



# Development of a Weighted Accuracy Measure for implementation in Phon

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# Introductions

- Cynthia Core
  - Assistant Professor, Department of Speech and Hearing Science, GWU
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  - Graduate student in Computer Engineering, GWU

# Acknowledgements

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index.htm](http://psy.fau.edu/~hoff/LangDevLab/index.htm)

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# Collaborators

- Erika Hoff, Florida Atlantic University
  - Jim Mahshie, George Washington University
  - Tiffany Finnegan, Gallaudet University
  - FAU Language Development Lab
  - GWU students
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# My Projects

- First Language Bilingual Acquisition
    - Focus is word learning
  - Speech Perception/Production interface in young children with cochlear implants
    - Focus is speech perception
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# Bilingual Projects

- Data collection in Florida
  - Phonological Memory and Language Learning
    - Investigated the role of phonological memory in early vocabulary development in monolingual and bilingual children
    - 56 monolingual English speaking children
    - 47 bilingual Spanish-English speaking children
    - Data at 3 times, 22-, 25-, and 30-months
    - Real word and nonword repetition in English and Spanish
  - Four-year follow-up
    - Real word and nonword repetition
    - Bilingual English Spanish Assessment (Goldstein, Peña)
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# Ongoing...

- Environmental Correlates of Bilingual Language Development
    - Looks at the role of linguistic experience in language development – family constellation, relative amount of input in each language
    - 170 bilingual children
    - Real word and nonword repetition
    - Bilingual English-Spanish Assessment
  - Various spontaneous samples, 22-, 25-, 30-month, and 4-year-old bilinguals
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# Cochlear Implant Project

- Data collection ongoing in Washington, DC metro area
  - Perception of phonetic features and production of those features
    - Consonant place, manner, voicing, vowel height, advancement, stress, syllable number, intonation
    - 40+ children with cochlear implants
      - 3 to 5 years
    - 2 ½ year longitudinal study (5 visits)
    - Speech production measures
      - Goldman-Fristoe Test of Articulation
      - Elicited multisyllabic words with varying stress patterns, questions, statements
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# Data to be analyzed

- 12 Real Words
    - 4 each, 1-, 2-, 3-syllable
    - From MacArthur-Bates CDI
  - 12 Nonwords
    - Phonologically matched to real words for onsets/rhymes and stress patterns
  - Elicited through toy naming game – imitation
    - Look, his name is ‘Kog’ Can you say ‘Kog?’
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# Examples of Stimuli

- Dog, juice, cat, book
    - Kog, boos, dat, jook
  - Pan, luz, tren, sol
    - Lan, trus, sen, pol
  - Banana, telephone, lollipop, pajamas
    - Bajapop, tellina, lolemas, panaphone
  - Muñeca, gallina, caballo, pelota
    - Gañeca, calota, peballo, mullina
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# Problems in analysis using PCC

- If a child doesn't repeat an elicited item
    - Score is 0
  - If a child says [da:] for 'cat'
    - Score is 0
  - If a child says [us] or [dus] for 'juice' those are the same
  - This makes it impossible to differentiate non-repeaters from children who are actually building good phonological systems
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# Why quantify accuracy?

- Can answer questions of how children change in production abilities over time
  - Can answer questions of how groups of children might be different
    - 'Are bilingual children as accurate in productions of English words as monolingual English speaking children?'
    - 'Does a child have a speech sound disorder?'
      - Describe severity of disorder
  - Can help with item analysis
    - Might be able to inform us about variability of production within-child
  - Need accuracy measures for statistical analysis for group analyses
    - Do children with small vocabularies have poor production skills relative to children with large vocabularies
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# Need for accuracy measures

- ❑ Manual calculations of accuracy are insufficient – time-consuming and prone to inaccuracies in calculation for large databases
  - ❑ Need ways to efficiently calculate accuracy
    - ❑ Lots of computational power is required
  - ❑ By child
    - ❑ Individuals or groups
  - ❑ By target
    - ❑ Subsets of targets (real v. nonwords, 1 v. 3-syllables, iambs v. trochees, etc)
  - ❑ By word-position – onset/rhyme, coda consonants, even by features
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# Wishlist

- Reflect complexity of items produced
  - Incorporate principles of markedness and normal development
  - Variability in assigned values
  - Account for all kinds of errors – deletions, substitutions, additions
    - For consonants and vowels
  - Useful for elicited samples and connected speech
  - Validated, psychometrically sound
  - Grounded in theory
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# What's available?

