## Optimality Theory is not computable

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Handout available at https://aphonologist.github.io/presentations



## Optimality Theory is computationally complex

- Rule-based models of phonology are finite-state<sup>1</sup>
- Natural language phonology appears to be as well<sup>2</sup>
- Optimality Theory<sup>3</sup> is more powerful<sup>4</sup> and requires a lot of time and space<sup>5</sup> to compute



<sup>&</sup>lt;sup>1</sup>Johnson (1972); Kaplan and Kay (1994)

<sup>&</sup>lt;sup>2</sup>Heinz (2018)

<sup>&</sup>lt;sup>3</sup>Prince and Smolensky (1993/2004)

<sup>&</sup>lt;sup>4</sup>Eisner (1997, 2000); Frank and Satta (1998); Lamont (2021, 2022)

<sup>&</sup>lt;sup>5</sup>Idsardi (2006); Hao (2024)

# Optimality Theory is computationally complex

- In today's talk, I show that OT is not computable
- It is impossible to write an algorithm to determine the output of an arbitrary input and OT grammar

#### Related results

- OT-LFG has been shown not to be computable<sup>1</sup>
- Harmonic Grammar<sup>2</sup> can model arbitrary computations using non-linguistic representations<sup>3</sup>
- The present construction only uses off the shelf phonological tools and representations



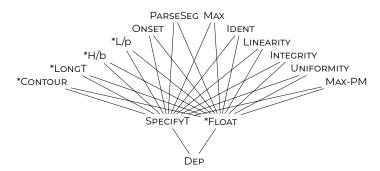
<sup>&</sup>lt;sup>1</sup>Johnson (2002); Kuhn (2001, 2002, 2023)

<sup>&</sup>lt;sup>2</sup>Legendre, Miyata, and Smolensky (1990)

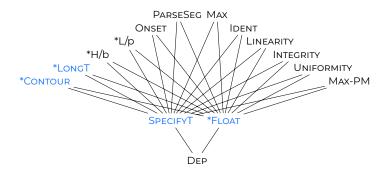
<sup>&</sup>lt;sup>3</sup>Smolensky (1992)

## The grammar

• The relevant OT grammar has the following ranking:



### The grammar's phonotactics

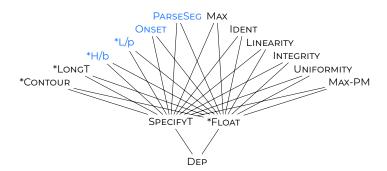


- Every syllable must be linked to exactly one tone<sup>4</sup>
- Every tone must be linked to exactly one syllable





## The grammar's phonotactics



- High tones cannot link to [.la.]<sup>4</sup>
- Low tones cannot link to [.ha.]
- Segments must be parsed into .CV. syllables



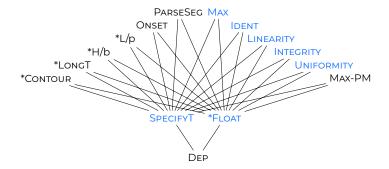
<sup>&</sup>lt;sup>4</sup>Lee (2008); Berkson (2013)

# The grammar's phonotactics

 Wellformed strings satisfy all the phonotactic constraints and consist only of the syllables

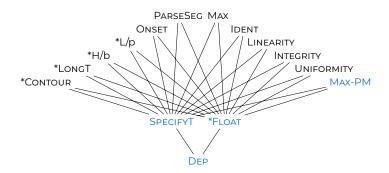
• One-to-one link between tones and syllables

## The grammar's mappings



 Wellformedness cannot be achieved by deleting/changing/reordering/... tones or segments<sup>4</sup>

## The grammar's mappings



- Wellformedness by inserting entire morphemes<sup>4</sup>
- Max-PM: \*tones/segs not associated to morphemes<sup>5</sup>



<sup>&</sup>lt;sup>4</sup>Xu (2007, 2011); Wolf (2008, 2015); Rolle (2020)

<sup>&</sup>lt;sup>5</sup>Walker and Feng (2004)

