



Learning Stress with Feet and Grids

Assumption: are FEET a burden?

- ▶ Gordon (2011): "... adoption of a grid-based rather than a foot-based approach to stress avoids the **burden** of having to model the learning of the hidden structure implicit in a foot-based theory."
- ▶ What could "burden" mean?
 - **Foot-based approach may fail to learn some languages or take longer to learn languages**

Learning Simulations

- ▶ DATA: 28/33 Quantity Insensitive languages (Gordon 2002, Hayes & Wilson 2008) that the foot-based approach can represent
- ▶ QUESTION 1: Does the foot-based approach correctly converge on every language?
- ▶ QUESTION 2: Is the foot-based or grid-based approach faster?
- ▶ Learner: MAXENT learning with hidden structure (Pater & Prickett 2022)
 - Initial weight = 1, Gradient Descent (as opposed to L-BFGS-B in P&P 2022)
- ▶ Input/Output: 1-7 syllables in length, marked with $\sigma/\delta/\acute{\sigma}$
For example,

$\acute{\sigma}\sigma$	Candidates	Constraints
GRID	$\acute{\sigma}\sigma, \sigma\acute{\sigma}, \delta\acute{\sigma}, \acute{\sigma}\delta$	Gordon (2002) (n=12)
FOOT	$(\acute{\sigma}\sigma), (\sigma\acute{\sigma}), (\delta)(\acute{\sigma}), (\acute{\sigma})(\delta)$	M&P (1993), Kager (2005) (n=9)

 - Learning data and all aspects of learning for both constraint sets were identical
 - Only difference is that the foot-based learner had to assign prosodic structure to the learning data (see P&P 2022)

- ▶ Learning success: For each syllable-length, 0.90 prob on correct surface form
- ▶ Learning speed: The number of epochs it takes for the learner to succeed in learning
- ▶ Learning failure: no success until maximum number of epoch (1000)

Differences between GRID and FOOT

- ▶ FOOT introduces hidden structure, GRID doesn't

	$\sigma\acute{\sigma}\sigma$								
Grid	<table border="1"> <tr><td>Level 2</td><td>x</td></tr> <tr><td>Level 1</td><td>x</td></tr> <tr><td>Level 0</td><td>x x x</td></tr> <tr><td></td><td>$\sigma \sigma \sigma$</td></tr> </table>	Level 2	x	Level 1	x	Level 0	x x x		$\sigma \sigma \sigma$
Level 2	x								
Level 1	x								
Level 0	x x x								
	$\sigma \sigma \sigma$								
Foot	<table border="1"> <tr><td>$\sigma(\acute{\sigma}\sigma)$</td></tr> <tr><td>$(\sigma\acute{\sigma})\sigma$</td></tr> </table>	$\sigma(\acute{\sigma}\sigma)$	$(\sigma\acute{\sigma})\sigma$						
$\sigma(\acute{\sigma}\sigma)$									
$(\sigma\acute{\sigma})\sigma$									

- ▶ GRID counts grid marks to the edge, FOOT counts syllables to the edge

	$\sigma\delta\sigma\acute{\sigma}\delta$								
Grid	<table border="1"> <tr><td>Level 2</td><td>x</td></tr> <tr><td>Level 1</td><td>x x x</td></tr> <tr><td>Level 0</td><td>x x x x x x</td></tr> <tr><td></td><td>$\sigma \sigma \sigma \sigma \sigma \sigma$</td></tr> </table>	Level 2	x	Level 1	x x x	Level 0	x x x x x x		$\sigma \sigma \sigma \sigma \sigma \sigma$
Level 2	x								
Level 1	x x x								
Level 0	x x x x x x								
	$\sigma \sigma \sigma \sigma \sigma \sigma$								
Foot	<table border="1"> <tr><td>$(\sigma\delta)(\sigma\acute{\sigma})(\sigma\delta)$</td></tr> </table>	$(\sigma\delta)(\sigma\acute{\sigma})(\sigma\delta)$							
$(\sigma\delta)(\sigma\acute{\sigma})(\sigma\delta)$									

GRID vs. FOOT

	Learned	Faster
GRID	28	11
FOOT	28	14
TOTAL	28	28 (3 equal)

- ▶ FOOT correctly converges on all 28 languages it can represent
- ▶ FOOT faster than or equal to GRID on 17/28 languages (61%)

GRID-MAIN-REVISED

- ▶ One of the major differences between GRID and FOOT is how main stress placement is penalized. So we adopted the syllable counting ALIGNHEAD constraint from the foot-based approach.

$\sigma\delta\sigma\acute{\sigma}\delta$		GRID-MAIN-REVISED								
Grid	<table border="1"> <tr><td>Level 2</td><td>x</td></tr> <tr><td>Level 1</td><td>x x x</td></tr> <tr><td>Level 0</td><td>x x x x x x</td></tr> <tr><td></td><td>$\sigma \sigma \sigma \sigma \sigma \sigma$</td></tr> </table>	Level 2	x	Level 1	x x x	Level 0	x x x x x x		$\sigma \sigma \sigma \sigma \sigma \sigma$	ALIGN (X ₂ , R) SYLL **
Level 2	x									
Level 1	x x x									
Level 0	x x x x x x									
	$\sigma \sigma \sigma \sigma \sigma \sigma$									
Feet	<table border="1"> <tr><td>$(\sigma\delta)(\sigma\acute{\sigma})(\sigma\delta)$</td></tr> </table>	$(\sigma\delta)(\sigma\acute{\sigma})(\sigma\delta)$	ALIGNHEADRIGHT **							
$(\sigma\delta)(\sigma\acute{\sigma})(\sigma\delta)$										

