



# Phonological Learning with Output-Driven Maps

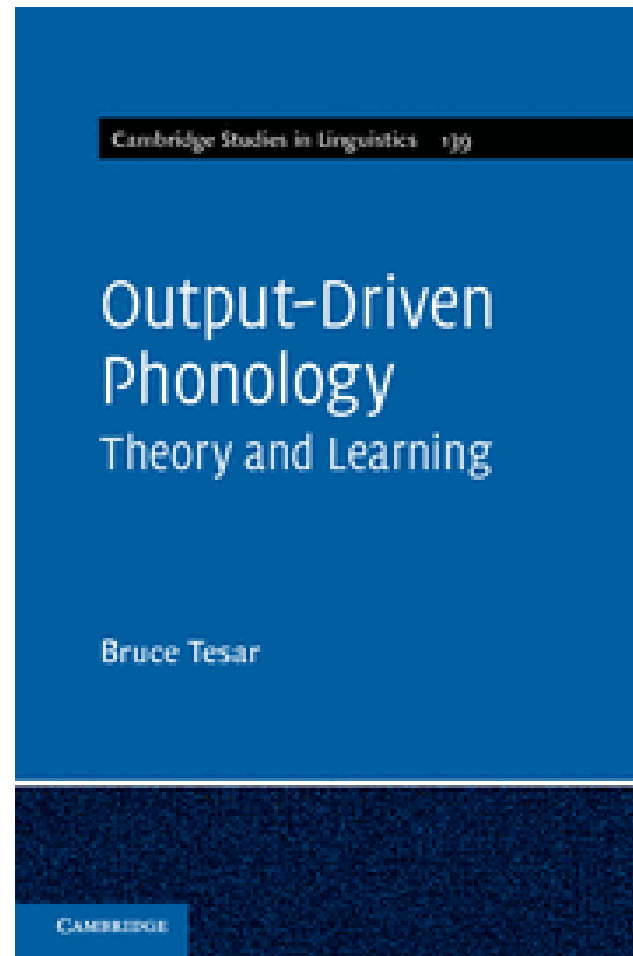
Bruce Tesar

Linguistics Dept. / Center for Cognitive Science  
Rutgers University, New Brunswick

Eighth North American Phonology Conference  
May 9, 2014

## Outline

- Simultaneous learning of:
  - constraint rankings
  - underlying forms
- Output-Driven Maps
  - Phono-LOGICAL Reasoning: logical entailment over algebraic lattices
- Exploiting ODM structure in learning



## Need Additional Structure

- Joint learning of constraint rankings and underlying forms.
  - Jarosz 2006, Apoussidou 2007, Merchant 2008
- These techniques are still implausibly slow.
- Faster learning requires additional posited structure:
  - relating the space of possible UFs to rankings.
- Proposal: Output-Driven Maps

## A System for Illustration

- Words: root + suffix
  - Both roots and suffixes are monosyllabic.
- Each vowel has two features:
  - Vowel length: long (+) or short (–)
  - Main stress: stressed (+) or unstressed (–)
- Example surface words:
  - *páka pá:ka paká páka: pa:ká: pa:ká*
  - Each word has exactly one main stress in the output.

## The Constraints

- Six Constraints

MAINLEFT	main stress on the initial syllable
MAINRIGHT	main stress on the final syllable
*V:	no long vowels
WSP	long vowels are stressed
ID[stress]	correspondents have equal stress value
ID[length]	correspondents have equal length value

(McCarthy & Prince 1993, 1995; Prince 1990; Rosenthal 1994)

## Language L20

r1=/pa/	r2=/pa:/	r3=/pá/	r4=/pá:/	
<i>páka</i>	<i>pá:ka</i>	<i>páka</i>	<i>pá:ka</i>	s1=/-ka/
<i>páka</i>	<i>pá:ka</i>	<i>páka</i>	<i>pá:ka</i>	s2=/-ka:/
<i>paká</i>	<i>paká</i>	<i>páka</i>	<i>pá:ka</i>	s3=/-ká/
<i>paká:</i>	<i>paká:</i>	<i>páka</i>	<i>pá:ka</i>	s4=/-ká:/