# The grammar's lexicon

 Consider lexicons consisting of a finite set of unassociated strings of segments and tones

lexicon 
$$\subset \{\text{ha, la}\}^* \times \{\text{H, L}\}^*$$

• Given this ranking and the lexicon

• The output of any monomorphemic input is:

| /H/                 | MAx-PM | SPECIFYT | *FLOAT | DEP  |
|---------------------|--------|----------|--------|------|
| a. H                |        |          | W 1    | L    |
| b?á.                | W 2    |          | <br>   | L 2  |
| chá.ha.ha.          |        | W 1      | i<br>I | L6   |
| r dhá.há.há.        |        |          | <br>   | 8    |
| ehá.há.há.          |        |          | <br>   | 8    |
| 🖻 fhá.há.há.        |        |          | <br>   | 8    |
| ghá.há.há.há.há.há. |        |          | <br>   | W 15 |

• SpecifyT and \*Float defined as binary constraints<sup>6</sup>



<sup>&</sup>lt;sup>6</sup>Frank and Satta (1998)

| /H/                 | МАх-РМ | SPECIFYT | *FLOAT      | DEP  |
|---------------------|--------|----------|-------------|------|
| a. H                |        |          | Wl          | L    |
| b?á.                | W 2    |          | <br>        | L 2  |
| chá.ha.ha.          |        | W 1      | <br>        | L6   |
| r dhá.há.há.        |        |          | ]<br>]<br>[ | 8    |
| ehá.há.há.          |        |          | <br>        | 8    |
| 🖻 fhá.há.há.        |        |          | <br>        | 8    |
| ghá.há.há.há.há.há. |        |          | <br>        | W 15 |

Unassociated high tone fatally violates \*FLOAT



| /H/                 | МАх-РМ | SPECIFYT | *FLOAT | DEP  |
|---------------------|--------|----------|--------|------|
| a. H                |        |          | Wl     | L    |
| b?á.                | W 2    |          |        | L 2  |
| chá.ha.ha.          |        | W 1      | <br>   | L 6  |
| 🖻 dhá.há.há.        |        |          | <br>   | 8    |
| ehá.há.há.          |        |          | <br>   | 8    |
| 🖻 fhá.há.há.        |        |          | <br>   | 8    |
| ghá.há.há.há.há.há. |        |          | <br>   | W 15 |

Inserting non-morphemic string violates MAX-PM



| /H/                 | MAx-PM | SPECIFYT | *FLOAT | DEP  |
|---------------------|--------|----------|--------|------|
| a. H                |        |          | W 1    | L    |
| b?á.                | W 2    |          | <br>   | L 2  |
| chá.ha.ha.          |        | Wl       |        | L6   |
| r dhá.há.há.        |        |          | 1      | 8    |
| ehá.há.há.          |        |          | <br>   | 8    |
| 🖻 fhá.há.há.        |        |          | <br>   | 8    |
| ghá.há.há.há.há.há. |        |          |        | W 15 |

- Input tone can associate to inserted morpheme
- Introduces toneless syllables violating SPECIFYT



| /H/                 | MAx-PM | SPECIFYT | *FLOAT | DEP  |
|---------------------|--------|----------|--------|------|
| a. H                |        |          | W 1    | L    |
| b?é.                | W 2    |          | <br>   | L 2  |
| chá.ha.ha.          |        | W 1      | i<br>I | L6   |
| ☞ dhá.há.há.        |        |          |        | 8    |
| ehá.há.há.          |        |          | İ      | 8    |
| 🕫 fhá.há.há.        |        |          |        | 8    |
| ghá.há.há.há.há.há. |        |          | <br>   | W 15 |

 High tone morphemes are inserted to avoid toneless syllables



| /H/                 | MAX-PM | SPECIFYT | *FLOAT      | DEP  |
|---------------------|--------|----------|-------------|------|
| a. H                |        |          | W 1         | L    |
| b?é.                | W 2    |          | <br>        | L 2  |
| chá.ha.ha.          |        | W 1      | I<br>I      | L6   |
| r dhá.há.há.        |        |          | ]<br>]<br>] | 8    |
| ehá.há.há.          |        |          | <br>        | 8    |
| 🖻 fhá.há.há.        |        |          | <br>        | 8    |
| ghá.há.há.há.há.há. |        |          |             | W 15 |

