#### The Deep Kinship between Music and Speech

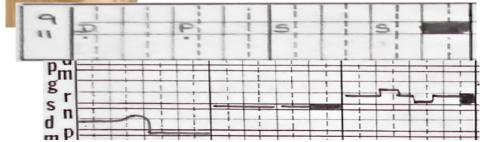
Lonce Wyse National University of Singapore

<u> ふいえい 2019</u> ASRU 2019



#### Arts and Creativity Lab National University of Singapore

Musical expectation



Modeling Gamakas in Carnatic Music

Anticipatory Improvisation



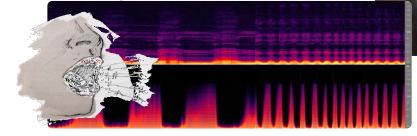


Mobile platform for audience engagement



Sound Modeling

Voice-controlled synthesis





Vibrotactile Musical Experience for the Dea

Eyes-free Games

# Today

- Tell a story about two related domains
  - Review some of the commonality shared between speech and music
  - Review some musical developments of the past century
  - Reflect on "sense making" in music
  - Weave in some of my modeling work informs the narrative
  - Draw connections between sense making in music and speech.
  - Ambitious Goal: is find something about music that might make you think a little differently about speech.

## Music: Auditory cheesecake

• Music is not adaptive, but rather an "exquisite confection crafted to tickle the sensitive spots of .... Our mental facilities.



## Relationship between sound and music

#### Both are defining characteristics of humans

- Evolution
- Brain structures
- Hearing
- Generation
- Creativity ("generative")
- Temporal
- Performativity

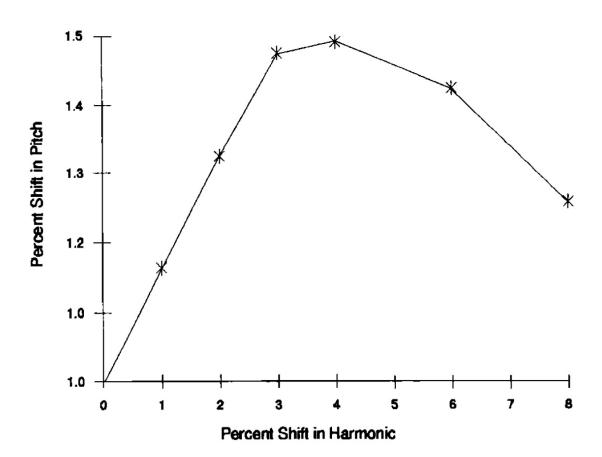
- Hierarchical
- Textuality
- Sociality
- Improvisation
- Multimodality
- Multi-channel (streams)
- Referentiality
- Combination (song, storytelling, sound poetry, Satie)

## Speech

- Strings of words
  - referential semantics
- Prosody
  - Pitch
  - Amplitude
  - Rhythm
    - Timing
    - Stress pattern
    - Prediction (rhythm as a form of attention)
- Another word we use for that second group of qualities?
- How is meaning constructed in these sonic domains?

# But pitch perception is not F0 identification

- Missing fundamental
- Narrow band noise, rippled noise
- Edge pitch
- Mistuned components
  - And grouping



https://sonicthings.org/stretchedKeyboard/

## Expectation

- Fundamental process; survival value (prepare, disambiguate, respond more quickly)
  - Due to survival value, related to emotion (penalties & rewards in lieu of consequences)
- Well established as essential to emotional response to music
  - Leonard Meyer's Emotion and Meaning in Music (1956)
    - Without referential semantics
    - Expectations can be satisfied, violated, delayed, ambiguous thus manipulating emotion
- Language
  - Word "preactivation" facilitates comprehension
  - Difficulty of comprehension proportional to surprise in it context
  - Model building for reducing ambiguity of future events

# Theories of musical meaning

- Focus on emotion
- Workhorse is EXPECTATION

TonicDominantIIVVAminDminEmajDminGminAmaj

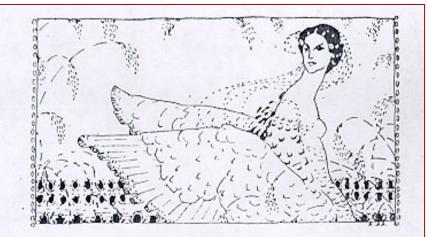
 $\begin{bmatrix} \mathbf{I} & \mathbf{V} & \mathbf{V}$ 

# Theories of musical meaning

- Focus on emotion
- Workhorse is EXPECTATION

TonicDominantIIVVAminDminEmajDminGminAmaj

But then came the 20<sup>th</sup> century .....



#### СВОБОДНАЯ МУЗЫКА.

Результаты примѣненія теоріи художественнаго творчества къ музыкѣ.

Въ первыхъ статьяхъ о теорія художественнаго творчества я говорипъ объ ея могуществѣ, о томъ, что она можетъ сыграть роль магическаго жезла, ключа къ дверямъ, за которыми скрыто неизвѣданное счастье.

 Сдълземъ опытъ, попробуемъ проникнуть въ закрытыя палаты дворца музыки.

#### Естественная музыка.

Новыя позможности скрыты въ самыхъ источникахъ искусства, въ природѣ.

Мы—малые органы живой земли, клѣтки ея тѣла. Прислушаемся къ ея симфоніямъ, составляющимъ часть общаго космическаго концерта. Это—музыка природы, натуральная, свободная музыка.

Пора обратить вниманіе на естественное искусство и на законы его развитія.

Всѣ знаютъ, что шумы моря и вѣтра музыкальны, что гроза развиваетъ дивную симфонію, а музыка птицъ даже получила большое распространеніе въ обиходѣ обывателя.

Гланьбашів нев положеній о свободной жузыкі, уже опубликованы мною вь вида кон" спекта, Свободная музыка". С.-Пб. 1909 г. 12., 7 стр.

#### 100 years of musical innovation

The symphony of the cosmic concert is the music of nature - the natural "free music"....

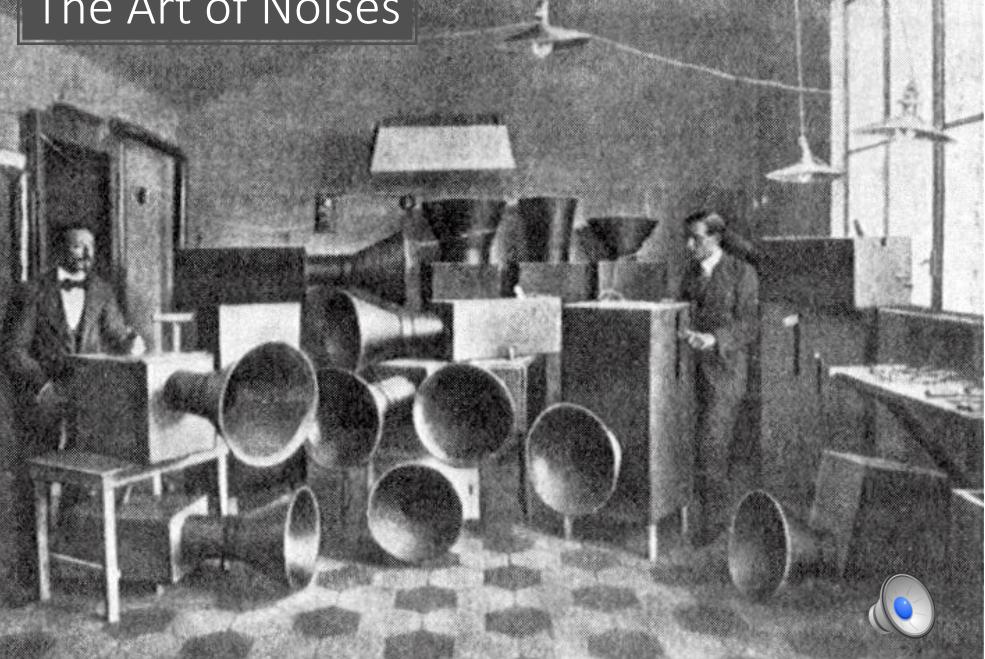
...everybody knows that the noises of the sea, wind, thunderstorm, makes a symphony as well as the music of birds - but right now, people exploit the music of nature according to the old laws - ...

