## Models in Hearing

All models are wrong but some are useful.
-Box (1979)

What is a model?
Why model?
Models in hearing
The example of Pitch

## What is a model?

"a thing that represents a thing in a way that is useful"

--> theory, analogue, map, metaphor, schema, simulation...
"The best material model of a cat is another, or preferably the same, cat" (Norbert Wiener, 1945).
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not a very useful concept...


Figure 3. Johannes Müller built this model of the middle ear to convince himself that sound is transmitted from the ear drum (c) via the ossicular chain (g) to the oval window ( $f$ ), rather than by air to the round window (e) as was previously thought. The model is obviously "false" (the ossicular chain is not a piece of wire) but it allowed an important advance in understanding hearing mechanisms (Müller 1838; von Békésy and Rosenblith 1948).
...In that Empire, the Art of Cartography attained such Perfection that the map of a single Province occupied the entirety of a City, and the map of the Empire, the entirety of a Province. In time, those Unconscionable Maps no longer satisfied, and the Cartographers Guilds struck a Map of the Empire whose size was that of the Empire, and which coincided point for point with it. The following Generations, who were not so fond of the Study of Cartography as their Forebears had been, saw that that vast Map was Useless, and not without some Pitilessness was it, that they delivered it up to the Inclemencies of Sun and Winters. In the Deserts of the West, still today, there are Tattered Ruins of that Map, inhabited by Animals and Beggars; in all the Land there is no other Relic of the Disciplines of Geography.

Jorge Luis Borges (1946), "On exactitude in Science"
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## "all good models are wrong" (D.O. Hebb)

- Model $\neq$ reality
- belong to different spaces
- the quality of fit is multidimensional
- an "ecology" of models?
- "biodiversity" of models
- competition ( $\rightarrow$ "survival of the fittest")
- "ecological niche" ( $\rightarrow$ protect new ideas)
- "speciation" ( $\rightarrow$ new theories)
how to recognize a good model?
- internally consistent
- good fit with world
- easy to understand and handle
- few parameters (Occam's razor)
- able to generalize \& predict

The metric depends on how these criteria are weighted. The "fit score" depends on which aspect of the data is judged to be most important.

$$
\rightarrow \text { no "best" model }
$$

## a plea for multiple models

The idea is simply to carry around in your head as many formulations as you can that are self-consistent and consistent with the empirical facts you know. Then, when you make an observation or read a paper, you find yourself saying, for example, "Well that certainly makes it look bad for the idea that sharpening occurs in the cochlear excitation process".


Helmholtz (1967)
sensory information is matched to an internal model of the outside world.



Alhacen (c.a. 1030)
modelmaking is analogous to perception

## Why model?

- gain intuitive understanding
- organize \& summarize knowledge ( $\rightarrow$ "theory")
- generate predictions
- design experiments
- communicate ideas

many types of model:
- material model
- computer model
- animal model
- theoretical
- metaphorical


Example 1: water-filled cochlear model


## Example 2: model of detection at threshold

question: does brain state affect sensory processing? experiment: mesure EEG during behavioral task stimulus: random series of tone pips, variable signal-to-noise ratio task: detect pips

adaptive procedure: SNR varied to converge on $50 \%$ success
hypothesis: threshold fluctuates with brain "state"
"Sanity check" before running the experiment:

- "model listener" with no state, i.e. that performs the task only on the basis of the instantaneous SNR, compare to real listeners

- if "state" hypothesis is true, correlations should be greater for listeners
- correlelations differ $\rightarrow$ OK to proceed with experiment

Example 3: animal and computer models of human hearing impairment

- Aim: understand hearing impairment in humans.
- Hypothesis: degraded phase-locking in auditory nerve (cf cours de Christian Lorenzi)
- To test the hypothesis, we record from hearing-impaired guinea pigs (= animal model).
- To understand the recorded patterns, we use a computer model of guinea pig CN cells.
- To drive that model, we need a computer model of auditory-nerve fiber spike generation.
- To calibrate that model, we use real data from guinea pig auditory nerve fibers, etc...


