# Emergent Formal Structures of Factor Oracle-Driven Musical Improvisations

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#### The Mimi Project: Multimodal Interaction in Musical Improvisation

- \* Inspired by the **OMax** project at IRCAM a little sister of the OMax brothers
- \* Implemented by Alexandre François using his Software Architecture for Immersipresence (SAI)
- \* Mimi 1.0: by François, Chew, Thurmond [ACMCIE], premiered at 1st MCM meeting, Berlin 2007, on a Seiler piano
- \* Mimi4x: by François, Schankler, Chew [IMIDA, IJART], installation for high-level structural improvisation
- \* Mimi 1.5: by François, Schankler, Chew, featured in concerts: PiE, etc.



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### Mimi demonstration

## Question

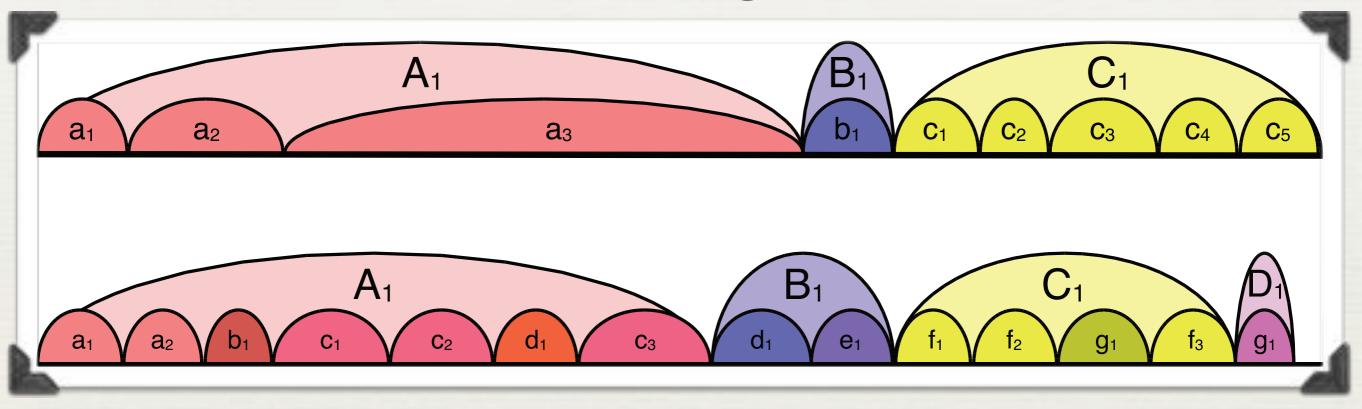
\* When a human improviser interacts with Mimi, what kinds of structures emerge?