#### Nikolai Kulbin (1910) Free Music

Beethoven and Wagner have stirred our nerves and hearts for many years. Now we have had enough of them, and we delight much more in combining in out thoughts the **noises of** trams, of automobile engines, of carriages and brawling crowds, than in hearing again the "Eroica" or the "Pastorale".

(Art of Noises, 1913)





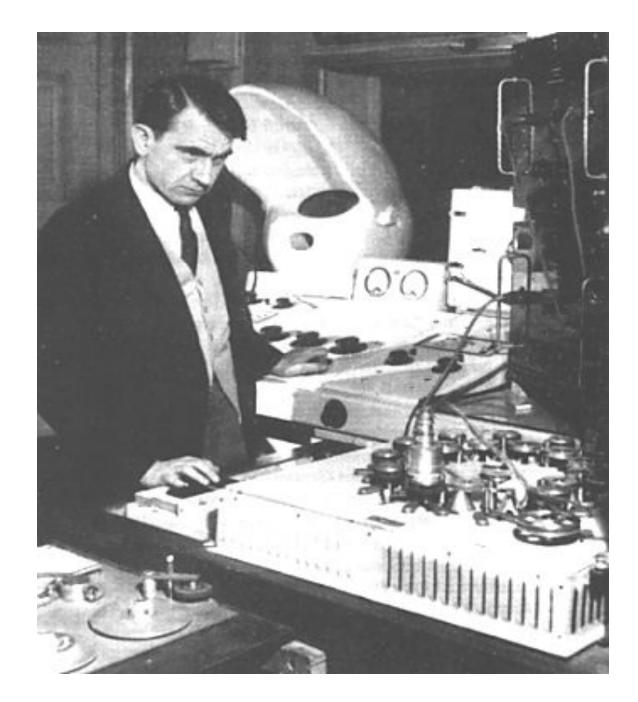
# Musique Concrète

Pierre Schaeffer at his "chromatic phonogène" in 1953.

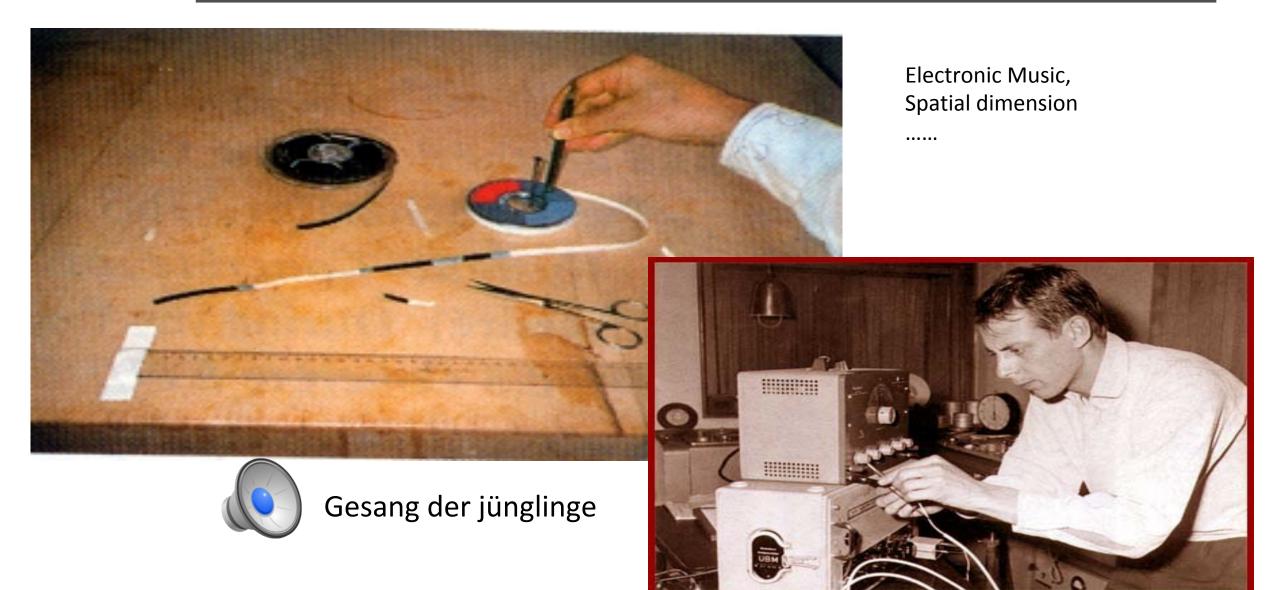
*Ecoute reduite* 



Etude aux Chemins de Fer (1948)



#### Stockhausen



## New Music

- Extended vocal and instrumental techniques
- Recorded sound, referentiality
- Electronic sound ("sourceless")
- Indeterminacy
- Notation (animated, graphic, real-time)
- All sound
- Interfaces
- Mediated communication

Not even talking about "sound art"!

• Big mistake to think of music as sequences and groupings of notes.

# Aspects of sound not in the sample stream

- Sound is spatial (after it leaves the source)
  - Goes around corners
  - Can surround us
  - Is part of an "orienting system" (compared to visual)
- Evokes place
  - Soundscapes
- Is tactile







#### Aspects of sound not in the sample stream

- Bears a different relationship to objects than names or images.
  - Source "bonding"
  - Sound generally comes from the interaction of multiple objects (a "source" and an "exciter")
  - Indicative of \*events\* as much as \*objects\*

### Margaret Boden

### "A creative idea is one which is novel, surprising, and valuable (interesting, useful, ..."

- P-creativity novel for an individual
- H-Creativity novel historically



## Margaret Boden

#### "A creative idea is one which is novel, surprising, and valuable (interesting, useful, ..."

- P-creativity novel for an individual
- H-Creativity novel historically

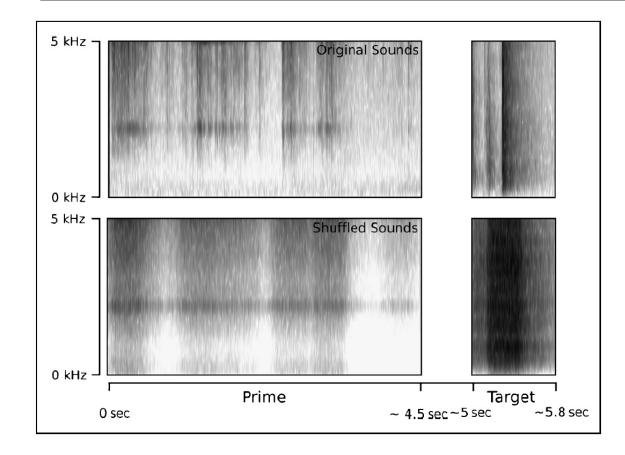
Do speech and music have different fluidity at these different time scales?