## measured and modeled CN cell responses:



Goodman et al. 2018

## Pitch models

## What is pitch?

## everyday definition:

"pitch is the stuff of which music is made"


## psychological definition:

"that attribute of auditory sensation in terms of which sounds may be ordered on a scale extending from low to high"

## ANSI (1973)

## psychophysical definition:

"that attribute of auditory sensation, related to the frequency of a periodic sound, in terms of which sounds may be judged as dull or sharp according to whether the frequency is low or high

## AFNOR (1977)

The quantitative relation between pitch and frequency was established by Mersenne, (1636)

## Some facts

## pure tone frequency discrimination limens:



Fig. 4.2 Frequency difference limens (smallest detectable relative frequency difference) for pure tones. Each curve is for a different stimulus duration (in ms ). Discrimination is best for frequencies near 2 kHz and degrades rapidly above 4 kHz . Discrimination is better for longer durations. From Moore (1973) with permission.

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## lower limit of melodic pitch:



FIG. 1. Schematic of the melody task used in all experiments.
Pressnitzer et al 2001


## other properties of pitch:

H phase insensitive (Ohm's law)
at least for complexes with harmonics of low rank
H stable over wide range of amplitudes
a few \% shift for pure tones, less for complex
It stable over wide range of durations
slight shift for very short stimuli
overall: pitch is highly invariant to changes over stimulus dimensions other than FO


Pitch is an abstraction, a many-to-one mapping

## How do we explain pitch?

## How do we explain pitch?

4 main theories:

- place
- time
- pattern-matching
- autocorrelation

2 things to explain:

- exquisite sensitivity
- invariance



## problems with place...



## problems with place...


peak of spectrum?
$\rightarrow$ fails if multiple peaks

## problems with place...



## peak of spectrum?

$\rightarrow$ fails if multiple peaks
highest peak?

## problems with place...



## peak of spectrum?

$\rightarrow$ fails if multiple peaks
highest peak?
$\rightarrow$ fails if harmonic stronger

## problems with place...



## peak of spectrum?

$\rightarrow$ fails if multiple peaks
highest peak?
$\rightarrow$ fails if harmonic stronger
first peak?

## problems with place...


peak of spectrum?
$\rightarrow$ fails if multiple peaks
highest peak?
$\rightarrow$ fails if harmonic stronger
first peak?
$\rightarrow$ fails if missing fundamental

## problems with place...


peak of spectrum?
$\rightarrow$ fails if multiple peaks
highest peak?
$\rightarrow$ fails if harmonic stronger
first peak?
$\rightarrow$ fails if missing fundamental spacing between partials?

## problems with place...




Ernst G Wever
2. Time

interval between pulses $\rightarrow$ pitch

## problems with time...


markers on peaks?
inter-marker interval
$\rightarrow$ period $\rightarrow$ pitch

## problems with time...


markers on peaks?
$\rightarrow$ fails if multiple peaks
inter-marker interval
$\rightarrow$ period $\rightarrow$ pitch

## problems with time...


markers on peaks?
$\rightarrow$ fails if multiple peaks markers on biggest peaks?
inter-marker interval
$\rightarrow$ period $\rightarrow$ pitch

## problems with time...



## markers on peaks? <br> $\rightarrow$ fails if multiple peaks markers on biggest peaks? <br> $\rightarrow$ fails if multiple "biggest"

inter-marker interval
$\rightarrow$ period $\rightarrow$ pitch

## problems with time...


inter-marker interval
$\rightarrow$ period $\rightarrow$ pitch

## markers on peaks? <br> $\rightarrow$ fails if multiple peaks

markers on biggest peaks?
$\rightarrow$ fails if multiple "biggest"
markers on zero crossings?

## problems with time...



## markers on peaks? <br> $\rightarrow$ fails if multiple peaks markers on biggest peaks? $\rightarrow$ fails if multiple "biggest" markers on zero crossings? <br> $\rightarrow$ fails if more than one

inter-marker interval
$\rightarrow$ period $\rightarrow$ pitch


## 3. Pattern matching


harmonic pattern matcher

earlier roots: Helmholtz, Alhazen (11 th century)

## Pattern matching



## Pattern matching



## Pattern matching



## Pattern matching



FO

## Pattern matching




## Autocorrelation



Fig. 1. - Dasic schema of neuronal autocorrclator. A is the input

## Autocorrelation

$$
x(t)
$$

- acoustic waveform
(pressure function of time)


## Autocorrelation

## $x(t) x(t-\tau)$

time lag

- acoustic waveform (pressure function of time)
- delay it, multiply with original


## Autocorrelation

$$
A_{t}(\tau)=\sum_{W} x(t) x(t-\tau)
$$

- acoustic waveform (pressure function of time)
- delay it, multiply with original
- sum over a time window