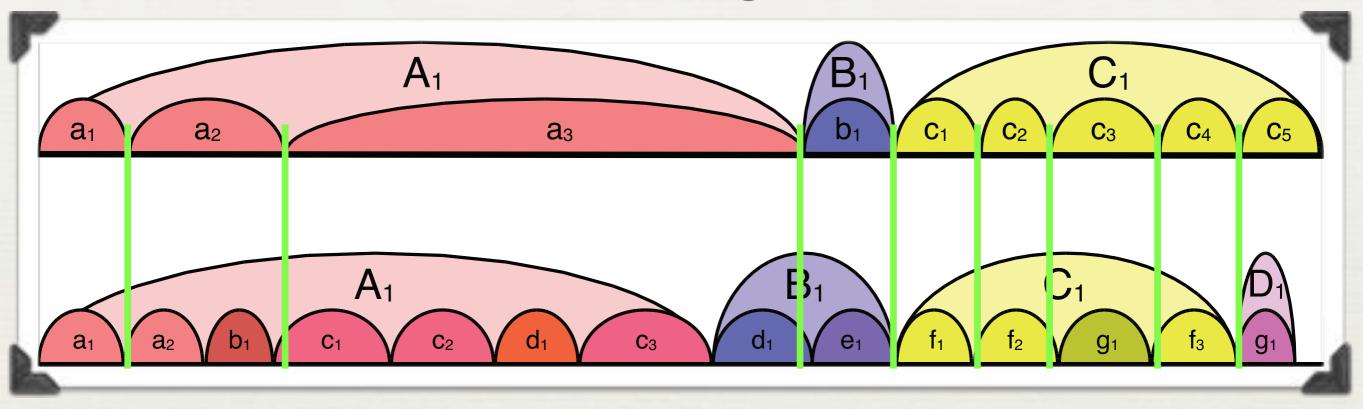
# Question

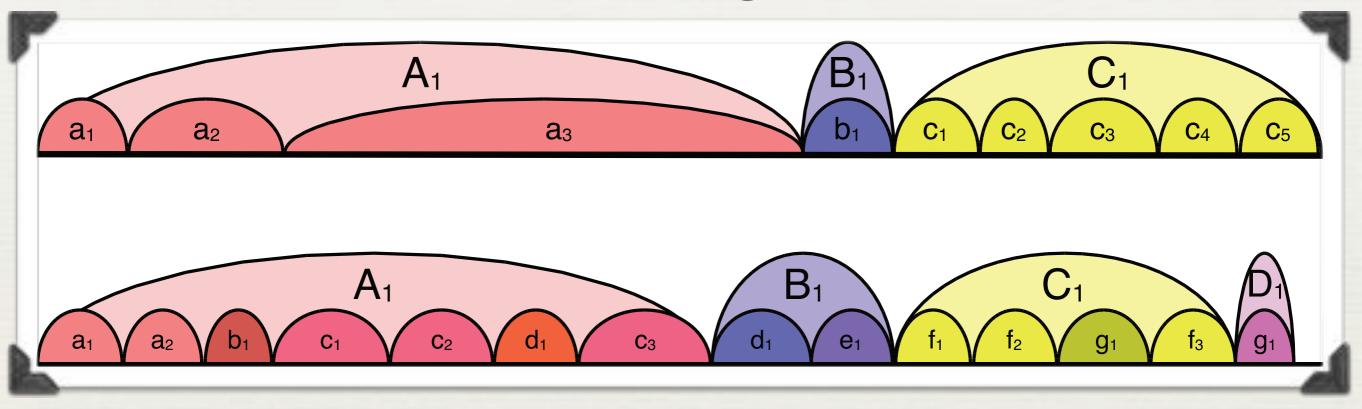
- \* When a human improviser interacts with Mimi, what kinds of structures emerge?
- \* Do the performer and a listener perceive the structures differently?