Ranking: WSP  $\gg$  ID[s]  $\gg$  ML  $\gg$  MR  $\gg$  ID[I]  $\gg$  \*V:

# Output-Driven Maps

(Tesar 2008; Tesar 2014)

- A map is output-driven if:
  - for every grammatical candidate  $A \rightarrow X$  of the map:
  - if candidate  $B \rightarrow X$  (same output) has greater similarity than  $A \rightarrow X$ ,
  - then  $B \rightarrow X$  is also grammatical.
  
- Simplified:
  - for every grammatical candidate  $A \rightarrow X$  of the map:
  - if input  $B$  is more similar to  $X$  than  $A$  is,
  - then  $B$  also maps to  $X$ .

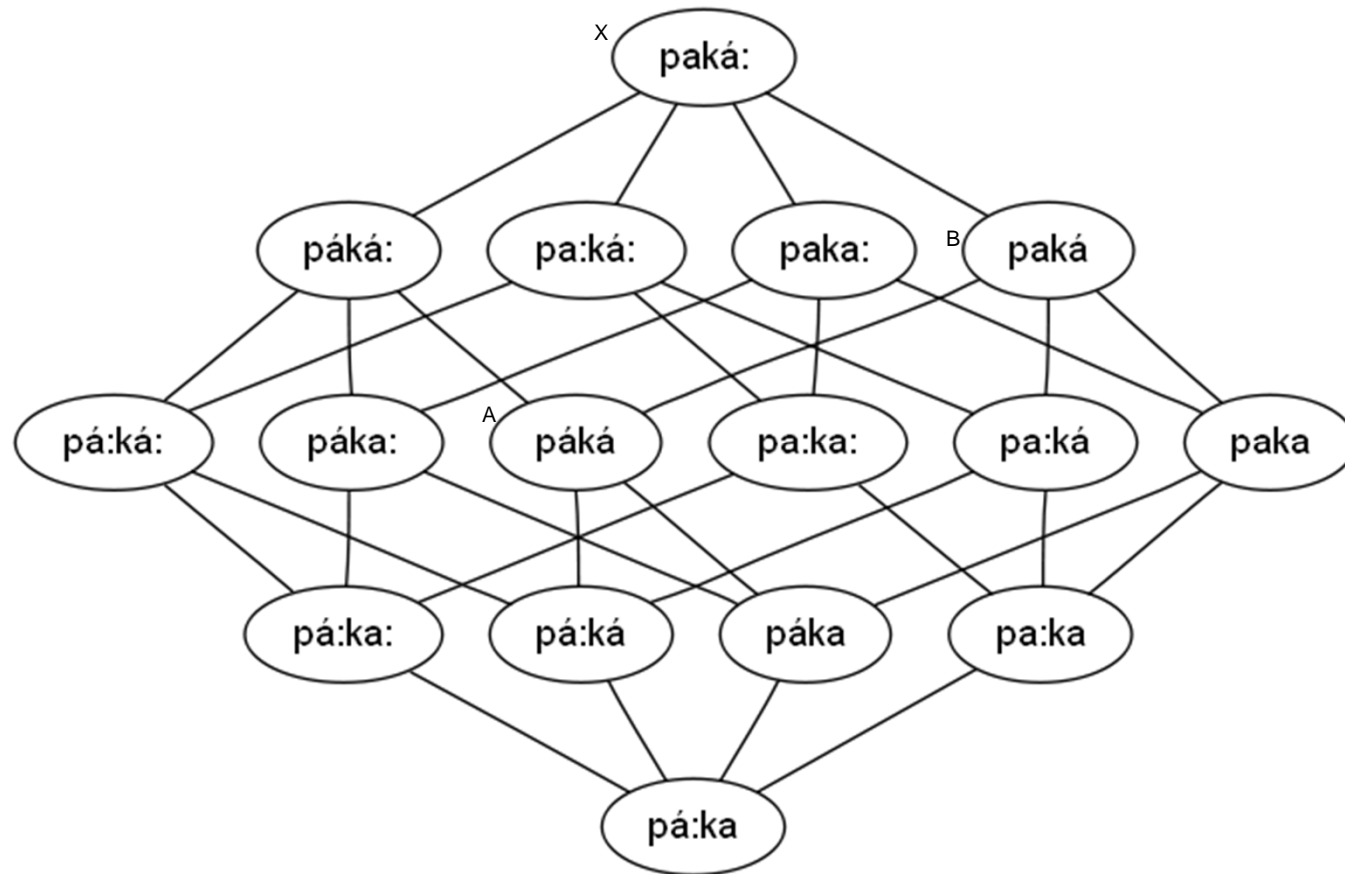


## Greater Similarity

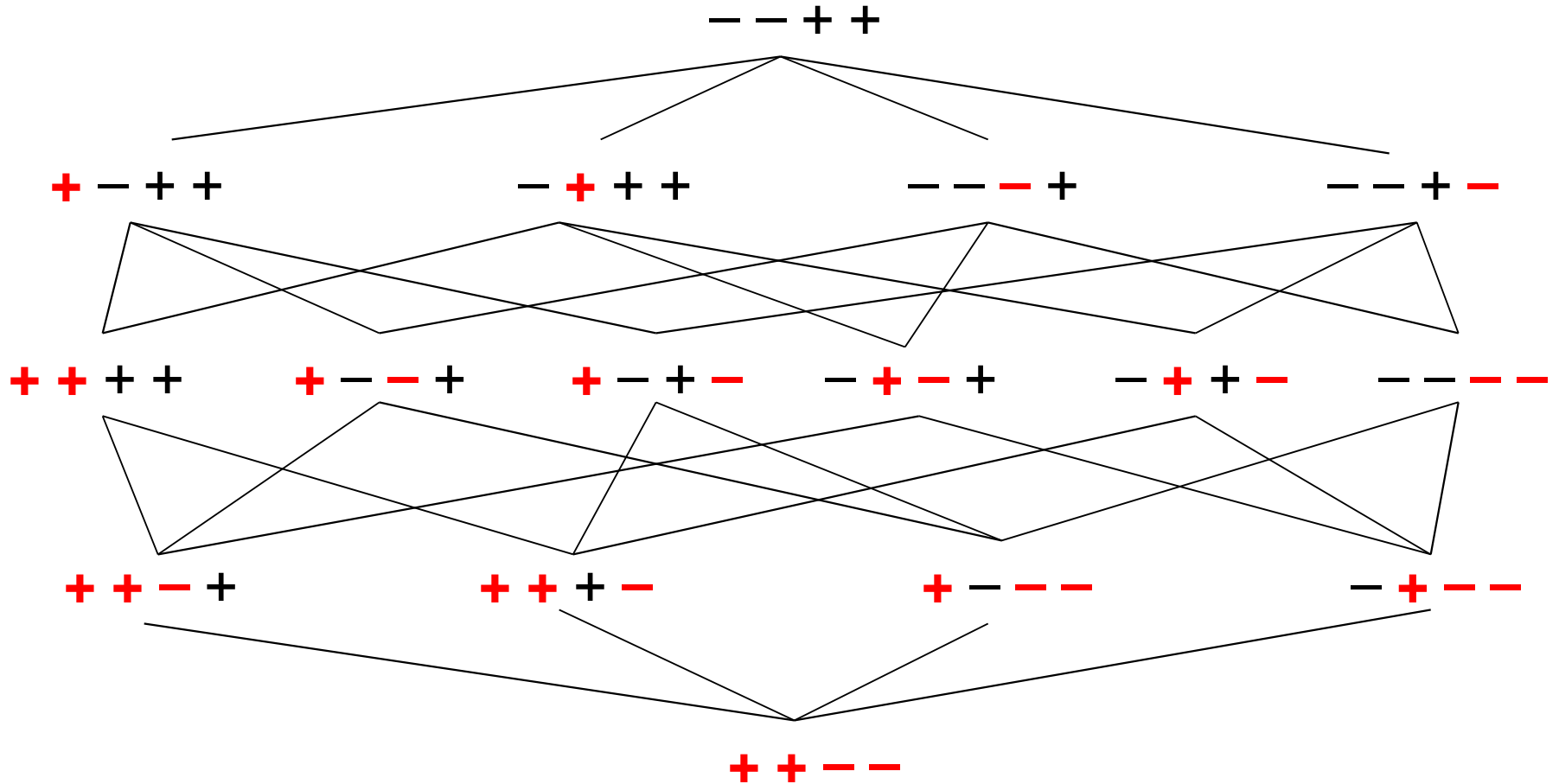
- Candidate  $B \rightarrow X$  has **greater similarity** than candidate  $A \rightarrow X$  if every disparity in  $B \rightarrow X$  has an identical corresponding disparity in  $A \rightarrow X$ .
  - The relation is only defined for pairs of candidates sharing the same output.