- Standardized tests of articulation
  - Percent Consonants Correct (PCC)
    - and its variants (PCC-R, PCC-A, PPC)
      - (e.g., Shriberg et al., 1997)
  - Phonological Mean Length of Utterance; Proportion of Whole Word Proximity
    - (Ingram & Ingram, 2001; Ingram, 2002)
  - PPC – Percent Phonemes Correct
    - (Dollaghan, Biber, & Campbell, 1993)
  - DIY - Excel
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# Percent Consonants Correct

- Scoring of a consonant segment is binary
    - Whether incorrect is omitted or differences in phonetic features
    - All consonants are treated equally
    - Omissions, distortions, deletions all rated equally
    - Common/uncommon substitutions/deletions counted the same
  - Additions are not counted as incorrect
  - Vowels aren't considered
  - Word shape is not considered
  - No way to differentiate noncompliance (refusal to name or repeat) from inaccurate production
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# PMLU and PWP

- PMLU = Phonological Mean Length of Utterance
    - Each segment produced by child gets a point
      - Up to number of segments in target word
    - Each correct consonant gets another point
    - 'cat' produced correctly would get 5 points
    - If child said [kati] it would still be 5 points
  
  - PWP = Proportion of Whole Word Proximity
    - Child's PMLU/Target word PMLU
  
  - PWC = Percent Whole Word Correctness
    - How many words in sample a child produces accurately
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## Limitations of PMLU/PWP

- Doesn't consider complexity of segments – adjacencies or clusters, just total number of consonants and accuracy
  - Does not address vowel accuracy
  - PMLU doesn't track growth over time very well
    - (cf Taelman, 2005; Saaristo-Helin, 2009)
  - PWP is better than PCC at information about word shape, but it doesn't differential common from unusual errors
  - Not sure how these measures deal with distortions which are clinically relevant
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## The vision:

- A tool that allows us to conduct a more fine-grained analysis would allow
    - Differentiation of repeaters and non-repeaters
    - Following growth over time
    - A way to capture common v. unusual patterns
  - Combine the power of Phon's powerful search abilities (e.g. to identify all aligned obstruent coda productions) with a calculator that will tell you quickly whether stops are produced more accurately than fricatives
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# Weighted Speech Sound Accuracy Measure - WSSA

- Adaptation of a measure developed by Oller & Ramsdell (2006)
    - Designed for LIPP (Logical International Phonetics Program, Kim Oller)
  - Kim Oller, Heather Ramsdell, Jonathan Preston, Mary Louise Edwards, Stephen Tobin
  - Feature-based approach (grounded in phonetics/phonology)
  - “Common” errors involve small penalties “Atypical” errors involve larger penalties (markedness, developmental patterns)
  - Considers both consonants and vowels
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# Basics

- An algorithm based on two tiers
  - Word shape match and segment accuracy
- Assigns a value to a child's production based on its match to a target
- Two tiers of accuracy production
  - Global Structural Agreement - Word shape match
  - Featural Agreement – feature match at the segmental level
- $WSSA = \text{Global Structural Agreement} \times \text{Featural Agreement}$
- Some principles are established for alignment
  - Matching nuclei, then consonants with minimal discrepancies and no reordering

# Global Structural Agreement

- Number of aligned segments produced/total number of segments
- [da] / dog                      GSA Value .66
  - 2/3 segments produced
  - Reflects omission of final consonant
- [di] for 'kitty'                      GSA Value .5
  - 2/4 segments produced
  - Reflects omission of CV
- Additions are scored as 0
  - 'kog' -> [kagi] then total segments are 4 and target contained 3 segments, so GSA value is .75

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# Mean Featural Agreement

- Each segment receives a value for featural agreement
  - Consonants and vowels start with a value of 1 each
  - Deductions are made according to type of error
- Segment values are averaged
- This gives Mean Featural Agreement

'juice' -> [du]

$$\text{MFA} = .84 + 1 = 1.84/2 = .92$$

# WSSA Weights: Consonants

CONSONANT FEATURE		Penalties
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<b>Manner</b> (0.333)	<b>Huge Manner</b> -uncommon errors, damaging to intelligibility	-.3333
	<b>Big Manner</b> - Less common in phonological development	-.25
	<b>Small Manner</b> -Common errors in phonological development	-.1666
	<b>Teeny Manner</b> -minor phonetic errors	-.0833
<b>Place</b> (0.333)	<b>Huge Place:</b> -Uncommon, very damaging to intelligibility	-.333
	<b>Big Place</b> - Less common in phonological development	-.25
	<b>Small Place</b> - Typical errors in phonological development	-.1666
	<b>Teeny Place</b> -Phonetic errors in English, based on small changes in tongue placement.	-.0833
<b>Voicing</b> (0.333)	<b>Huge Voicing</b> -Uncommon	-.3333
	<b>Small Voicing</b> -Common	-.2222
	<b>Teeny Voicing</b> -Phonetic changes	-.1111



