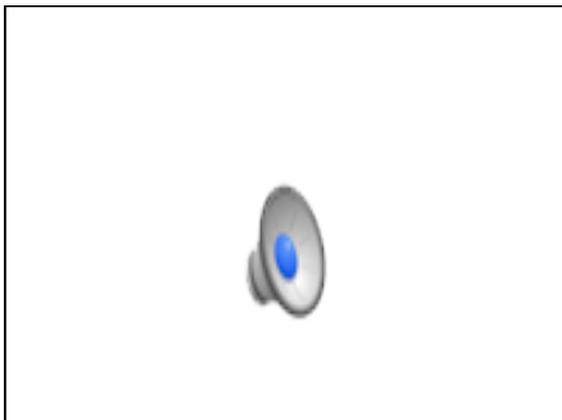


### Overview

- Biological background
- **Types of learning**
- Modern versions of learning



### Operant conditioning

- Other names
  - Instrumental learning
  - Trial-and-error learning
- Behavior that acts (“operates”) on the environment
- A **voluntary response** is encouraged by rewarding the response\*
  - \*This means the organism has to do the behavior at least occasionally to begin with

### Operant conditioning

Behavior	Consequence (Reinforce/Punish)	Outcome	Type of reinforcement
X	Appetitive (“good”) stimulus occurs 😊	+ behavior	Positive reinforcement 😊

### Operant conditioning

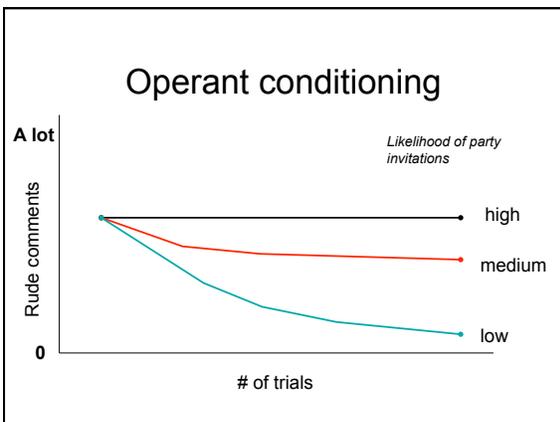
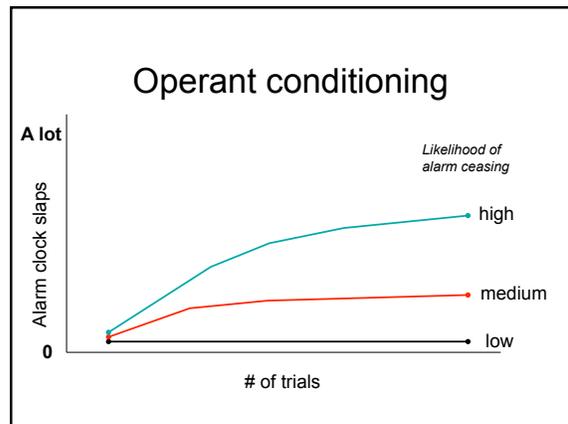
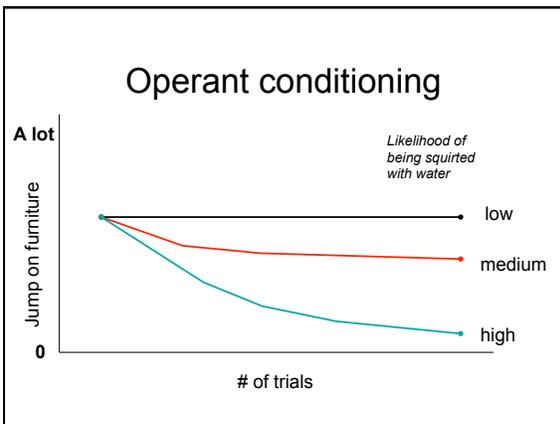
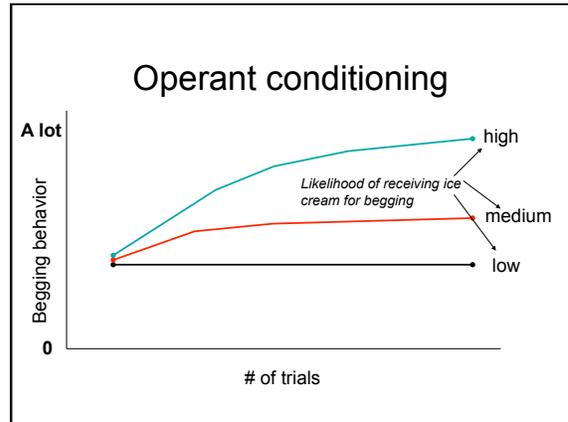
Behavior	Consequence (Reinforce/Punish)	Outcome	Type of reinforcement
X	Appetitive (“good”) stimulus occurs 😊	+ behavior	Positive reinforcement 😊
X	Aversive stimulus ends 🚫	+ behavior	Negative reinforcement 😊