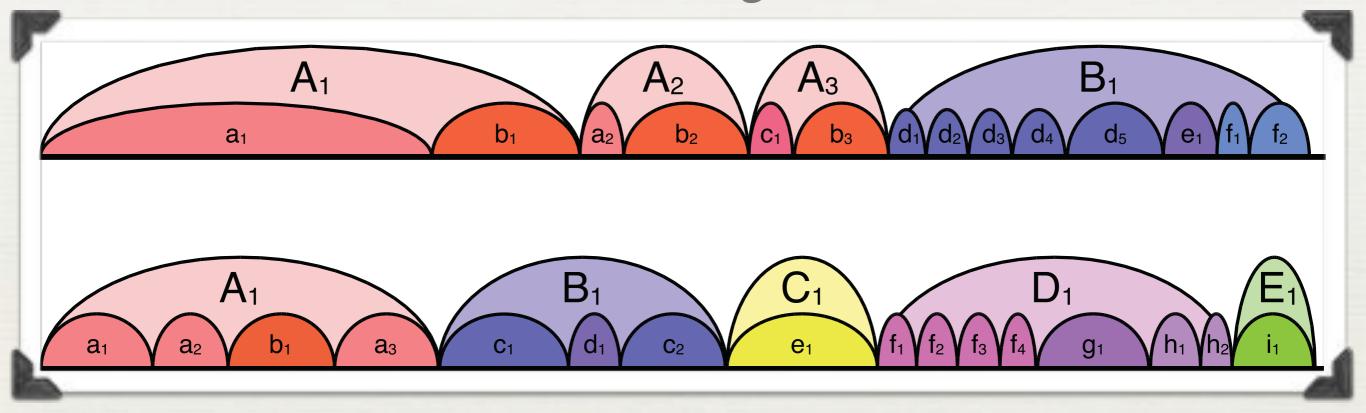
# Experiment

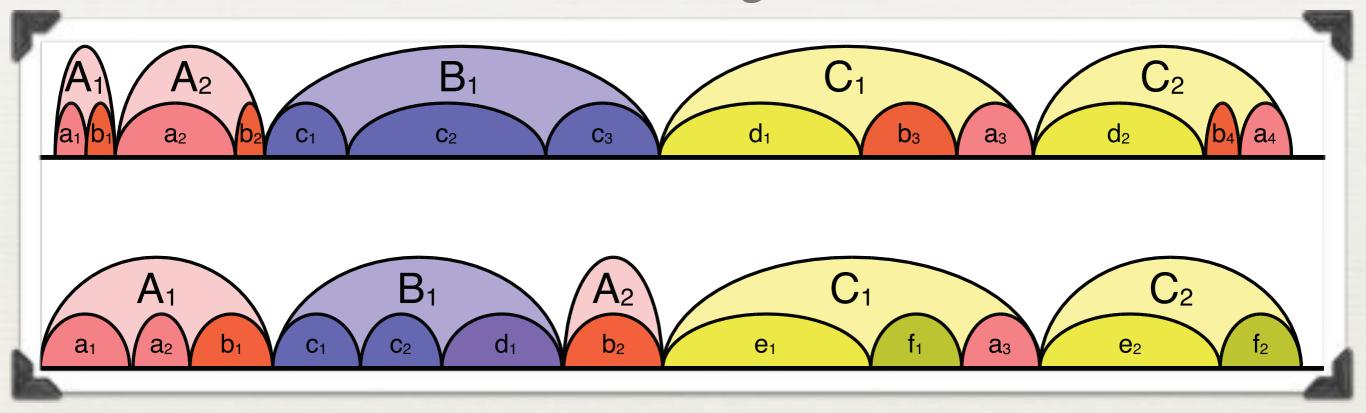
- \* Isaac performed three improvisations with Mimi
- + The sessions were recorded
- \* The recordings were analyzed by (1) the performer, Isaac, and (2) a skilled listener, Jordan
- \* The annotations were compared











- \* Boundaries in small-scale analyses tend to be closely aligned
  - Interpretation of boundaries was similar
- \* Labels in large-scall analyses tend to coincide
  - Large-scale organization is similar

#### Evaluation

- \* Visual comparison reveals many similarities, but these judgements are subjective.
- \* Four empirical evaluation metrics were considered:
  - \* Boundary precision and recall
  - \* Pairwise precision and recall
  - \* Average cluster and speaker clarity
  - + Rand index

#### Boundary precision and recall

#### Annotation



Estimate

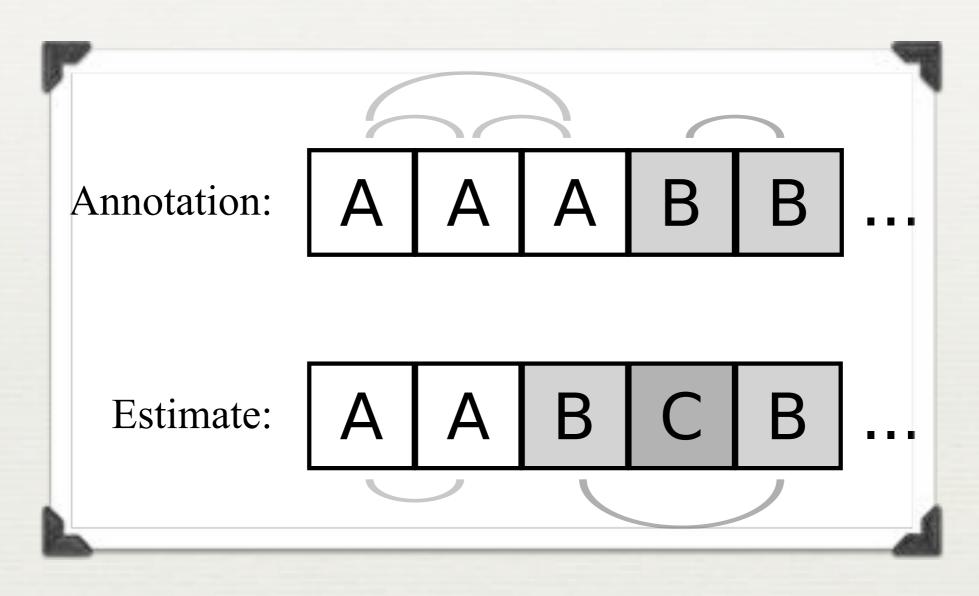
= 37.5%

= 60%

Precision: 3/8 Recall: 3/5 f-measure: 2pr/(p+r)