DEP selects the shortest well-formed candidate of infinitely many



• Given the same ranking and the lexicon

• All morphemic inputs are returned faithfully

| /lala/      | 9/H* | MAX    | IDENT  | MAX-PM | SPECIFYT | DEP |
|-------------|------|--------|--------|--------|----------|-----|
| ala.la.     |      | l<br>I | i<br>I | <br>   | 1        |     |
| blá.lá.     | W 2  | <br>   | <br>   | <br>   | L        | W 2 |
| C. <i>ϵ</i> |      | W 4    | I<br>I | I<br>I | L        |     |
| dhá.há.     |      | <br>   | W 2    | <br>   | L        | W 2 |
| el̯à.l̯à.   |      | I<br>I | I<br>I | W 2    | L        | W 2 |

| /lala/      | 9/H* | MAX  | IDENT  | MAX-PM | SPECIFYT | DEP |
|-------------|------|------|--------|--------|----------|-----|
| ala.la.     |      | 1    | i<br>I |        | 1        |     |
| blá.lá.     | W 2  |      | <br>   |        | L        | W 2 |
| C. <i>ϵ</i> |      | W 4  | I<br>I | I<br>I | L        |     |
| dhá.há.     |      | <br> | W 2    | <br>   | L        | W 2 |
| ela.la.     |      | l    | I<br>I | W 2    | L        | W 2 |

- No morphemes have floating low tones
- Lexical insertion is ruled out by \*H/b



| /lala/           | q/H* | MAX    | IDENT  | MAx-PM | SPECIFYT | Оер |
|------------------|------|--------|--------|--------|----------|-----|
| ala.la.          |      | l<br>I | l<br>I | <br>   | 1        |     |
| b <u>l</u> á.lá. | W 2  | <br>   | <br>   | <br>   | L        | W 2 |
| C. <i>ϵ</i>      |      | W 4    | i<br>I |        | L        |     |
| dhá.há.          |      |        | W 2    |        | L        | W 2 |
| ela.la.          |      |        | <br>   | W 2    | L        | W 2 |

Other operations violate constraints ≫ SpecifyT



### Technical wrinkle

• Given the same ranking and the lexicon

It is possible to satisfy SpecifyT but not \*FLOAT

#### Technical wrinkle

- If partially matched outputs are a formal problem, they can be ruled out with conjoined constraints<sup>6</sup>
  - SpecifyT & Dep / word
  - \*FLOAT & DEP / word
- These constraints block unfaithful mismatches



<sup>&</sup>lt;sup>6</sup>Moreton and Smolensky (2002); Łubowicz (2002, 2003, 2005); Smolensky (2006)

#### General case

- In general, an OT grammar with this ranking either
  - Returns the faithful candidate (a), or
  - Returns the shortest well-formed candidate(s) (b')

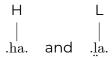
| /x/                  | SPECIFYT | *FLOAT | DEP        |
|----------------------|----------|--------|------------|
| <b>☞</b> a. <i>x</i> | (1)      | (1)    |            |
| b. <i>yxz</i>        | (1)      | (1)    | W  y  +  z |

| a'. <i>x</i> | (W 1) (W 1) | L       |
|--------------|-------------|---------|
| ® b'.yxz     | I           | y  +  z |



#### General case

 Given a finite lexicon and an input defined over it, return the shortest candidate generated by inserting morphemes composed only of syllables



- If there is no such candidate, return the input as is
- Whether it exists is impossible to determine

 An instance of the Post Correspondence Problem<sup>7</sup> provides a finite set of domino types

$$\left\{ \begin{bmatrix} \underline{b} \\ \underline{c} \ \underline{a} \end{bmatrix}, \begin{bmatrix} \underline{a} \\ \underline{a} \ \underline{b} \end{bmatrix}, \begin{bmatrix} \underline{c} \ \underline{a} \\ \underline{a} \end{bmatrix}, \begin{bmatrix} \underline{a} \ \underline{b} \ \underline{c} \end{bmatrix} \right\}$$