## Expectation

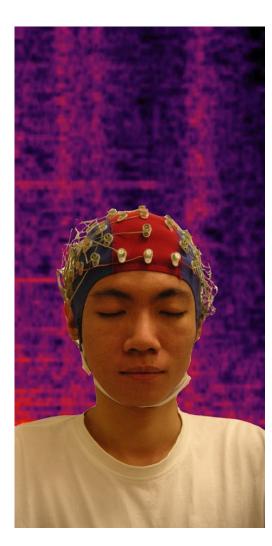
- Priming in speech
  - Words prime words,
  - cross domain priming
- In sound
  - Previous research indicated exact repetitions produced faster and more accurate behavioral responses than different sounds. But perceptual and conceptual are conflated. Attempts to tease these two apart behaviorally were inconclusive.
  - Cross modal experiments (eg pictures priming sounds) suggest conceptual priming (but are difficult to interpret)

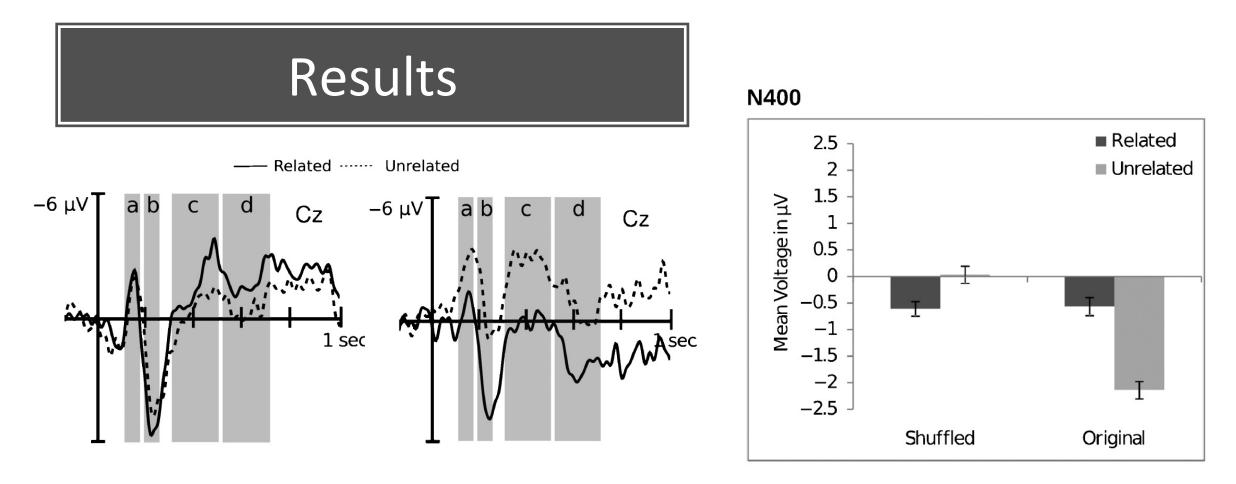
# Sound Priming Sound?



Schirmer, A., Soh, Y. H., Penney, T. B., & Wyse, L. (2011). Perceptual and conceptual priming of environmental sounds. Journal of cognitive neuroscience, 23(11), 3241-3253.

- Disentangle perceptual from conceptual priming
- Shuffle phases so mangled sounds have same frequency content, but are unrecognizable.



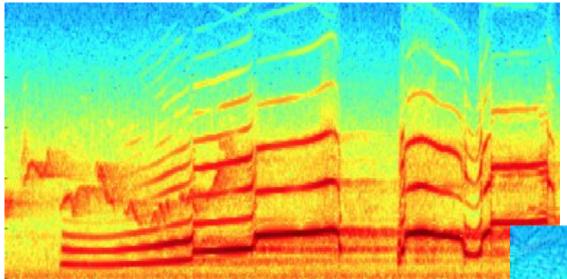


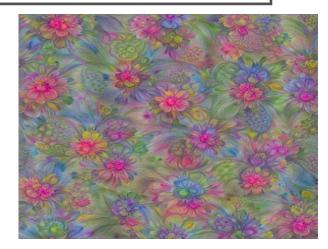
- Sonic context effects for both perceptual and conceptual aspects
- Specific N400 priming effect that suggests within-modal (sound) conceptual priming effect
  - (can't completely rule out verbalization, but doesn't appear to be present)

### So new sounds for music, then!

- Representations
- Synthesis algorithms
- Sound space navigation
- Physical interaction
- Goals
  - Complexity of natural sounds ("realism")
  - Real-time (not just a matter of speed)

# Style Transfer? Spectrograms are 2D images



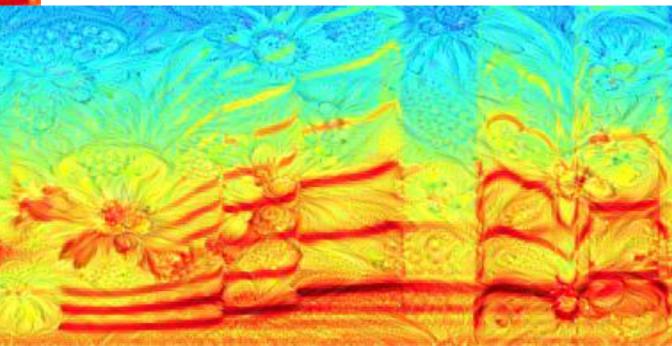


#### Issues?

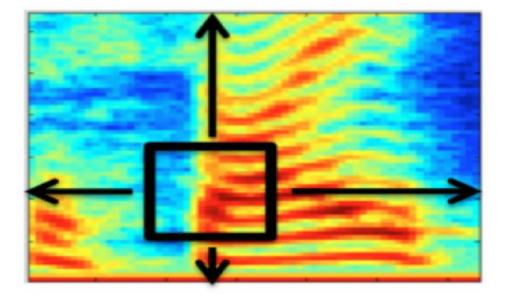
#### Representation

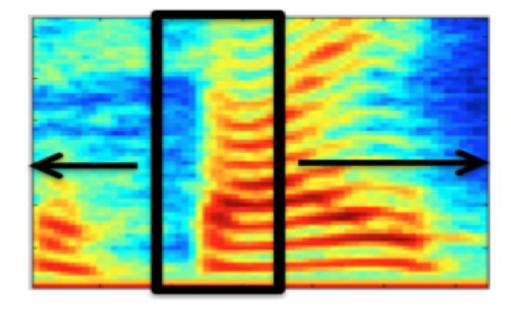
Time

Parameterization



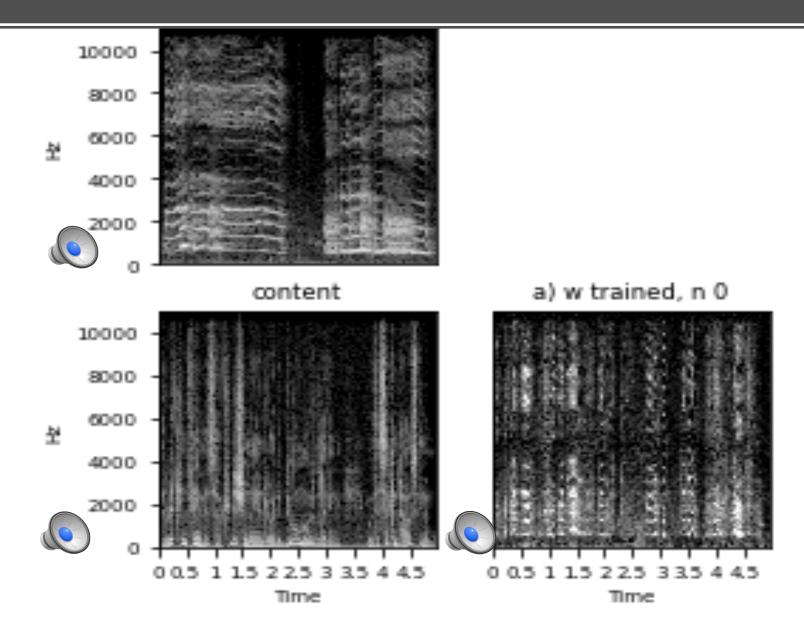
#### 2D vs 1D convolution





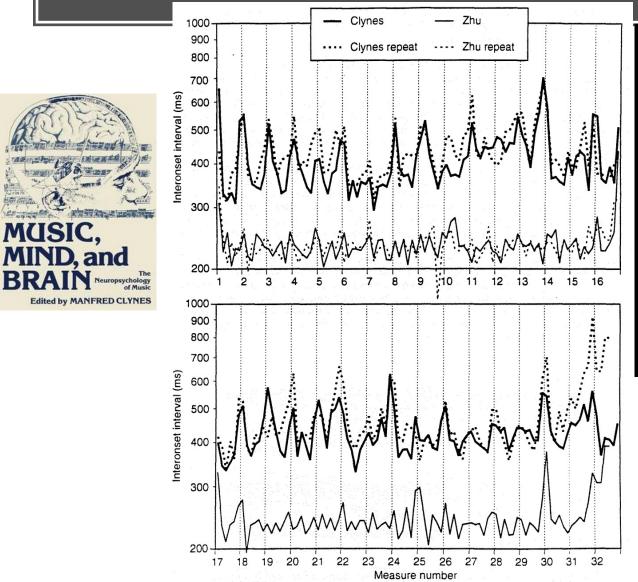
Anand, N. and Verma, P. (2016)