		(+/-stress +/-length)
$A \rightarrow X$	<i>páká</i> → <i>paká:</i>	[+ - + -] → [- - + +]
$B \rightarrow X$	<i>paká</i> → <i>paká:</i>	[- - + -] → [- - + +]

# Relative Similarity (up = greater similarity)



# Relative Similarity (+/-stress +/-length)



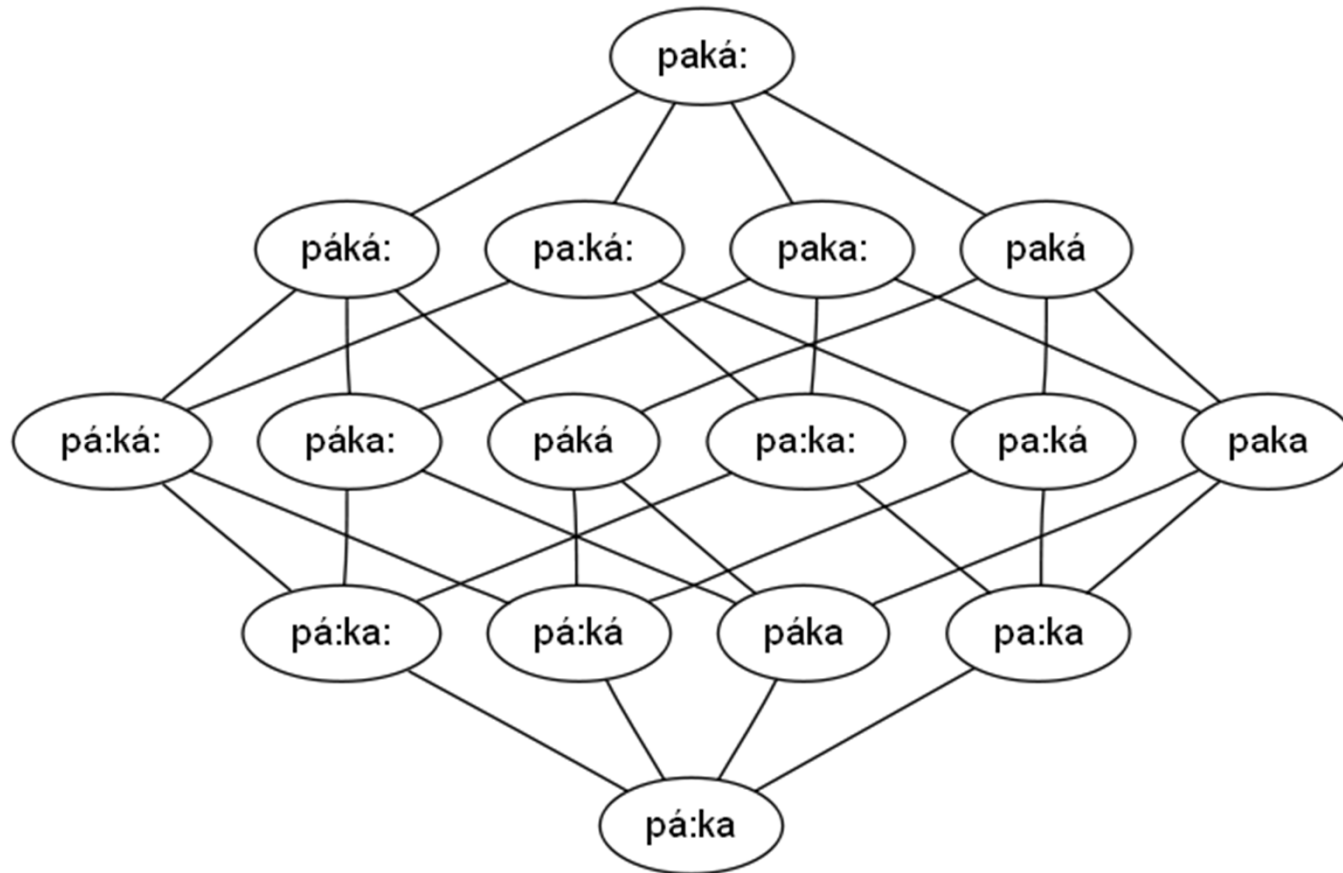
## Exploiting ODM Structure in Learning

- ODM structure can be exploited in the learning of both:
  - underlying feature values
  - ranking information
- Major benefit: computational efficiency

## Phonotactic Learning

- Identity Map Property
  - underlying forms identical to the observed output.
  - Prince & Tesar (2004), Hayes (2004)
- The Identity Map property follows from ODM structure.
  - Phonotactic learning can be done as before.

# ODM entails the Identity Map Property



## Ranking Information Content of *paká:*

<i>/paká:/</i>	WSP	ML	MR	*V:	ID[s]	ID[I]
<i>paká:</i> winner		*		*		
<i>paká</i> loser		*				*
ERC <i>paká: ~ paká</i>				L		W

Word r1s4 has surface form *paká:*

Mapping that form to itself yields ID[I]  $\gg$  \*V:

## Learning Underlying Feature Values

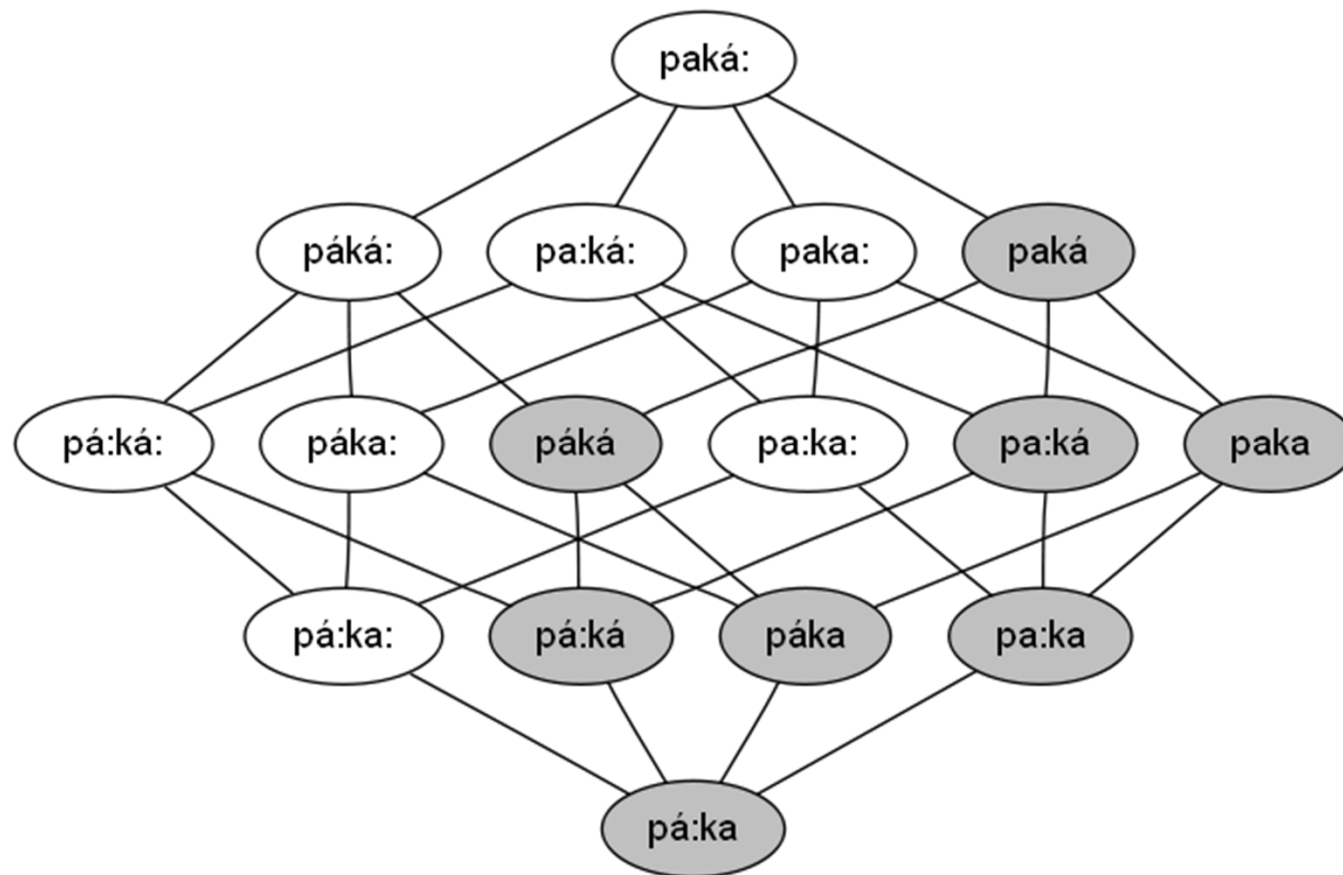
- ODM:  $A \rightarrow X$  entails  $B \rightarrow X$
- Contrapositive: NOT ( $B \rightarrow X$ ) entails NOT ( $A \rightarrow X$ )
  - If a given input cannot map to the output, then all inputs with lesser similarity (additional disparities) cannot map to that output.



## Testing Individual Disparities

- Observed output (r1s4): *paká:*
- What is the underlying length of suffix s4?
- *paká*→*paká:* disparity for s4 length only.
- If *paká*→*paká:* is inconsistent
  - no other input with s4 set to short maps to *paká:*
  - s4 can be set to long (+).

## Setting s4 to +long



## Exponential to Linear

- The learner only needs to test one input for each unset feature.
- Linear in the number of unset features
  - rather than exponential.

## Features Are Set When Contrastive

- *paká*→*paká:* is inconsistent
- because length is contrastive in stressed position
- which the learner knows via  $ID[I] \gg *V:$
- as determined by phonotactic learning.