=46%

#### Pairwise precision and recall



Precision: 1/2 Recall: 1/4 f-measure: 2pr/(p+r) = 50% = 25% = 33%

#### Baselines

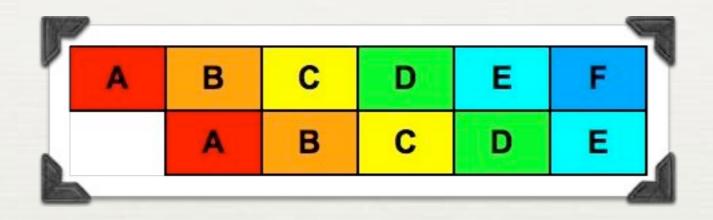
- \* Empirical comparisons more or less meaningless without some baseline for comparison
- \* Many baseline strategies were used; the bestperforming one placed 10 boundaries randomly throughout the piece and assigned segment labels randomly

Boundary f-measure	Performance 1		Performance 2		Performance 3	
$\pm$ 1 second						
Scale:	Small	Large	Small	Large	Small	Large
Ann1 - Ann2	0.27	0.29	0.28	0.40	0.39	0.53
baseline - Ann1	0.02	0.01	0.02	0.00	0.05	0.03
baseline - Ann2	0.02	0.01	0.02	0.01	0.04	0.04
Boundary f-measure ± 6 second	Performance 1		Performance 2		Performance 3	
Scale:	Small	Large	Small	Large	Small	Large
Ann1 - Ann2	0.74	0.50	0.65	0.40	0.82	0.85
baseline - Ann1	0.18	0.10	0.14	0.09	0.25	0.17
baseline - Ann2	0.24	0.15	0.13	0.10	0.29	0.17
Pairwise f-measure,	Performance 1		Performance 2		Performance 3	
Scale:	Small	Large	Small	Large	Small	Large
Ann1 - Ann2	0.47	0.85	0.66	0.62	0.68	0.90
baseline - Ann1	0.50	0.51	0.50	0.52	0.41	0.48
baseline - Ann2	0.34	0.50	0.40	0.43	0.36	0.48
K-measure	Performance 1		Performance 2		Performance 3	
Scale:	Small	Large	Small	Large	Small	Large
Ann1 - Ann2	0.60	0.84	0.70	0.70	0.68	0.87
baseline - Ann1	0.56	0.53	0.55	0.56	0.44	0.51
baseline - Ann2	0.43	0.54	0.50	0.50	0.42	0.52
Rand index	Performance 1		Performance 2		Performance 3	
Scale:	Small	Large	Small	Large	Small	Large
Ann1 - Ann2	0.70	0.90	0.88	0.71	0.87	0.93
baseline - Ann1	0.67	0.63	0.76	0.59	0.68	0.58
baseline - Ann2	0.58	0.61	0.72	0.52	0.63	0.58

## Question

\* When a human improviser interacts with Mimi, how do structures emerge?

#### The Canon

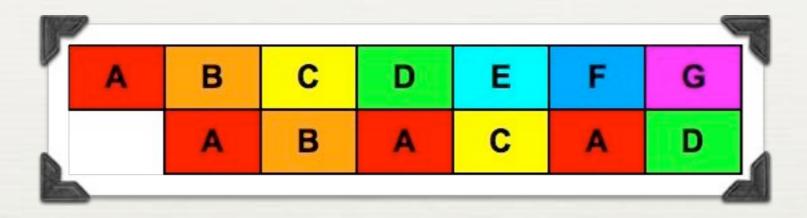


- \* Mimi's actions are delayed by 10 seconds
- \* If no recombination occurs, together Mimi and the human performer create a canon at the 10-second level

### Canon-like forms



#### The Rondo

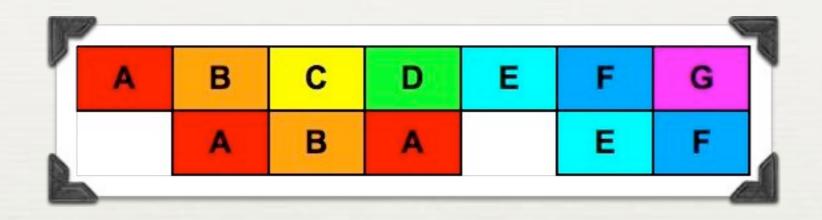


- \* Mimi may revisit pieces of musical material, creating a sense of return
- \* If Mimi is continuously learning, material learned earlier is more likely to be heard again than material learned later