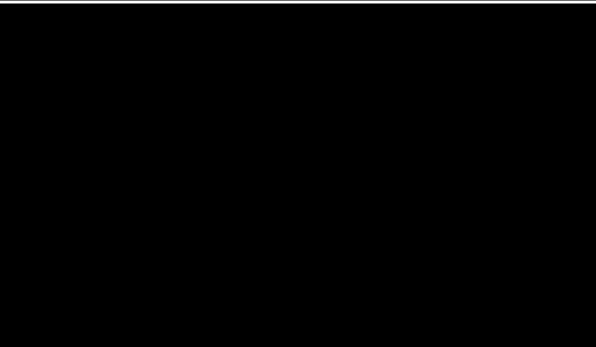
## Using multi-layer audio-trained networks



But what is content and style in music?

#### The Composer's Pulse, Manfred Clynes (1983 ...)





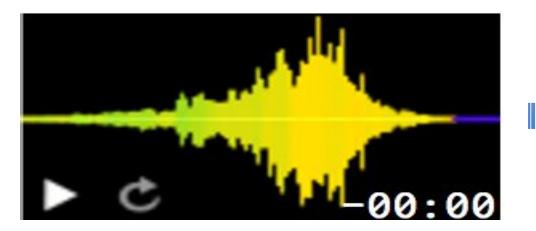
Expressive timing profiles of Goldberg Variation 6, played by Manfred Clynes and Xiao-Mei Zhu

# Style & content

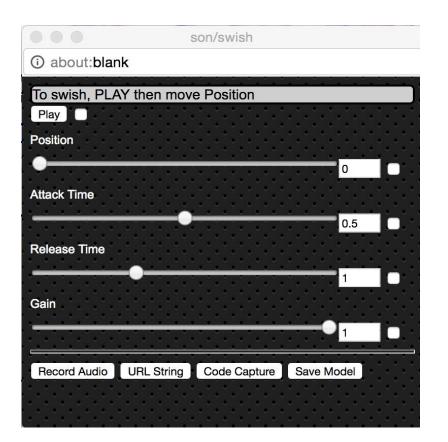
- Speech
  - Content words (which stand in for their meaning)
  - Style prosodic elements
    - Pitch, rhythm, amplitude, timbre
- Music
  - ?????
  - Arnold Schoenberg's timbre-structure "tone poems"
  - What are the "units"

#### Objective: Data-driven sound modeling

- Provide sound examples and desired interaction
- Get parameterized synthesis model



Lyrebird.ai – train on your voice, Type text to synthesize

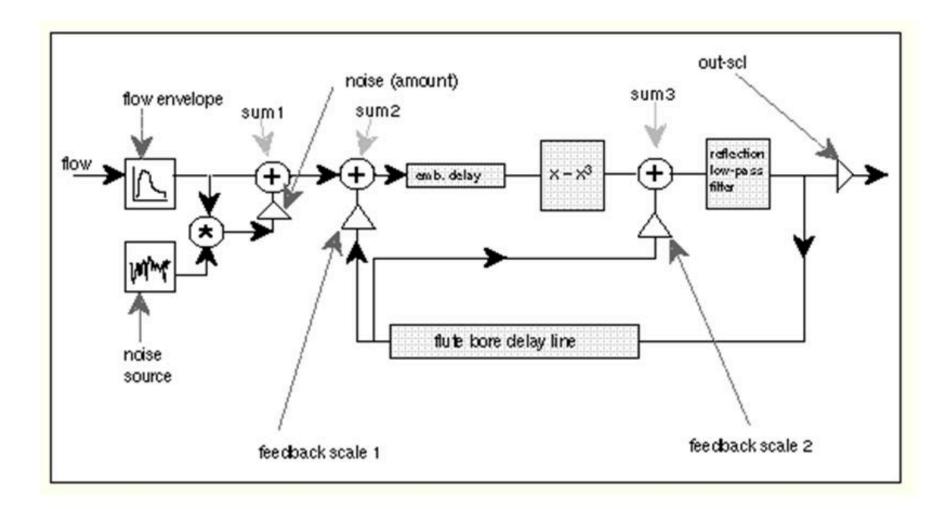


# Traditional Sound Modeling similar to speech

- Physical modeling
- Acoustic modeling
- Concatenative synthesis
- However, for musical models/instruments,
  - Not just sonic space, but Control
    - Arbitrary (even configurable), many different kinds, real time,
    - Dislocation of causality
  - Want different models for different classes of sounds
  - Want different models for the \*same\* class of sounds
  - Will never have all the models we need for musical purposes ("composed instruments")