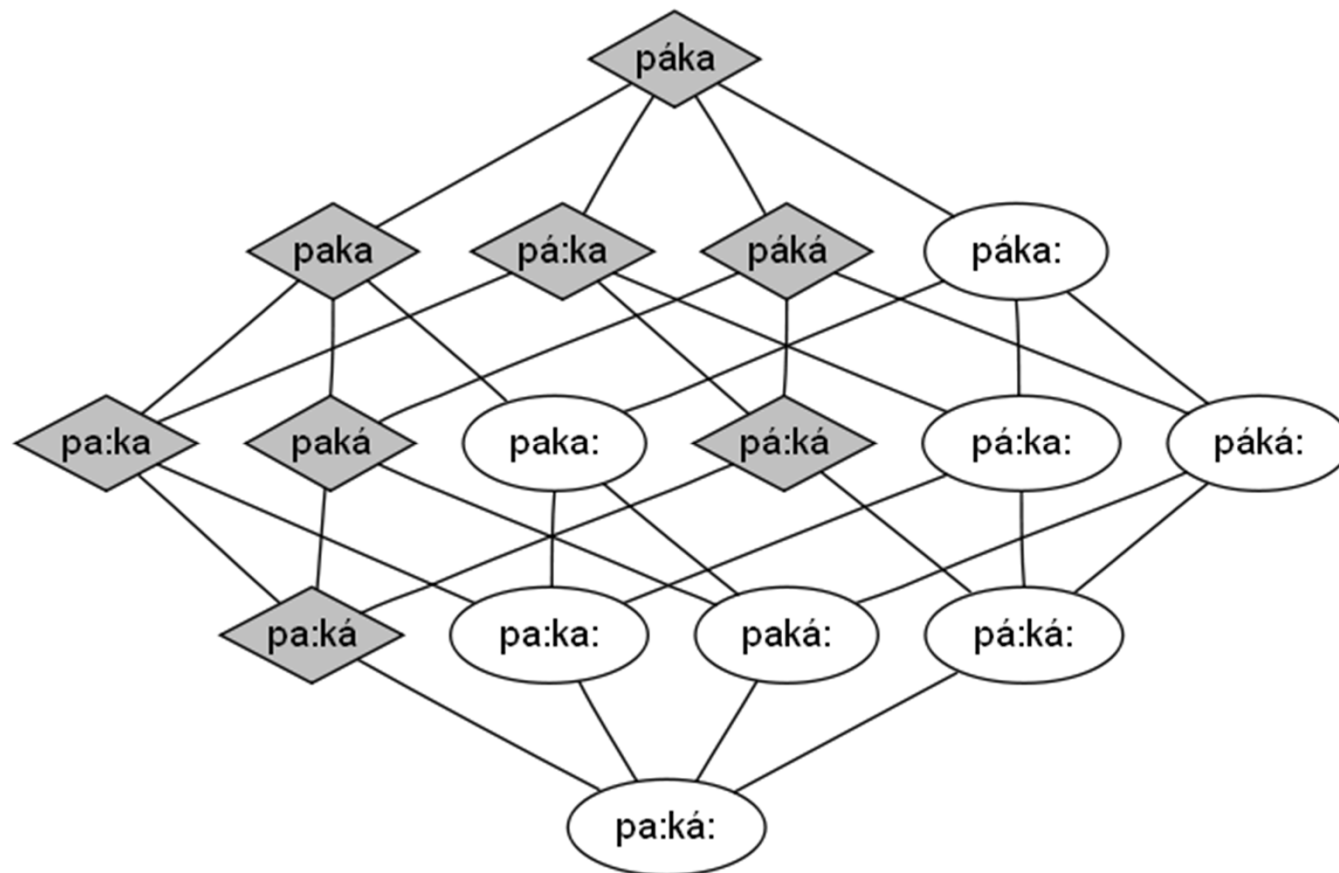
## Non-Phonotactic Ranking Information

- Find forms in which a set feature is not faithfully realized (Tesar 2006b).
  - Where the feature **alternates**.
- Indicates neutralization.

## Unfaithful Features

- Observed output (r3s4): *páka*
- s4 has already been set to +long.
- Minimal disparity mapping: *páka:* → *páka*

## Viable Inputs for r3s4



## Ranking Info from r3s4

<i>/páka:/</i>	WSP	ML	MR	*V:	ID[s]	ID[l]
<i>páka</i> winner						*
<i>páka:</i> loser	*			*		
ERC	W			W		L
<i>paká:</i> ~ <i>paká</i>				L		W
Fusion	W			L		L

WSP  $\gg$  ID[l]  $\gg$  \*V:

Obtained despite incomplete input knowledge.