### Operant conditioning

- **Reinforcers**
  - Primary reinforcers (food, water, mating)
  - Secondary reinforcers
    - Strong association with primary
    - E.g. **money**
- **Punishers**
  - Pain
  - Nausea
  - Darkness

## Operant conditioning

- In the lab
  - “Skinner box”
    - Behavior: keypeck, bar press
      - Pigeon/rat will do sometimes randomly
    - Reinforcement: food
    - (Or punishment, e.g. footshock or nausea)
    - Directly manipulate frequency of behavior by changing contingencies of behavior

## Paired associates

- Human analog to instrumental learning?
- Pair words, flashcard-style  
 (“car”-“coche”)  
 Stimulus → response → reward (good feeling when you guess right)
- Anticipate word 2 till it's readily recalled  
 – BUT bidirectional (word 2 --> word 1)

## Paired associates

- Each time a pair is learned, strengthened associations
- Learn nonwords--"new" associations
  - But depends greatly on existing knowledge

## Conditioning wrap-up

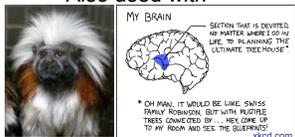
- Weaknesses of 'conditioning' approach
  - Ignore biological influences on behavior
  - Ignores role of top-down info (knowledge)
- Nonetheless, still useful in many practical contexts, including...

## Infant methods



- Definitely cognitive stuff going on.
- But how to investigate in non-verbal organisms?
- By looking at behavior.

### Also used with



## Learning

- Figuring out what things go together
- (And also what things *don't* go together)

- Lookattheprettybabyeveryone
- Whereisthebabynowprettygirl
- Thislittlebabyisprettygood

- Lookatthepretty**baby**everyone
- Whereisthe**baby**nowprettygirl
- Thislittle**baby**isprettygood
- ty->ba: unlikely (.33 transition probability)
- ba->by: likely (1.0 transition probability)
- by->ev: unlikely (.33)

- Lookatthepretty**ba**byeeveryone
- Whereisthebabynowpretty**girl**
- Thislittlebabyispretty**good**
- ty->ba: unlikely (.33 transition probability)
- ba->by: likely (1.0 transition probability)
- by->ev: unlikely (.33)

### Other cues to word boundaries

- Stress
  - English: most words are stress-initial
  - ThePRE**tt**yBAB**y**WANT**Sa**BO**tt**le

### Other cues to word boundaries

- Jusczyk, Houston & Newsome
  - 7.5. Months:
    - Familiarize infants with stress-initial words
      - KING**dom**
    - Play passages with KING**dom** vs. HAM**let**
    - Infants listen longer to kingdom >hamlet passages
    - **Recognize words**

### Other cues to word boundaries

- Jusczyk, Houston & Newsome
  - 7.5. Months:
    - Stress-initial OK
    - Familiarize with gui**TAR**
    - Test with gui**TAR**, sur**PR**ISE
    - No difference in looking times

### Other cues to word boundaries

- Jusczyk, Houston & Newsome
  - 7.5. Months:
    - Stress-initial (**king**dom) OK
    - Stress not initial (gui**tar**) XX

### Other cues to word boundaries

- Jusczyk, Houston & Newsome
  - 7.5. months:
    - Stress-initial (**king**dom) OK
    - Stress not initial (gui**tar**) XX
  - 10.5 months:
    - Stress not initial (gui**tar**) OK

### But...

- Not all languages have this kind of stress pattern.
- (Similar to the segmentation problem in object recognition--how do you know what the **properties** of objects/words are if you don't know what the objects/words are **themselves**???)