# WSSA Weights: Consonants

For example: Place of articulation

<b>Huge Place</b>	-.333	Dorsal	↔	Labial
		Glottal	↔	Non-Glottal
<b>Big Place</b>	-.25	Coronal	↔	Labial
		Coronal	→	Dorsal
		Alveolar	→	Palatal
		Palatal	→	Dental
		Retroflex	↔	Not Retroflex
<b>Small Place</b>	-.1666	Linguadental	↔	Labiodental
		Dental	↔	Alveolar
		Palatal	→	Alveolar
		Dorsal	→	Coronal
<b>Teeny Place</b>	-.0833	Bilabial	↔	Labiodental
		Labialization		
		Blading		
		Tongue Advance/Retract		

# WSSA Weights: Vowels

Vowel Feature	Weight	Penalties			Example
<b>Height</b>	0.40	Huge Height	-.40	4 step height change	/i/ ↔ [a]
		Big Height	-.30	3 step height change	/ɪ/ ↔ [a]
		Small Height	-.20	2 step height change	/i/ ↔ [e]
		Teeny Height	-.1	1 step height change	/a/ ↔ [ɛ]
<b>Advancement</b>	0.40	Big Front	-.40	Front ↔ Back	/o/ ↔ [e]
		Small Front	-.20	Front ↔ Central or	/i/ ↔ [ə]
				Back ↔ Central	
<b>Nasalization</b>	0.1	Small Nasal	-.10	Not Nasal → Nasal	/a/ → [ã]
<b>Rounding</b>	0.1	Small Rounding	-.10	Round ↔ Not Round	/ʌ/ ↔ [ɔ]

# Computational Example (WSSA)

Gloss	"	l	o	l	l	i	p	o	p	"
Target	/	l	a	l		i	p	a	p	/
Child Production	[	j	a	j		i	p	a	p	]

- Weighted Speech Sound Accuracy = Global structural agreement x Featural agreement
  - GSA = 1
  - MFA = .95
  - WSSA = .95
  - PCC = .40 and PWP = .63

# Computational Example<sub>(WSSA)</sub>

Gloss	"	t	e	l	e	p	h	o	n	"
Target	/	t	ɛ	l		f		o	n	/
Child Production	[	k	ɛ			p		o	ŋ	]

- GSA = .71
- MFA = .86
- WSSA = .6
- PCC = .25 and PWP = .55

# Computational Example<sub>(WSSA)</sub>

Gloss	“	d		o		g		“
Target	/	d		a		g		/
Child Production	[	g		a				]

- GSA = .66
- MFA = .75
- WSSA = .57
- PCC = 0 and PWP = .4

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# Psychometric Information

## □ Validity

- Correlates with existing measures of phonetic accuracy in toddlers and adolescents
- Distinguishes productions by children with speech sound disorders and typically developing children
- Sensitive to growth in phonetic accuracy as a child gets older

## □ Reliability

- Between transcribers
  - Between different word lists
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# Phon implementation of WSSA

- Would work as a plug-in to Phon
  - Will allow users to select participants, targets, and hopefully word position
  - Implementing the measure in Phon would allow more users to validate the measure
    - Develop similar measures for other languages
    - Validate on larger groups of children
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It could look like this...

The screenshot shows the Phon software interface with a menu bar (Phon, File, Edit, View, Session, Record, Window, Help) and a window title bar. The main area displays phonetic analysis for a segment. The analysis is organized into several rows:

Notes	
#9	<unspecified>
Orthography	[Bicken]
IPA Target	[bɪkɪn]
Target Syllables	b   ɪ   k   ɪ   n
IPA Actual	[bɪkɪn]
Actual Syllables	b   ɪ   k   ɪ   n
Alignment	b   ɪ   k   ɪ   n b   ɪ   k   ɪ   n
Segment	000:57.761 to 000:58.897 <a href="#">Play</a> <a href="#">E</a>
Notes	

A green arrow points to the 'E' button in the Segment row, with the text "New Tier for Accuracy Calculation" next to it.



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# Challenges

- Programming
    - Initial interface 😊
    - Teaching a programmer about linguistics
  - Measurement
    - How to differentiate weighting by word position
      - Consider prevocalic voicing and final devoicing
    - How to deal with stress placement errors
    - What about harmony or errors? Cluster reductions? Epenthesis? Fusion?
    - How to assess intermediate productions?
    - Allophonic variation?
    - Should consonants and vowels be weighted equally?
  - Other languages - Spanish
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# Where to go next?

- Implementing WSSA first
  - Should weightings be adjustable/customizable?
  - Feedback?
    - Utility?
    - Adjustments?
-