## Autocorrelation



$$
A_{t}(\tau)=\sum_{W} x(t) x(t-\tau)
$$

integration window

## Autocorrelation



$$
A_{t}(\tau)=\sum_{W}^{\substack{\text { product time lag }}} \underset{\substack{\text { "shift and compare" }\\}}{ } x(t) x(t-\tau)
$$

integration window


## Pros \& cons:

## place:

- time honored (Duverney, Helmholtz, von Békésy), gives role to cochlea
- only works for pure tones


## time:

- time honored (Nicomachus, Rutherford, Wever)
- phase-sensitive, "brittle", no role for cochlea


## pattern matching:

- works for all stimuli (if partials can be resolved)
- requires extra "pattern matching" stage, fails if partials can't be resolved


## autocorrelation:

- works for all stimuli
- no neural correlate found, can't explain all aspects of psychophysics


## Summary:

- pitch $\longleftrightarrow$ FO (mainly)
- exquisite discrimination (~0.2 \%)
- invariant to other dimensions
- still not sure how it is perceived


## Some mysteries

## relative vs absolute pitch

- most are sensitive to pitch interval (FO ratio)
- few are sensitive to absolute pitch (FO) all of our models predict absolute pitch...
absolute pitch:

often associated wit

sometime associat
Complex tones

one aspect of inter


## multiple pitches

a stimulus sometimes evokes multiple pitches:

- ambiguous pitch
- concurrent pitches
our models assume a single pitch...


## multiple pitches

throat singing:


O
courtesy Tran Van Quai
polyphony:


Bach"s musical offering (orchestrated by Webern)

## effect of context

- pitch, interval depend on context
- harmonic
- melodic
- tonality (related to pitch?)
our models are mostly context-blind...


## effect of context

You will hear a sequence of tones, a short pause, and then two final tones.
Does the pitch go up or down between the two final tones?



last two tones are physically identical!

Conclusion

- Pitch is important
"Pitch perception is considered to represent the heart of hearing theory, and is, without doubt, the topic most discussed over the years" (Plomp, 2002)
- Many models:
place, time, pattern matching, autocorrelation
-Still no consensus! (after more than 100 years...)
-Pitch probably involves:
- temporal fine structure
-     + peripheral filtering
-Pitch is complex:
many aspects (harmony, context, individual differences, absolute/relative pitch) do not fit any simple model


Abstraction today is no longer that of the map, the double, the mirror or the concept. Simulation is no longer that of a territory, a referential being or a substance. It is the generation by models of a real without origin or reality: a hyperreal. The territory no longer precedes the map, nor survives it. Henceforth, it is the map that precedes the territory - precession of simulacra - it is the map that engenders the territory and if we were to revive the fable today, it would be the territory whose shreds are slowly rotting across the map. It is the real, and not the map, whose vestiges subsist here and there, in the deserts which are no longer those of the Empire, but our own. The desert of the real itself.

- Definition of a model. Model $\neq$ World (Borges). The only good model is a false model.
- Modeling as metaphor of perception: Alhacen, Helmholtz, Bayesian theories. Up meets Down.
- Why model? Intuitive understanding. Theory. Organize past knowledge. Behavior model (design \& interpret experiments). Computer model (Dan's AN work). Animal model. Mathematical model.
- How to judge a model?
- Models in hearing. Pitch.
- Summary: Perception is model-based. Understanding is model-based. Model quality criteria multidimensional. Fit is not most important (issue with falsifiability). Toolbox of models.
Material/Animal/Computer/Mathematical/etc.



## 1025 The Effect of Context in the Perception

 of an Ambiguous Pitch StimulusClaire Chambers ${ }^{1}$, Daniel Pressnitzer ${ }^{1}$
${ }^{1}$ Ecole Normale Supérieure
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Tritone (1/2 octave) intervals are ambiguous: can be heard as going up or down.

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Same physical stimulus produces different percept according to context

## The resolvability issue



Bernstein \& Oxenham (2003)

good performance iff stimulus contains harmonics of low rank (< $\sim 10$ )
due to frequency resolution power of cochlea?

place estimation of partial frequencies fails if rank too high...
due to frequency resolution power of cochlea?

temporal estimation of partial frequencies fails if rank too high...

The coincidence between limit of cochlear resolution and performance limits strongly suggests pattern matching

BUT
pitch is nevertheless heard for stimuli with no resolved harmonics, which pattern matching cannot explain...


