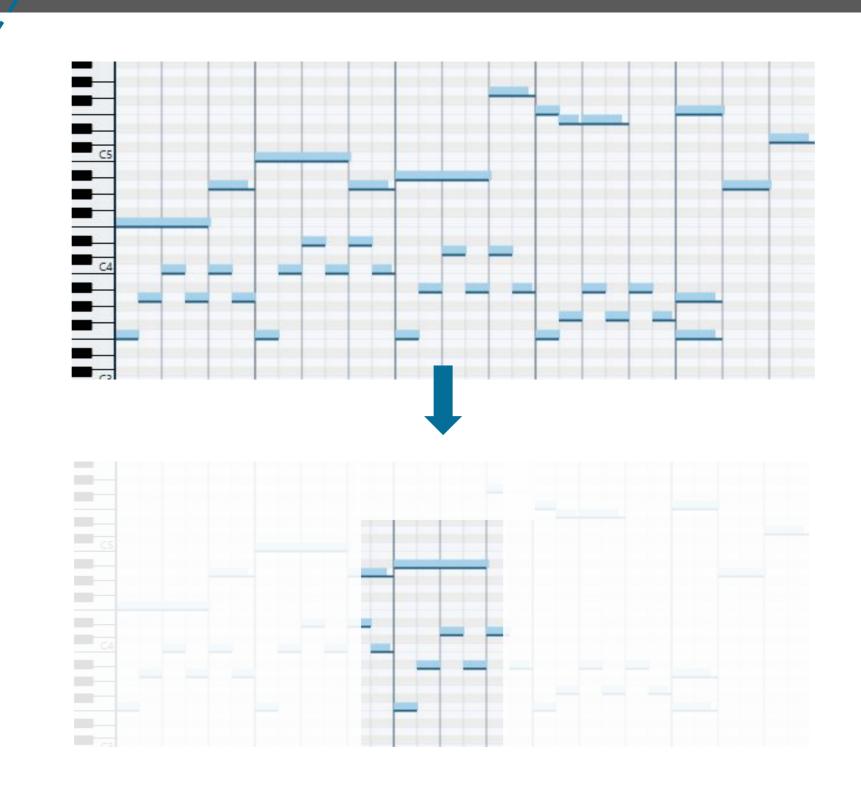
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### Why do we need explanations?



### 'Standard' Explainers...



### How do we talk about music?

Alberti Bass

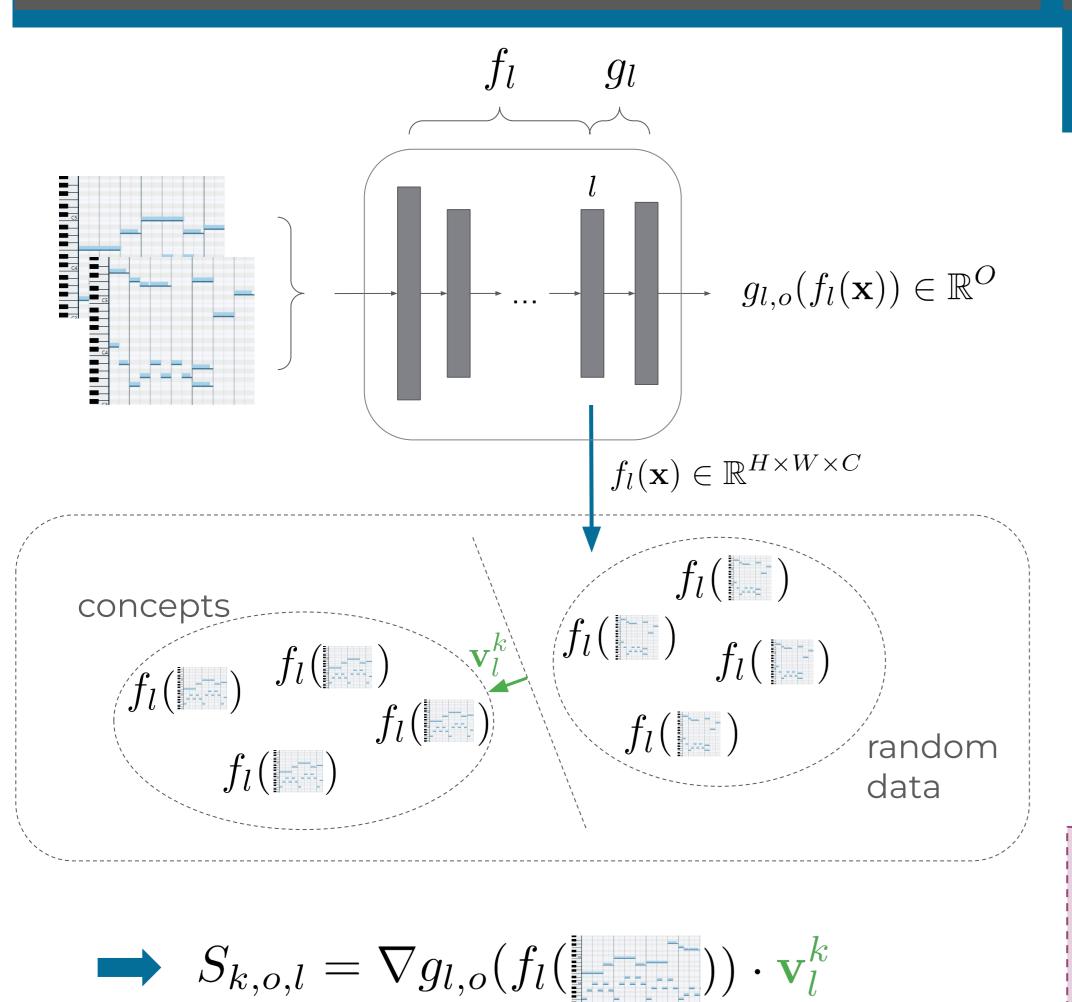
Melody with jumps

Difficult to play

Staccato

Contrapuntal Texture

# **TCAV** [2]



### **Step by Step**

### Supervised

- 1. Collect (concept) datasets
- 2. Compute CAVs  $\mathbf{v}_l^k$
- 3. Compute Conceptual Sensitivities  $S_{k,o,l}$
- 4. Accumulate to TCAV score:

$$TCAV = \frac{|\{\mathbf{x} \in \mathbf{X}_o : S_{k,o,l}(\mathbf{x}) > 0\}|}{|\mathbf{X}_o|}$$

But: we still do **not** know what system relies on We could have to try out countless concepts!

### What does this classifier use?

	Alberti bass	Difficult-to-play	Contrap. texture
Bach	+	_	+
Scarlatti			
Haydn	+	_	
Mozart	+	_	+
Beethoven	+		
Schubert			_
Chopin	_		_
Schumann		+	
Liszt	-	+	_
Brahms	+		
Debussy	-		_
Scriabin	-	+	
Rachmaninoff	-	+	

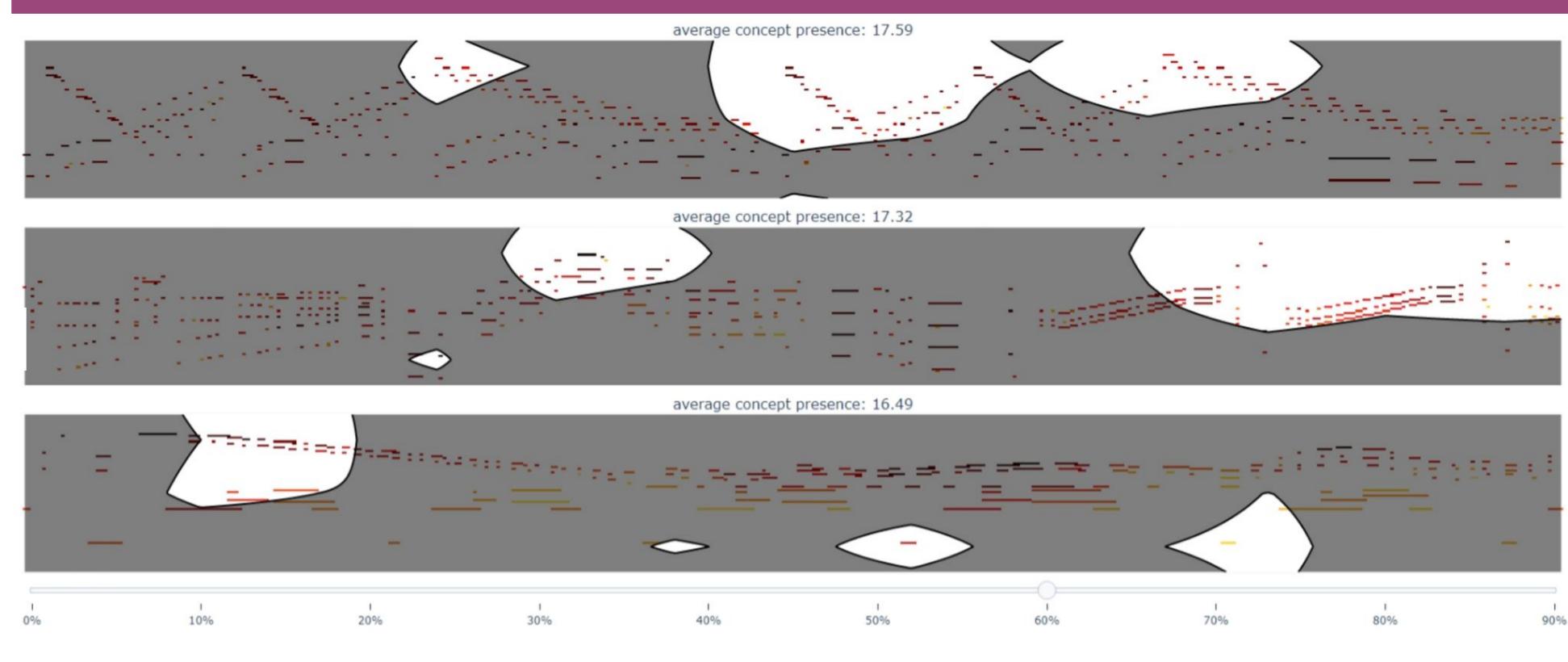
### **Non-Negative Tensor Decomposition**

## Human interpretation of concepts (Bach vs Chopin)

# $f_l(\mathbf{x_p})$ Finsor Decomposition $f_l(\mathbf{x_1})$ Channel-CAV [3] $\mathcal{X} \approx \sum_{n=1}^{N'} \sum_{h=1}^{H'} \sum_{w=1}^{W'} \sum_{c=1}^{C'} t_{nhwc} \mathbf{a}_n \circ \mathbf{b}_h \circ \mathbf{d}_w \circ \mathbf{e}_c$

Concept presence

### Unsupervised



C' concepts produced.

Excerpts with highest concept presence (for one of the produced concepts).