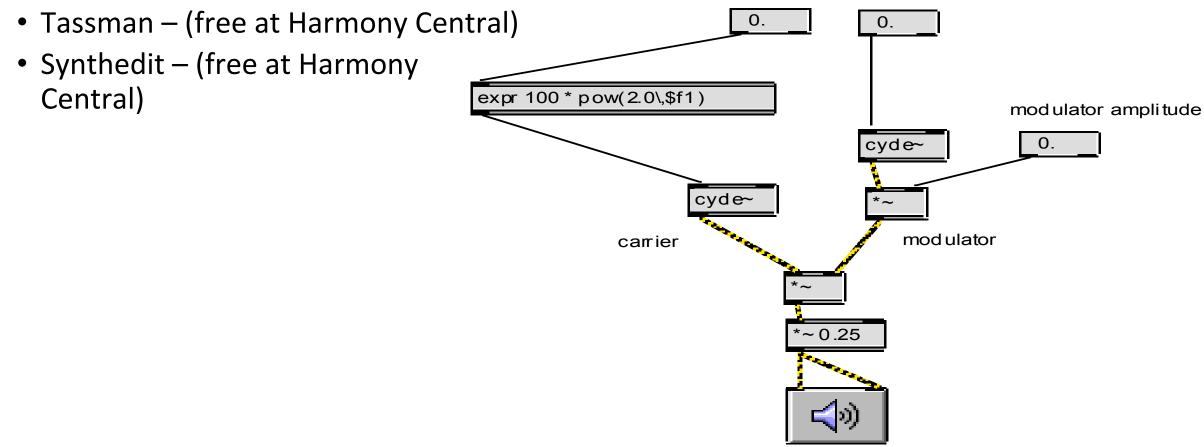
#### Waveguides

#### Physical Model of a Flute:

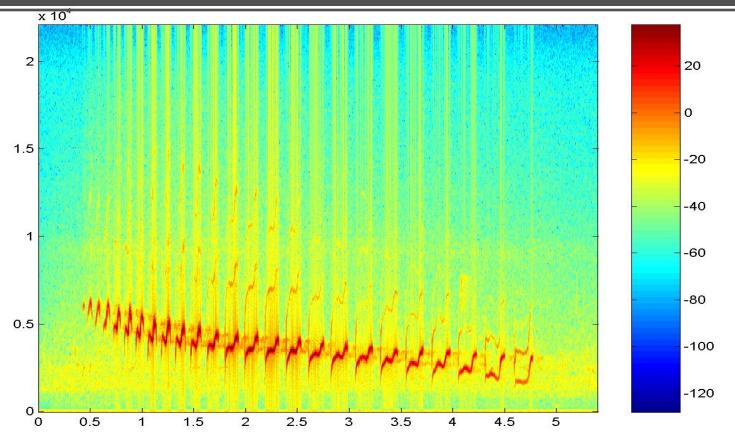


## Acoustic Modeling

- Modular Synths
  - Max/MSP from Cycling '74



#### Canyon Wren Spectrogram

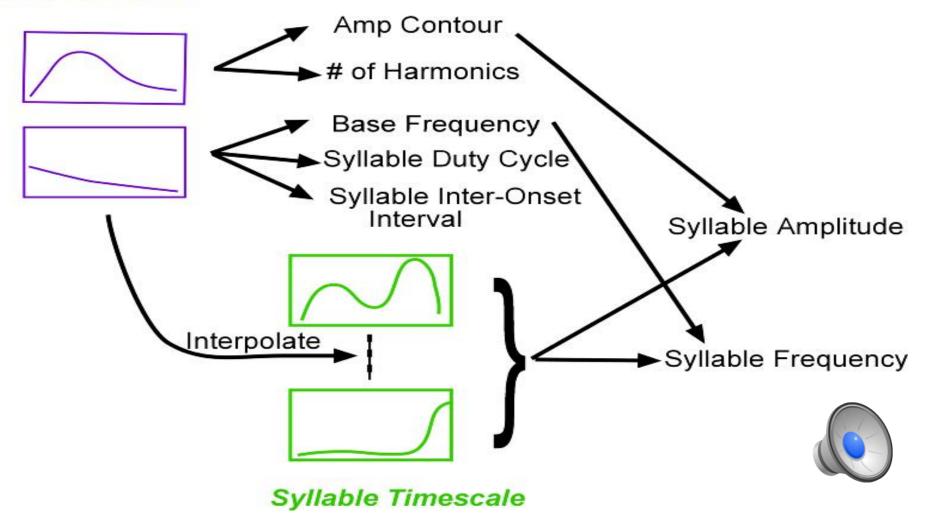


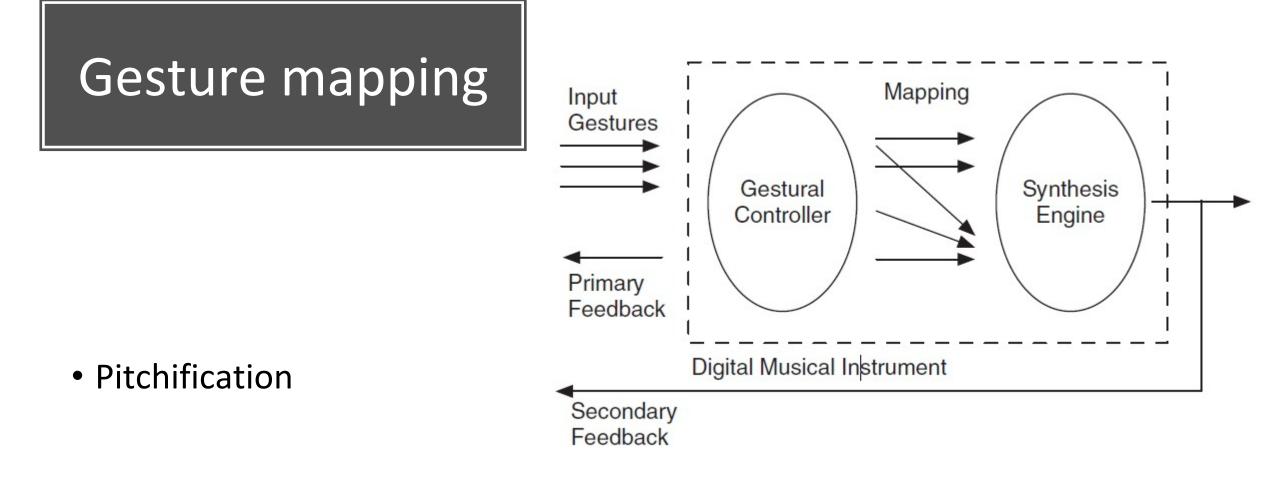
- Central pitch contour
- Harmonic contour
- Chirp frequency contour & "meta" contour



#### Model Structure

Motif Timescale



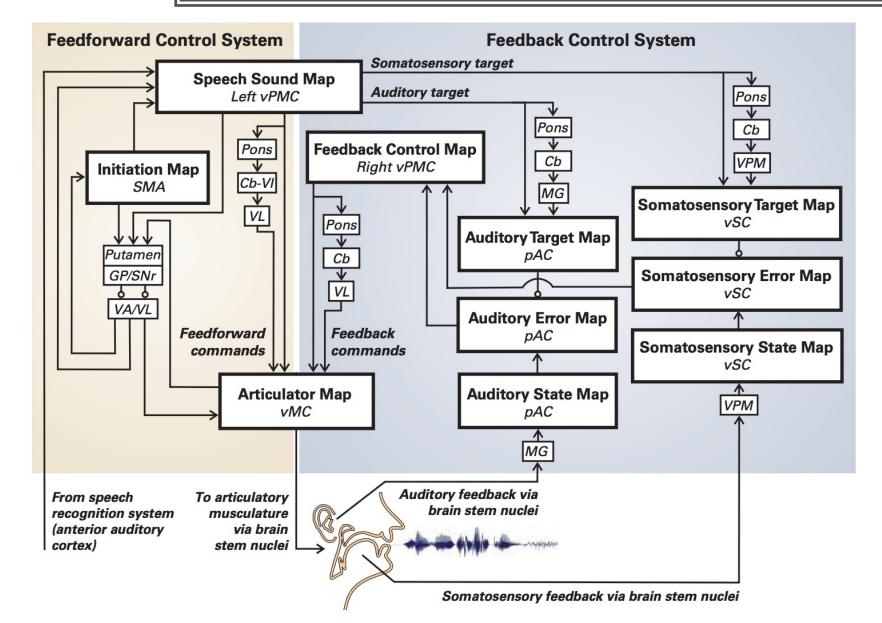


• Wekinator

Miranda & Wanderly (2006)

Fiebrink, R. A. (2011). Real-time human interaction with supervised learning algorithms for music composition and performance. Princeton University.

## DIVA and its decedents



Neural speech model.

Articulatory synthesizer.

Learns by babbling.

Frank Guenther, Boston University

Neural Control of Speech (2016) MIT Press

### So many controls, so few hands!



VCI4DMI

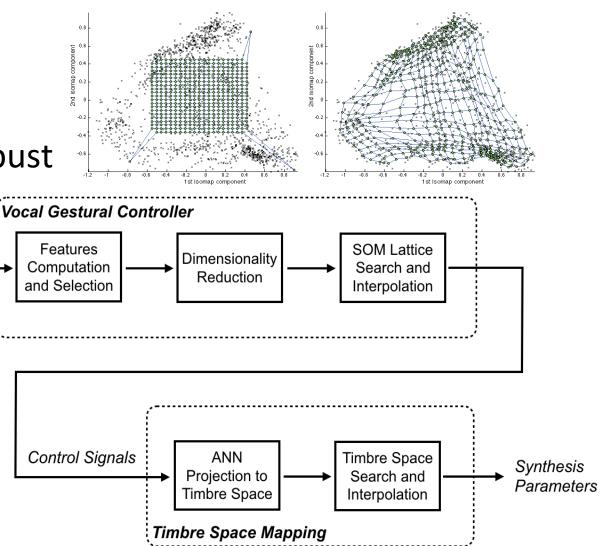
S. Fasciani and L. Wyse. "Vocal control of sound synthesis personalized by unsupervised machine listening and learning," Computer Music Journal, 24:1, 2018