## Rondo-like forms



### Large-scale formal divisions

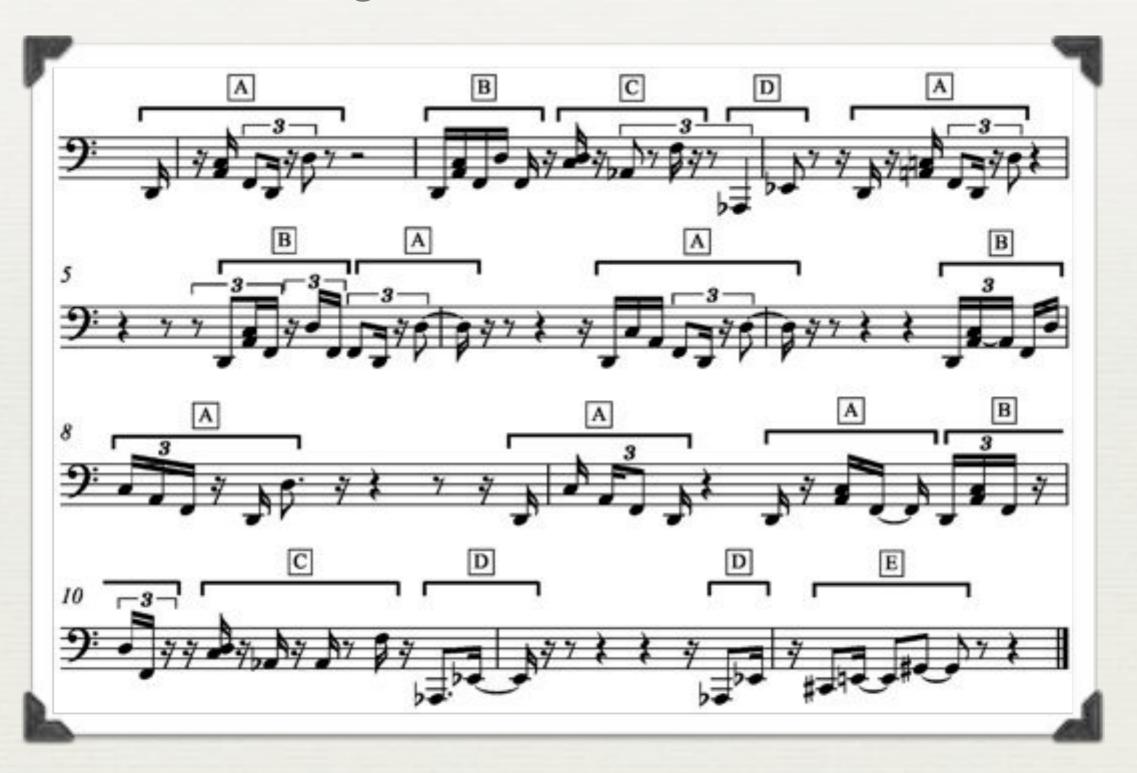


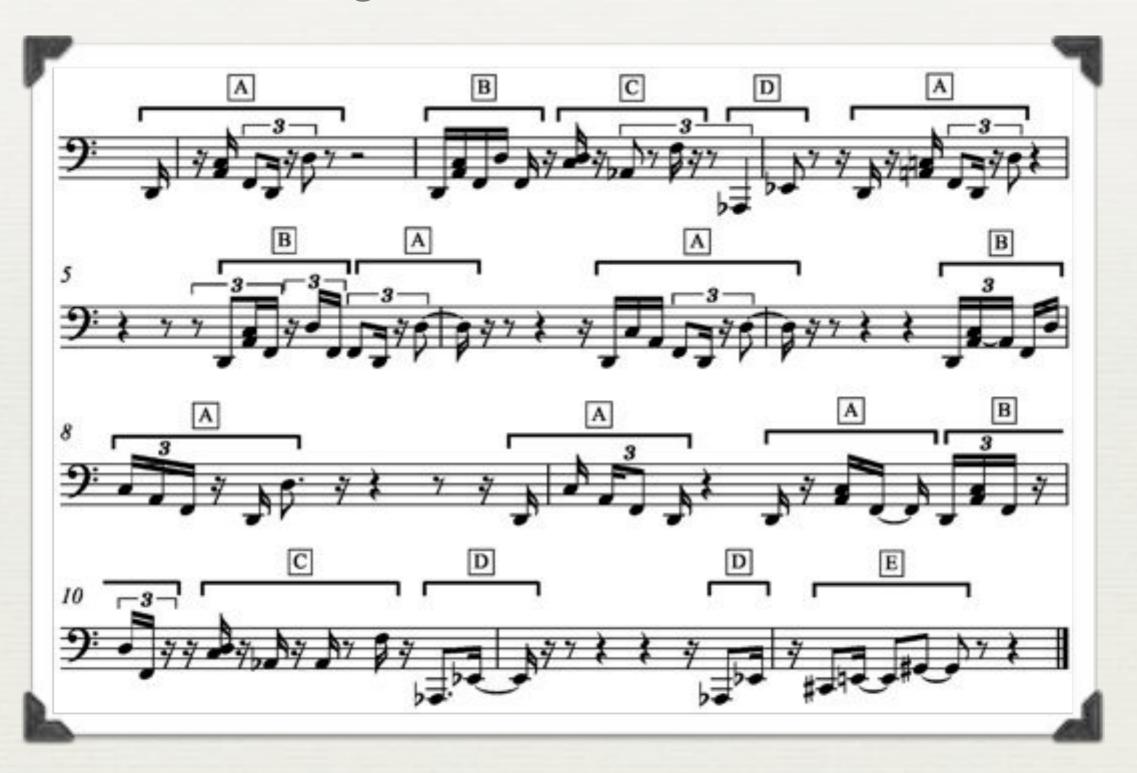
\* Mimi's memory can be cleared, allowing the creation of large-scale formal divisions