### Statistical learning

- Saffran, Aslin & Newport (1996)
    - 8-month-old infants
- golabubidakutupiropadotitupirobidakupad  
otigolabupadotibidakugolabutupiro  
golabupadotitupirobidakupadotibidakutu  
pirogolabupadotibidakugolabutupiro ...

### Statistical learning

- Saffran, Aslin & Newport (1996)
    - 8-month-old infants
- golabu**bidaku**tupiropadotitupiro**bidaku**pad  
otigolabupadotib**idaku**golabutupiro  
golabupadotitupiro**bidaku**padotib**idaku**tu  
pirogolabupadotib**idaku**golabutupiro ...

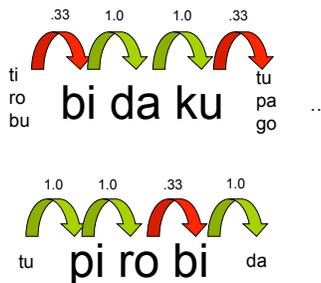
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### Statistical learning

- Saffran, Aslin & Newport (1996)
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otigolabupadotibidaku golabutupiro  
golabupadotitupiro bidakupadotibidaku tu  
pirogolabupadotibidaku golabutupiro ...

### Statistical learning



## Statistical learning

- Play for 2 minutes
- Present kids with bidaku or piro.bi type words
- What do they listen to longer?  
bidaku < piro.bi  
– (novelty preference)
- *At 8 months infants can segment words based on statistical cues*

## But what about stress?

- BRILlig|SLIthy|TOVES.

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- Johnson & Jusczyk (2001)
  - 8-month-olds
  - Stress vs. statistics: Stress wins

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  - Statistics wins @ 7 mos
  - Stress wins @ 9 mos

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  - Statistics wins @ 7 mos
  - Stress wins @ 9 mos
- *Segmentation precedes stress.*

## Statistical learning

- What's getting learned?
  - Frequency
    - Thedog > hassock
    - But "thedog" isn't a word, and hassock is (srsly)
  - *Conditional* probability
    - Given X, Y is \_\_\_ likely to happen
    - *Predictiveness*
- Aslin, Saffran & Newport (1996)

## Statistical learning

- What's getting learned?
  - Aslin, Saffran & Newport (1996)
    - golabu/padoti 2x as often as tupiro/bidaku
    - So ti.gola is as frequent as bidaku (45x each)
    - But

1.0 1.0  
bi->da->ku  
.33 1.0  
ti->go->la

## Statistical learning

- What's getting learned?
  - Aslin, Saffran & Newport (1996)
    - golabu/padoti 2x as often as tupiro/bidaku
    - So tiba.go is as frequent as bidaku (45x each)
    - 3 min of listening; then test

Frequency: 1.0 1.0  
= bi->da->ku  
.33 1.0  
ti->go->la

Cond. prob.:  
<

## Statistical learning

- Infants are indeed learning conditional probabilities, not just frequency.

## Language specificity?

- Works for language
- Works for tone sequences (C-C#-G...)
- Works for visual stuff
- Rats do it
- Babies, kids, adults do it
- **Parallel results: language and music**
- **Slightly differing: sound and sight**

## Nonadjacent dependencies

- Phenomenon in language
- Not only...but also
  - Either...or
  - Who...with?
  - Got \_\_\_\_ed
- Dependent on linguistic structure, or learnable from input?

## Nonadjacent dependencies

- Nonadjacent dependency learning:

## Nonadjacent dependencies

go<sup>1.0</sup> la<sup>1.0</sup> bu<sup>.33</sup> tu...  
<sup>.33</sup> pa...  
<sup>.33</sup> bi...

## Nonadjacent dependencies

go<sup>1.0</sup> la<sup>1.0</sup> bu<sup>.33</sup> tu...  
<sup>.33</sup> pa...  
<sup>.33</sup> bi...



## Nonadjacent dependencies

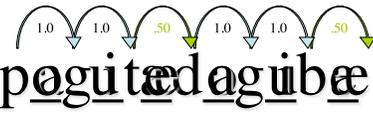
...gulodo bapate...