### Voice mapping

Voice

Input

- User provides vocal sounds to be used
  - (voice and gesture customizable)
- Large set of features extracted, most robust chosen
  - Noisy features are discarded
  - Compute intrinsic dimensionality
  - SOM to cover space
- User provides synth (with params)
  - Learn gestures-> sonic features
  - Map sonic features->synth params



### In action

- Hands+voice
- Voice only
- Exposed voice



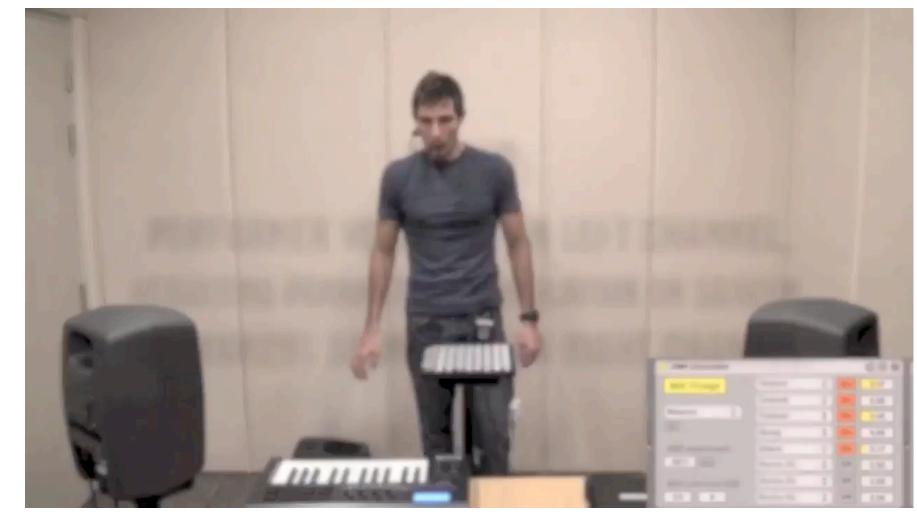
### In action

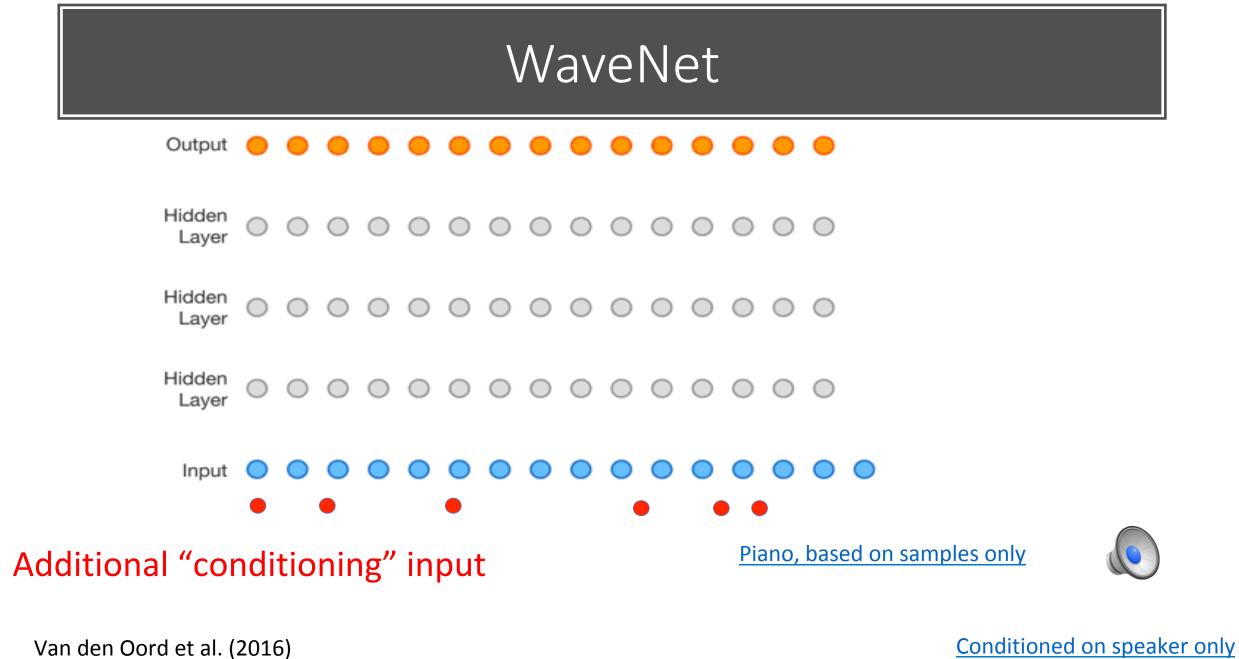
- Hands+voice
- Voice only
- Exposed voice



### In action

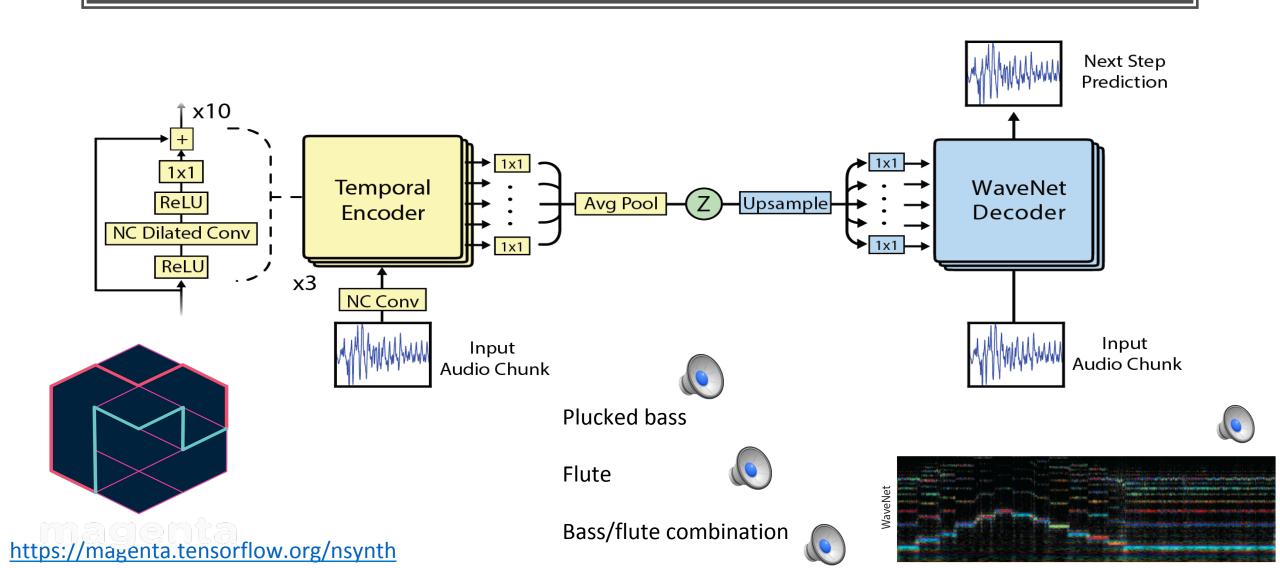
- Hands+voice
- Voice only
- Exposed voice