# 5. The dual-mechanism hypothesis 

resolved:

unresolved:

| 50 |  |
| :--- | :--- |
| 40 | autocorrelation |
| $==\geq$ pitch |  |

## Pro:

- works well (best of pattern matching and autocorrelation)
- predicts resolvability effects


## Con:

- too easy! (it's like adding parameters to a model)
- requires three mechanisms:
- pattern matching
- autocorrelation
- translation between the two...


## an alternative explanation:

The case of the missing delay lines: Synthetic delays obtained by cross-channel phase interaction

Alain de Cheveigné and Daniel Pressnitzer
Equipe Audition, FRE 2929, CNRS, Université Paris 5, ENS, 29 Rue d'Ulm, F-75230 Paris cedex 05, France

yet another model...

# Physiological basis 

2 potential ingredients:

- tonotopy,
- temporal fine structure


## Tonotopy


> required by place and place-based pattern-matching models

tonotopic pathway


## Phase-locking





required by time, time-based pattern-matching, and autocorrelation models
available at all levels in brainstem \& midbrain

potential sites: CN, MSO, DLPO, VNLL, etc. no definite evidence (yet)

## Future directions:

- new techniques in electrophysiology (multielectrode, optical, genetic)
- new techniques in brain imaging (fMRI, MEG, acoustic?)
- better attention to theory and artifacts



## Recent developments

- resolvability
- memory and context
- pitch beyond 5 kHz
- sharp selectivity in humans
- pitch of mixtures of tones


## memory and context:

1025 The Effect of Context in the Perception of an Ambiguous Pitch Stimulus<br>Claire Chambers ${ }^{1}$, Daniel Pressnitzer ${ }^{1}$<br>ARO 2011<br>${ }^{1}$ Ecole Normale Supérieure

On the binding of successive sounds: Perceiving shifts in nonperceived pitches ${ }^{\text {a }}$

Laurent Demany ${ }^{\text {b) }}$ and Christophe Ramos
Laboratoire de Neurophysiologie, CNRS and Université Victor Segalen (UMR 5543), 146 rue Leo-Saignat, F-33076 Bordeaux, France

J. Acoust. Soc. Am. 117 (2), February 2005

## temporal pitch beyond 5 kHz ?:



## Sensitivity of the human auditory system to temporal fine structure at high frequencies

Brian C. J. Moore ${ }^{\text {a) }}$<br>Department of Experimental Psychology, University of Cambridge, Downing Street, Cambridge CB2 3EB, England

Aleksander Sęk
Institute of Acoustics, Adam Mickiewicz University, 85 Umultowska, 61-614 Poznań, Poland and Department of Experimental Psychology, University of Cambridge, Downing Street, Cambridge CB2 3EB, England

3186 J. Acoust. Soc. Am. 125 (5), May 2009
The role of temporal fine structure information for the low pitch of high-frequency complex tones

Sébastien Santurette ${ }^{\text {a) }}$ and Torsten Dau
Centre for Applied Hearing Research, Department of Electrical Engineering, Technical University of
Denmark, DTU Bygning 352, Ørsteds Plads, 2800 Kongens Lyngby, Denmark



Pitch perception beyond the traditional existence region of pitch
Andrew J. Oxenham ${ }^{1}$, Christophe Micheyl, Michael V. Keebler, Adam Loper, and Sébastien Santurette Department of Psvcholoav. University of Minnesota. Minneapolis. MN 55455

Psychophysical assessment of the level-dependent representation of high-frequency spectral notches in the peripheral auditory system

Ana Alves-Pinto ${ }^{\text {a }}$ and Enrique A. Lopez-Poveda
Unidad de Audición Computacional y Psicoacústica, Instituto de Neurociencias de Castilla y León,
Universidad de Salamanca, Avenida Alfonso X "El Sabio" s/n, 37007 Salamanca, Spain

PNAS $\mid$ May 3, $2011 \mid$ vol. $108 \mid$ no. 18 | 7629-7634
$\qquad$ doi:10.1152/jn.00882.2004

Wiener-Kernel Analysis of Responses to Noise of Chinchilla Auditory-Nerve Fibers


Behavioral limits (frequency resolution, musical properties, absolute pitch) are usually associated with the limit of phase locking observed in animal models, around 5 kHz .

New studies question whether this limit is strict, or whether there is pitch beyond 5 kHz .

## Oxenham et al 2011:

Pitch Matching. In Experiment 1, our participants were asked to adjust the frequency of a pure tone until its perceived pitch matched that of a preceding reference complex tone (Fig. 2A).


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