Syllables: No  
(Newport & Aslin, 2004)

## Nonadjacent dependencies

...pogitedagibæ...



Consonant->consonant  
Vowel->vowel  
(Newport & Aslin, 2004)

## Nonadjacent dependencies

- For nonadjacent speech information to be learned, the information must be of "like kind" (segment type, C or V)

## How do we know what sounds go together?

- Gestalt grouping cues (e.g. Bregman, 1990)
- Frequency of co-occurrence (e.g. Saffran, Aslin, Newport, 1996)

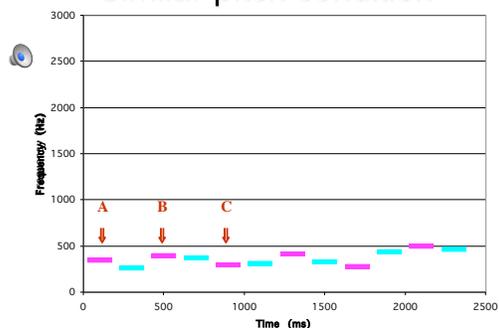
(Perception vs. learning, kind of)

**How do these types of information interact with each other?**

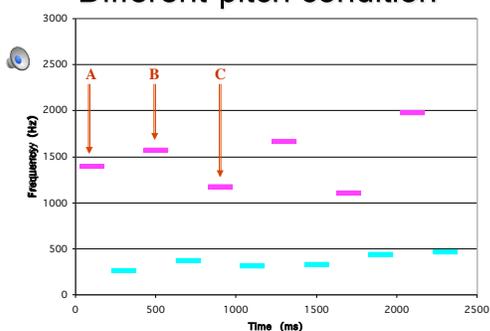
### Nonadjacent dependencies

- Creel, Newport & Aslin (2004)
  - Tones in two statistical groupings
  - Same or different pitch ranges
  - Streams interleaved
  - Two “words” (triplets)
- Group by statistics?
- Group by pitch range?

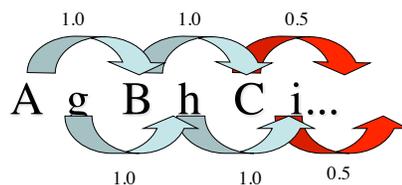
### Similar-pitch condition



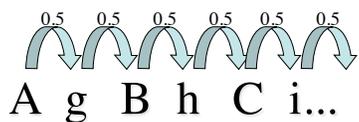
### Different-pitch condition



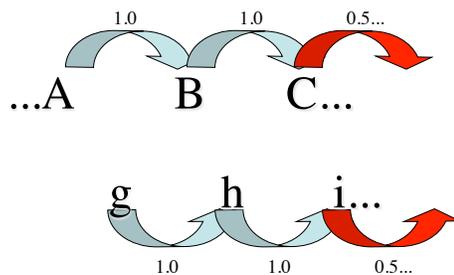
### Statistics

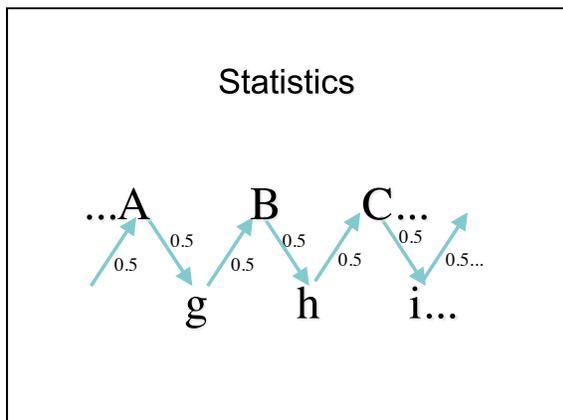


### Statistics



### Statistics





### Nonadjacent dependencies

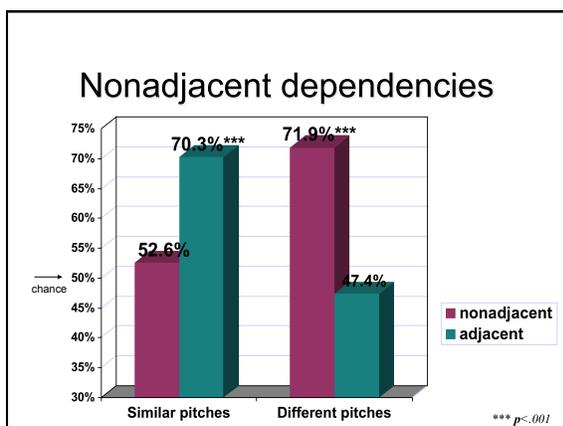
Test items

Nonadjacent items

- A\_B\_C\_ (triplet)
- \*E\_D\_F\_ (scrambled triplet)