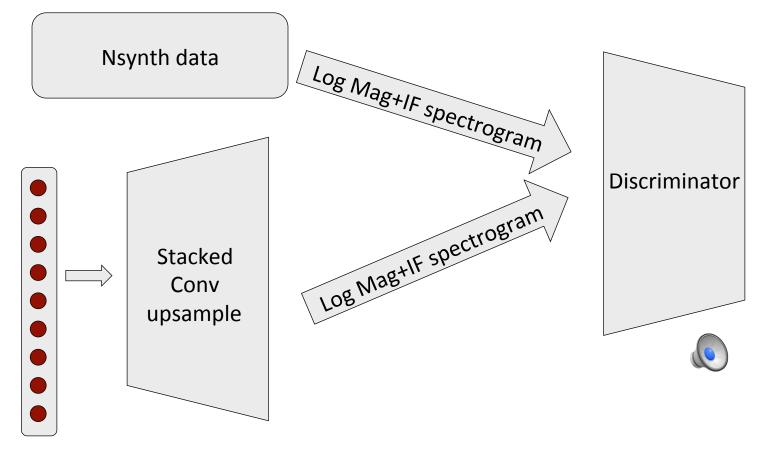


Conditioned on speaker only Conditioned on speaker & phonemes

# NSynth



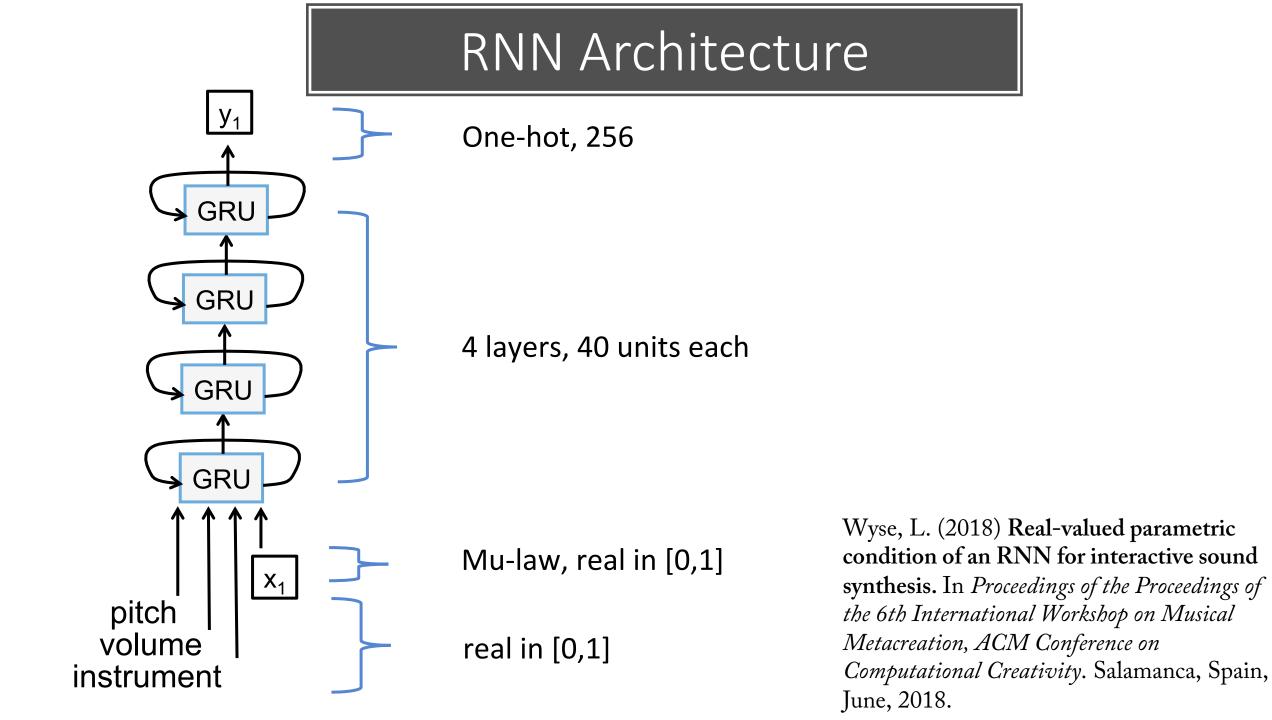
### GANSynth



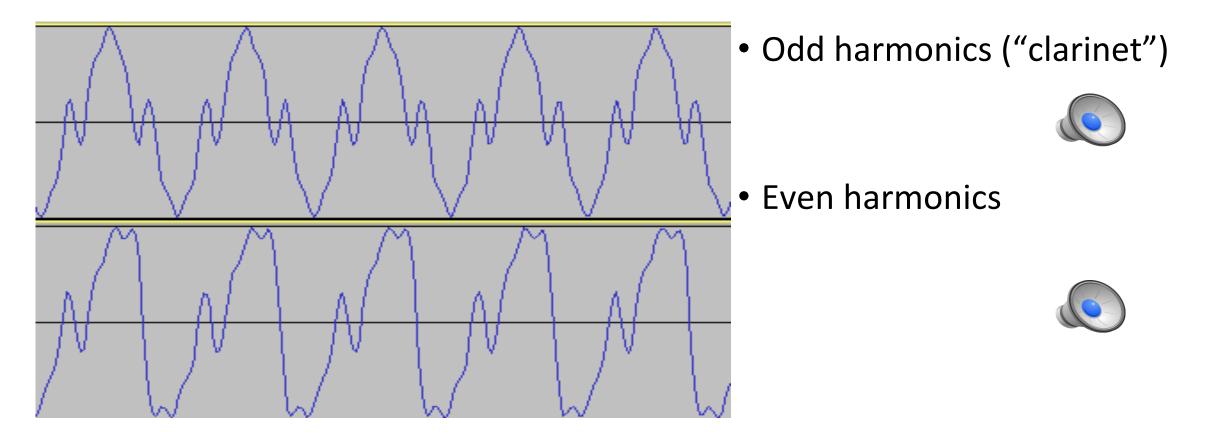
256 noise + one-hot pitch label

Engel, J., Agrawal, K. K., Chen, S., Gulrajani, I., Donahue, C., & Roberts, A. (2019). Gansynth: Adversarial neural audio synthesis. arXiv preprint arXiv:1902.08710.





