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### **Problem definition**

- How to infer social ties based on shared linguistic traits?
- Determine whether the inferred networks map on to the known social ties.
- Assumption:
  - similarity in linguistic traits  $\Rightarrow$  social influence
  - social influence: unobserved
  - linguistic traits: evidenced by inscriptions







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#### $\blacktriangleright$ ~ 250 known settlements/sites - ca. 200 – 1000 CE

#### ~ 3000 monuments

#### ▶ 75,359 glyph blocks

- ▶ graphemes ~ 956 (unique), 119, 109 inscriptions
- social relationships ~ 415 records from 79 different sites

#### time stamped!







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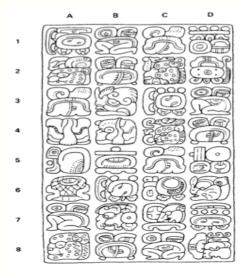
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# A sample monument

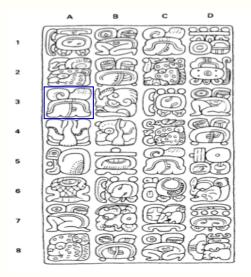








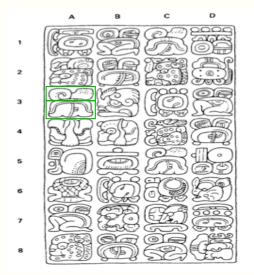
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# Inferring paths of influence Sites

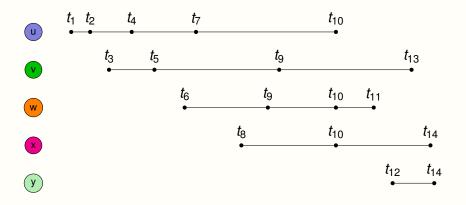








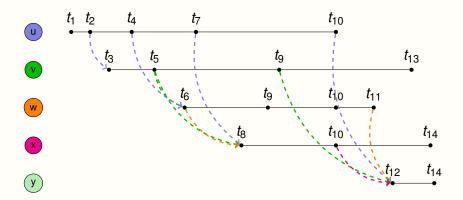
Sites + inscription timelines of a grapheme







Step 1: All potential sources of influence

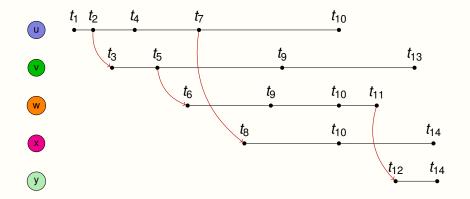








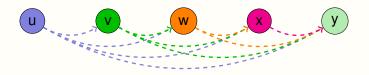
Step 2: Select strongest influence







Step 1: Directed Acyclic Graph of influence

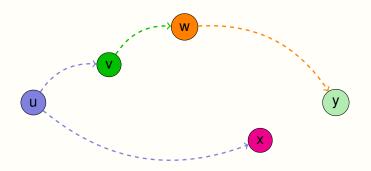








Step 2: Influence propagation tree

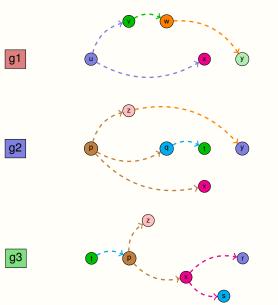








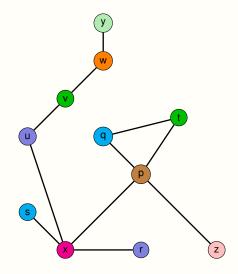
Step 3: Influence graph







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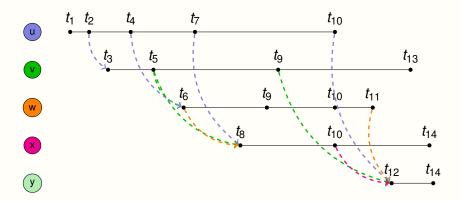