Adjacent items

- CiAgBh (legal 6-tone sequence)
- \*FkDIEj (illegal 6-tone sequence)

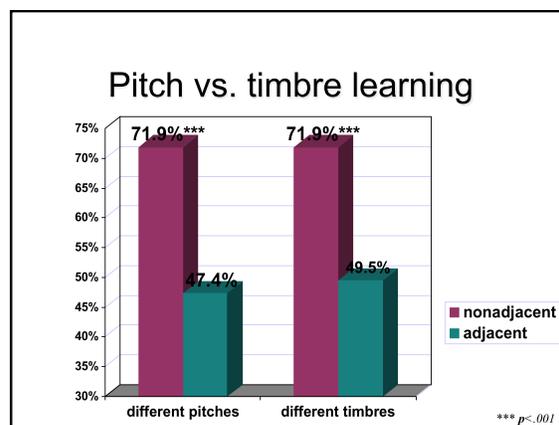
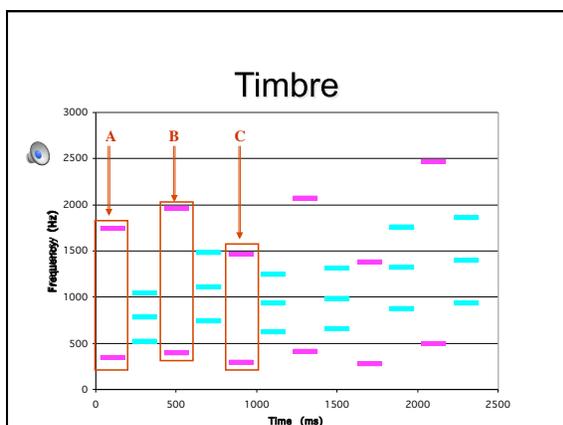


### Nonadjacent dependencies

Is high v. low the only grouping cue?

Redo different-pitch condition, but with complex tones of two different timbres

- Perceived fundamentals of each tone set in same frequency range
- Actual harmonics don't overlap



## Really like speech?

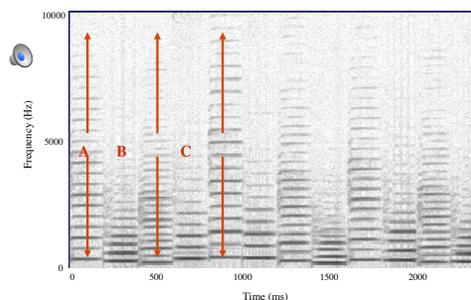
### All-or-none auditory effect?

- Could be a low-level perceptual phenomenon
- Not related to language-learning
  - Speech doesn't "fly apart" like that

### New timbre difference: flute vs. violin

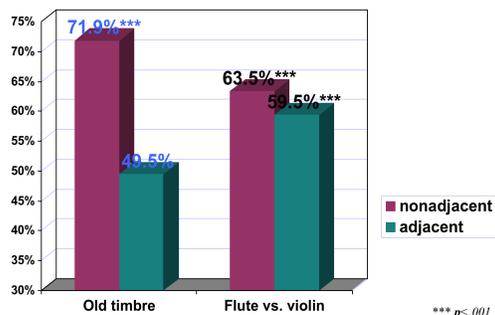
- Discernibly different but harmonics overlap

## Flute/violin



## Timbre

Learned both structures!



## Nonadjacent dependencies

- General auditory perceptual principles may constrain learning of both speech statistics and nonspeech statistics
- Similar effects across two domains
  - Within same modality

## Vision vs. audition

- Temporal sequences:
  - Audition better
- Simultaneous cooccurrence:
  - Vision better
  - But some auditory cooccurrences learned