 A solution is a finite sequence of domino tokens with the same string along the top and bottom

$$\begin{bmatrix} \underline{a} \\ \underline{a} \ \underline{b} \end{bmatrix} \begin{bmatrix} \underline{b} \\ \underline{c} \ \underline{a} \end{bmatrix} \begin{bmatrix} \underline{c} \ \underline{a} \\ \underline{a} \end{bmatrix} \begin{bmatrix} \underline{a} \\ \underline{a} \ \underline{b} \end{bmatrix} \begin{bmatrix} \underline{a} \ \underline{b} \ \underline{c} \\ \underline{c} \end{bmatrix}$$

$$\begin{vmatrix} \underline{a} \\ \underline{b} \\ \underline{c} \ \underline{a} \end{vmatrix} \begin{vmatrix} \underline{a} \\ \underline{a} \ \underline{b} \end{vmatrix} c \begin{vmatrix} \underline{a} \\ \underline{a} \end{vmatrix} b \begin{vmatrix} \underline{c} \\ \underline{c} \end{vmatrix}$$

$$\begin{vmatrix} \underline{a} \\ \underline{b} \\ \underline{c} \end{vmatrix} \begin{vmatrix} \underline{a} \\ \underline{b} \end{vmatrix} c \end{vmatrix} c \begin{vmatrix} \underline{a} \\ \underline{b} \end{vmatrix} c \begin{vmatrix} \underline{a} \\ \underline{b} \end{vmatrix} c \begin{vmatrix} \underline{a} \\ \underline{b} \end{vmatrix} c \end{vmatrix} c \begin{vmatrix} \underline{a} \\ \underline{b} \end{vmatrix} c \begin{vmatrix} \underline{a} \\ \underline{b} \end{vmatrix} c \end{vmatrix} c \begin{vmatrix} \underline{a} \\ \underline{b} \end{vmatrix} c \begin{vmatrix} \underline{a} \\ \underline{b} \end{vmatrix} c \end{vmatrix} c \end{vmatrix} c \begin{vmatrix} \underline{a} \\ \underline{b} \end{vmatrix} c \end{vmatrix} c \end{vmatrix} c \begin{vmatrix} \underline{a} \\ \underline{b} \end{vmatrix} c \end{vmatrix} c \end{vmatrix} c \begin{vmatrix}$$

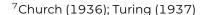


- Post Correspondence Problem is not computable<sup>7</sup>
- It is impossible to write an algorithm that decides whether an arbitrary instance has a solution





- Sipser (2013:§5.2) provides an intuitive proof
  - Given a Turing Machine and input, generate an instance of the PCP that models the computation
  - There is a solution if and only if the Turing Machine halts on the input
  - If an algorithm exists to solve the PCP, it implies a solution to the Halting Problem
  - But the Halting Problem is not computable<sup>7</sup>
  - Therefore no such algorithm exists





- Modified PCP specifies a starting domino
- It is also not computable<sup>7</sup>

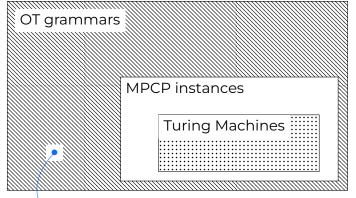




## OT is not computable

- Our OT grammar models the modified PCP and therefore it is impossible to write an algorithm that determines the output for an arbitrary input passed into arbitrary OT grammar
- OT is therefore not computable

### OT is not computable



What is the output of grammar x for input y?



#### So what?

- OT is not the only constraint-based formalism that is not computable<sup>8</sup>
- However, it is primarily used to model phonology, which is a significantly larger gulf than a model of syntax/semantics

<sup>&</sup>lt;sup>8</sup>Kaplan and Bresnan (1982); Johnson (1988); Kepser (2004); Francez and Wintner (2012); Kaplan and Wedekind (2023); Przepiórkowski (2023)

### So what's next?

- The construction crucially depends on freedom of analysis and strictly ranked constraints
- Serialism does not automatically avoid this<sup>9</sup>
- Weighted constraints appear to (single signed)<sup>10</sup>
  - Removing one phonotactic violation cannot motivate arbitrarily many unfaithful operations
  - Can be shown to be finite-state with string constraints (work in prep.)
- Pursue alternative models like BMRS<sup>11</sup>



<sup>&</sup>lt;sup>9</sup>Hampe (2022)

<sup>&</sup>lt;sup>10</sup>Kimper (2016)

<sup>&</sup>lt;sup>11</sup>Chandlee and Jardine (2021)

#### Thank you!

Handout available at <a href="https://aphonologist.github.io/presentations">https://aphonologist.github.io/presentations</a>

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  \*Phonology 38:729-740.\*\*

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