## Contrast and Neutralization

- Underlying feature values are learned in positions of contrast.
- Non-phonotactic ranking information is learned in positions of neutralization.
- In learning, each feeds the other.

## Underlying Forms, Not Surface Allomorphs

r1=/pa/	r2=/pa:/	r3=/pá/	r4=/pá:/	
<i>páka</i>	<i>pá:ka</i>	<i>páka</i>	<i>pá:ka</i>	s1=/-ka/
<i>páka</i>	<i>pá:ka</i>	<i>páka</i>	<i>pá:ka</i>	s2=/-ka:/
<i>paká</i>	<i>paká</i>	<i>páka</i>	<i>pá:ka</i>	s3=/-ká/
<i>paká:</i>	<i>paká:</i>	<i>páka</i>	<i>pá:ka</i>	s4=/-ká:/

r2 always surfaces as *pá:* or *pa* (never as *pa:*)

## Learning Conspiracies: L9

r1=/pa/	r2=/pa:/	r3=/pá/	r4=/pá:/	
<i>paká</i>	<i>pá:ka</i>	<i>páka</i>	<i>pá:ka</i>	s1=/-ka/
<i>paká:</i>	<i>paká:</i>	<i>paká:</i>	<i>pá:ka</i>	s2=/-ka:/
<i>paká</i>	<i>pá:ka</i>	<i>paká</i>	<i>pá:ka</i>	s3=/-ká/
<i>paká:</i>	<i>paká:</i>	<i>paká:</i>	<i>paká:</i>	s4=/-ká:/

r1s1: /paka/ → *paká*

default final stress

r2s3: /pa:ká/ → *pá:ka*

WSP, via stress shift

r4s2: /pá:ka:/ → *pá:ka*

WSP, via vowel shortening

## L9 Phonotactic Learning

- L9 includes contrasts in stress and length.
- ID[l]  $\gg$  \*V: (contrast in length)  
– *paká*      *paká:*
- ID[s]  $\gg$  {ML,MR} (contrast in stress)  
– *paká*      *páka*

## L9 UF Learning(1)

- r1s2: /*paká*/ cannot map to *paká*:
  - ID[I]  $\gg$  \*V:
- s2 can be set underlyingly to +long.
  - Because –long is inconsistent.
  - s2 now has lexical entry /?,+/

## L9 Non-phonotactic Ranking Info(1)

- r4s2 surfaces as *pá:ka*
  - s2 surfaces as –long
  - /pá:ka:/ → *pá:ka*
- WSP ≫ ID[*l*] (vowel shortening)

## L9 Contrast Pair UF Learning

- r1s1 *paká*
- r3s1 *páka*
  
- r1 and r3 must contrast in underlying stress.
  - Set r1 to –stress.
  - Set r3 to +stress.

## L9 Non-phonotactic Ranking Info(2)

- r3s3 surfaces as *paká*
  - r3 surfaces as –stress.
  - /páká/ → *paká*
- MR ≫ ML (default final stress)



## L9 UF Learning(2)

- r4s2: /pá:ká:/ cannot map to *pá:ka*
  - MR  $\gg$  ML
- s2 can be set underlyingly to –stress.
  - Because +stress is inconsistent.
  - s2 now has lexical entry /–,+/

## L9 Non-phonotactic Ranking Info(3)

- r3s2 surfaces as *paká:*
  - s2 surfaces as +stress.
  - /páka:/ → *paká:*
- ID[l] ≫ ID[s] (stress shift)

## Just Another Grammar

- No special mechanisms for learning conspiracies.
- No special mechanisms for non-allomorphic UFs.

## Conclusions

- ODM structure makes much more efficient learning possible.
  - Reduction from exponential to linear.
  - Both underlying forms and ranking information.
- Phono-LOGICAL reasoning: entailment over algebraic lattices.
- Jointly leveraging the two forms of paradigmatic information.
  - contrast
  - alternation