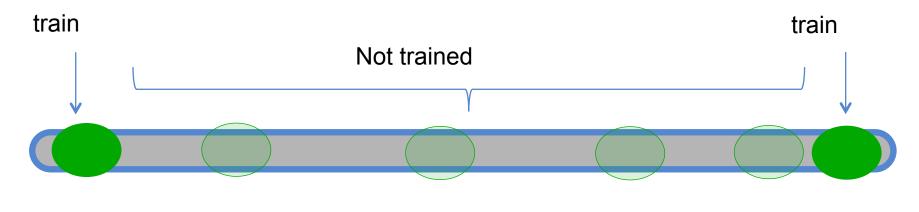
## 1<sup>st</sup>: Synthetic signals



Waveform looks the same at all pitch values

## Extreme generalization test



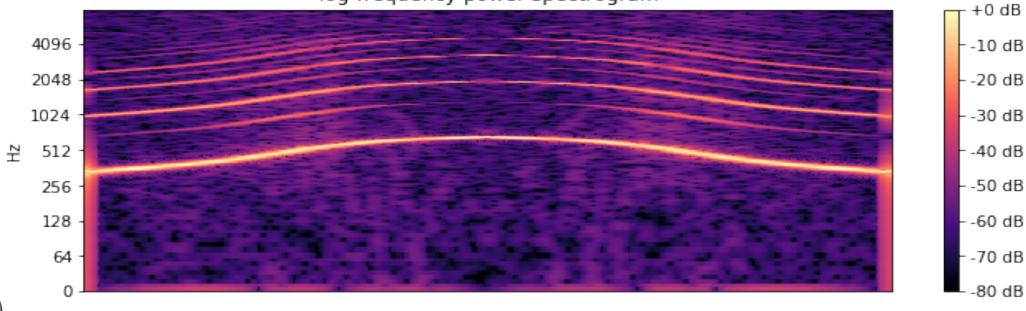


**Pitch Parameter** 

### Generalization

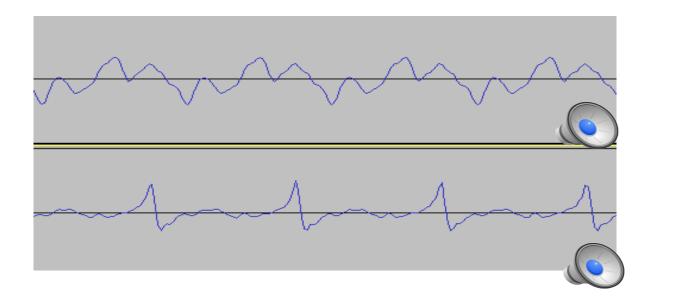
Train: two synthetic instruments,

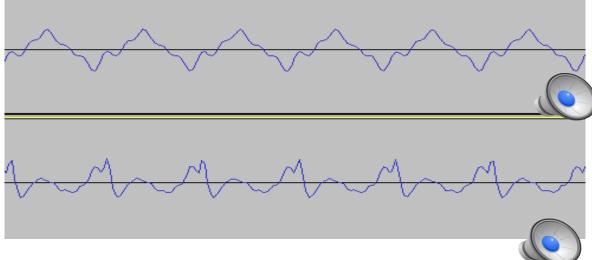
Two pitches, an octave apart: E4, E5



#### log-frequency power spectrogram

### Nsynth acoustic data





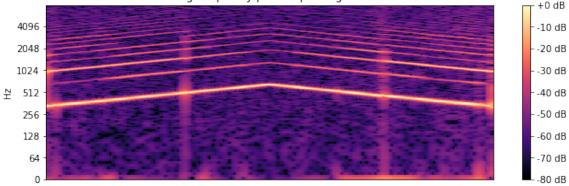
- Waveforms change with instrument
- Waveforms change with pitch

### Training on steady-state pitches

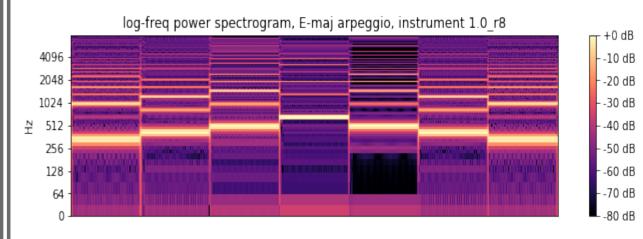


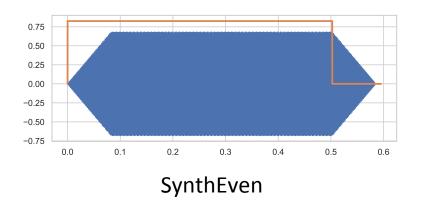
## Generalization (synthesize between chromatic pitches)

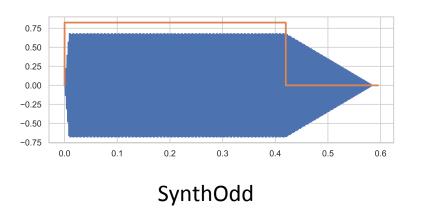
log-frequency power spectrogram



#### Responsive (unseen sequences)

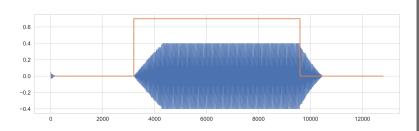


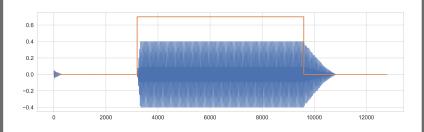


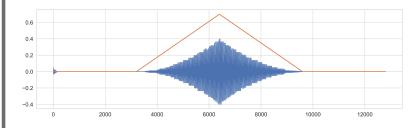


### Transients

- Implicit Not directly controlled by a parameter but is a response to a change in (volume) parameter
- Parameter disconnect Non-instantaneous response to control parameter - forms over time







# Synthesis results

### Next up : textures

- Noisy
- Difficult distributions
- Parameter identification and labeling challenges (and opportunities)
- But a huge class of musically useful sound

## Challenges for sense making

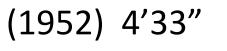
- No "units" or "atoms" (like notes) to break everything down in to. A structural element might not even be "a sound".
- No objective typology
- New listening strategies
  - What is pertinent (and what irrelevant) depends upon the listening strategy adopted.
- Analysis needs to reveal the inner mechanics of a work "in text", but also its relationship to the outside world.

## Models based Listening

- Spectromorphology
- Gesture surrogacy
- Michel Chion listening modes
  - Causal,
  - Semantic,
  - Reduced
- Transformational (variations)
- Models based Listening
  - When a listener engages in model building as a listening strategy, the model is "generative". There are sounds/behaviors they could make but haven't yet.
  - Perhaps more importantly, sounds/behaviors they would not make.

## John Cage



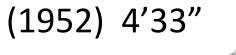


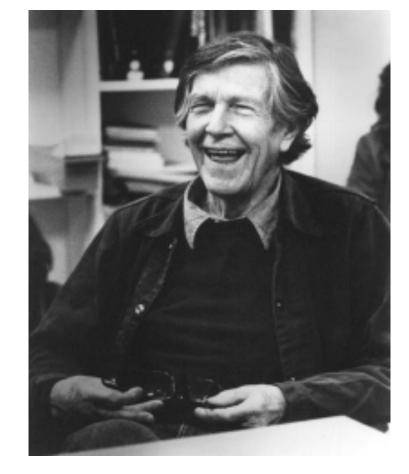
#### Turing test?



## John Cage





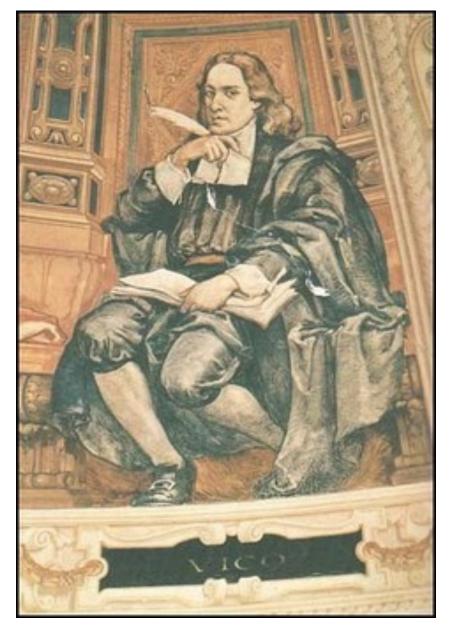


#### Turing test?

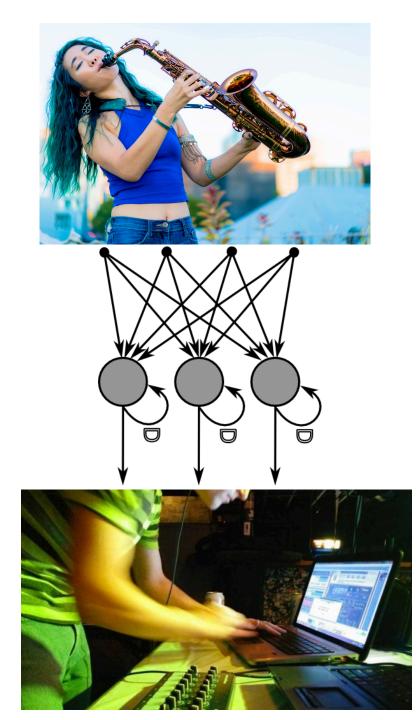
Talk about "out of distribution"

### Metaphor and sense-making

- Meaning as an active process
- The origins of language
- \*Start\* speech understanding with the prosodic/musical elements only, add the words later....



Giambattista Vico (1668-1744) : "The origin of language is metaphor"



# Thank you

Please contact me about PhD funding opportunities

Lonce.wyse@nus.edu.sg