GRID-MAIN-REVISED vs. FOOT vs. GRID

- ▶ This change had a great consequence on learning
- ▶ GRID-MAIN-REVISED faster than or equal to GRID on 25/28 languages (89%)

	Learned	Faster
GRID	28	3
GRID-MAIN-REVISED	28	19
TOTAL	28	28 (6 equal)

- ▶ GRID-MAIN-REVISED faster than or equal to FOOT on 19/28 languages (68%)

	Faster
FOOT	9
GRID-MAIN-REVISED	15
TOTAL	28 (4 equal)

- ▶ FOOT was faster than GRID or GRID-MAIN-REVISED on 8 languages

References

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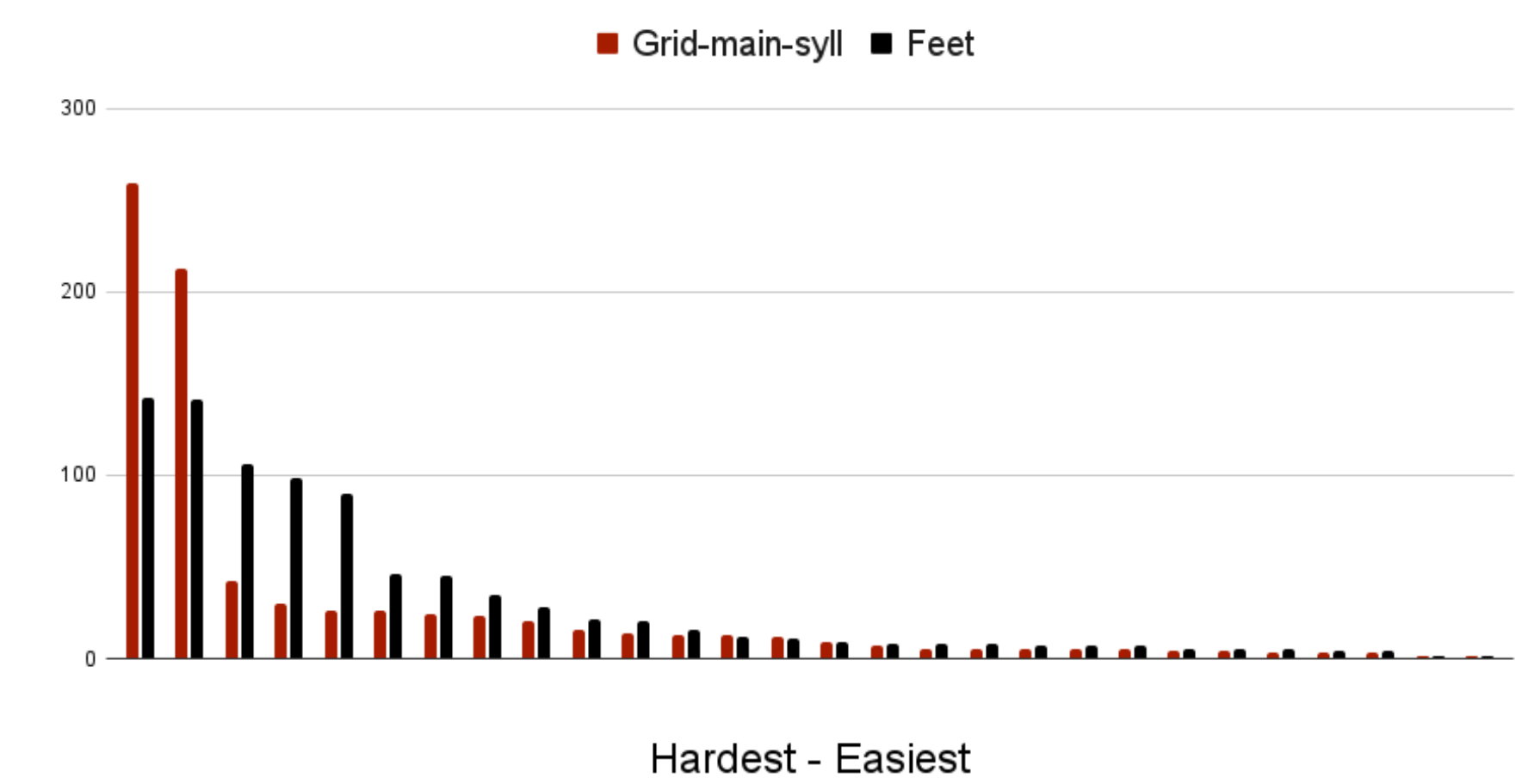
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Learning speed (Number of epochs)

	GRID	GRID-MAIN-REVISED	FOOT
Mean	56.8	28.3	31.8
SD	87.6	59.9	42.5
Min	1	1	1
Max	401	259	142

Number of epochs to learn a language



- ▶ On average, GRID was slower than FOOT,
- ▶ and FOOT slower than GRID-MAIN-REVISED
 - The hardest language for GRID-MAIN-REVISED took longer than the hardest language for FOOT

Conclusion

- ▶ FOOT can correctly converge on all the languages it can represent
- ▶ FOOT was **not slower** than GRID
- ▶ GRID learned faster with the **main stress** constraints that counts the number of **syllables**, rather than grid marks.
- ▶ Even with the revised constraints, GRID-MAIN-REVISED was consistently slower on certain languages than FOOT
- ▶ **The fact that Feet introduce hidden structure does not necessarily make learning harder for all languages in general.**
- ▶ **Details of the constraint set can have considerable effect on the speed of learning.**

Future work

- ▶ Will the current result hold if weights are initialized randomly?
- ▶ Quantity-sensitive languages in StressTyp2 (Goedemans et al. 2015)

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