# An Unsupervised Model of Orthographic Variation for Historical Document Transcription

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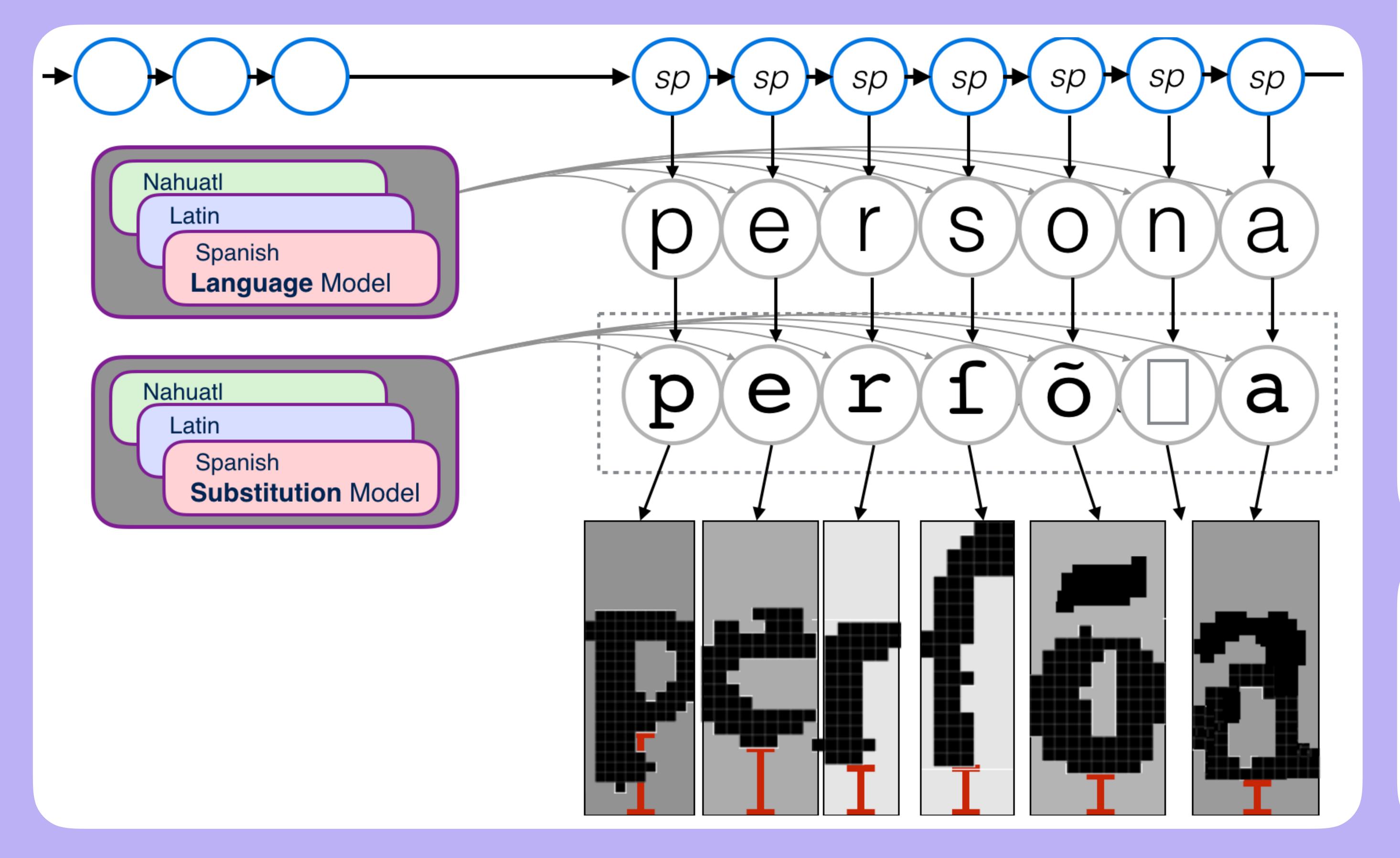
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# **Generative Model**

Our system jointly models two transcriptions: one *literal* and one *automatically normalized*. For each character state, we generate: 1) **language**, 2) **modern-orthography character**, 3) **printed character**, and then 4) **typesetting**.

Our model is embedded within the Ocular OCR system of Berg-Kirkpatrick, Durrett, and Klein (2013)



# System Output

## Original Image

de las dos que se siguen en las quales apro ue cha mucho acostúbrar el anima a se lemantar hazia arriba ponese aqui vn modo el qual parece mas coforme alo q se sigue

#### Output - Literal

de las dos que se figuen en las quales apro uecha mucho acostubrar el anima á se lepantar hazia arriba ponese aqui vn modo el qual parece más cosforme á lo que se figue

#### Output - Normalized

de las dos que se siguen en las quales aprovecha mucho acostumbrar el ánima á se levantar hacia arriba pónese aquí un modo el cual parece más conforme á lo que se sigue

# Results

| Orthographic        | Diplomatic |             | Normalized |             |
|---------------------|------------|-------------|------------|-------------|
| ariation strategy   | CER        | WER         | CER        | WER         |
| lo handling         | 13.2       | 45.7        | 17.4       | 47.6        |
| land-written rules  | 8.5        | <b>30.8</b> | 13.1       | 37.9        |
| Insupv. joint model | 8.6        | 32.7        | 9.5        | <b>27.6</b> |

## Learned Substitution Probs

| c | g                 | freq(sp., c, g) | $P_{spanish}^{\rm GLYPH}(g \mid c)$ |
|---|-------------------|-----------------|-------------------------------------|
| - | ELIDED            | 52              | 0.0881                              |
| ó | O                 | 31              | 0.0526                              |
| S | f (long s)        | 325             | 0.0352                              |
| q | $\tilde{	ext{q}}$ | 9               | 0.0222                              |
| n | ELIDED            | 57              | 0.0136                              |
| V | u                 | 55              | 0.0129                              |
| O | õ                 | 20              | 0.0091                              |
| c | cc                | 23              | 0.0028                              |

|                       | char sub.           | char sub.                | elision                       | accent drop                 | doubled              | typo                  |
|-----------------------|---------------------|--------------------------|-------------------------------|-----------------------------|----------------------|-----------------------|
|                       | $(c \rightarrow q)$ | $(s \rightarrow long s)$ | $(que \rightarrow \tilde{q})$ | $(\acute{o} \rightarrow o)$ | $(c \rightarrow cc)$ | $(e \rightarrow r)$   |
| Original image        | qual                | esta                     | aql                           | consideración               | peccados             | Primeramrnte          |
| Baseline trans.       | qual                | eña                      | á ól                          | confideracion               | peccados             | Primeraminte          |
| Our diplomatic trans. | qual                | efta                     | a <b>q</b> l                  | confideracion               | peccados             | Primeramrnte          |
| Our normalized trans. | <b>c</b> ual        | esta                     | aquel                         | consideraci <b>ó</b> n      | pecados              | Primeram <b>e</b> nte |