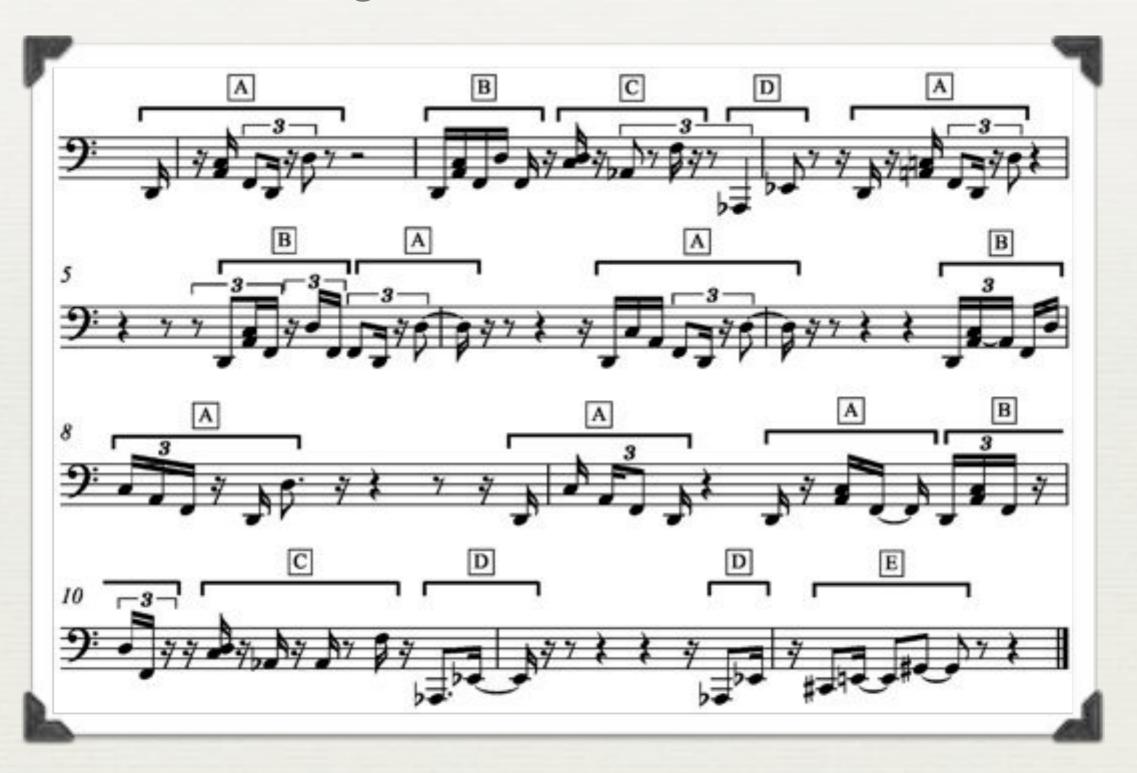
### More large-scale formal divisions



- \* On a smaller scale, Mimi's performances exhibit similar structural tendencies
- \* Similar to personnages rhythmiques found in the music of Stravinsky and Messiaen, but always immobile







# Summary

- + Questions:
  - \* When a human improviser interacts with Mimi, what kinds of structures emerge, and how do they emerge?
- \* Answers:
  - \* Familiar structures (canon, rondo, etc.)
  - \* By virtue of Mimi's programming...

# Thanks for your attention!