### Measure of influence



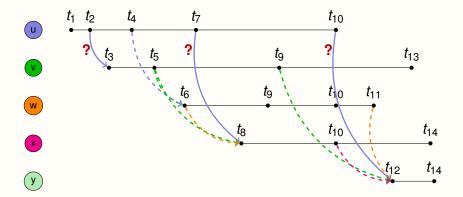






### Measure of influence

Exponential waiting time distribution for influence propagation



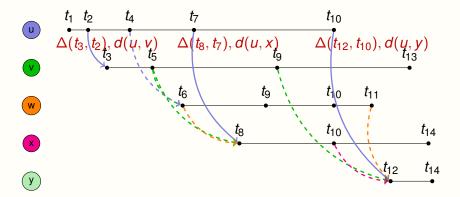






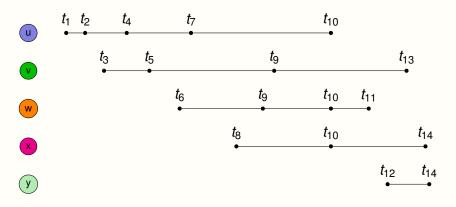
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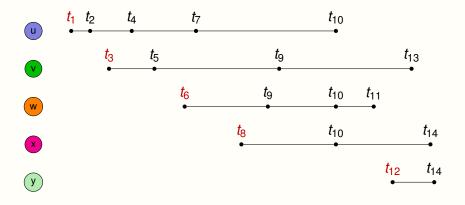






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First recording of a grapheme: time of "influence"

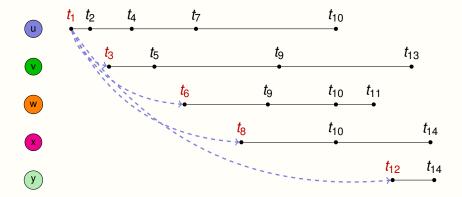


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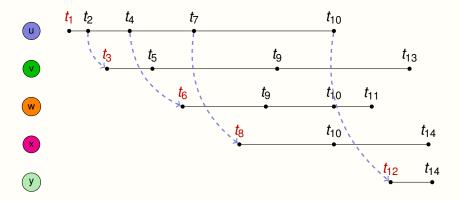
First time of inscription at a site determines the directionality of the influence







Strength of influence: latest inscription before adoption



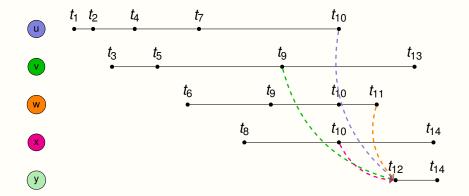


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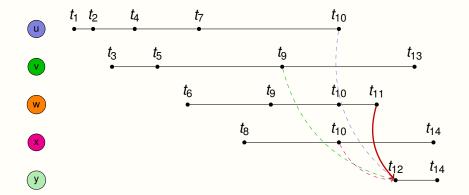
Source of influence: shortest time difference between latest inscription and adoption







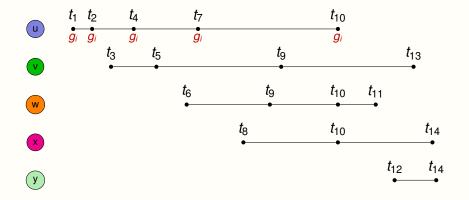
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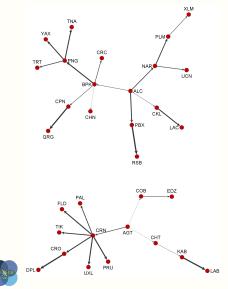
Grapheme is unchanging at least for the time period of observations under study

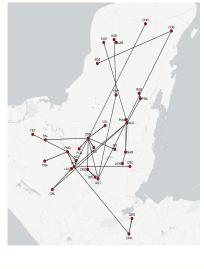




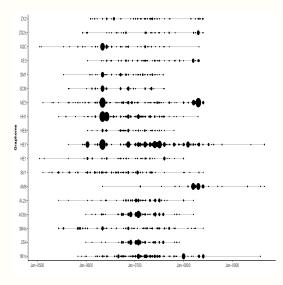


#### Influence propagation tree of BV1 grapheme





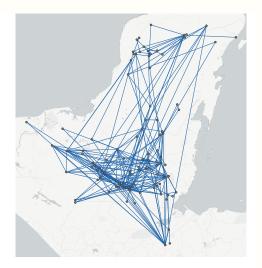
#### Inscription timelines of a selected sample of graphemes







#### Influence graph based on the 18 graphemes







### Results Relationship graph

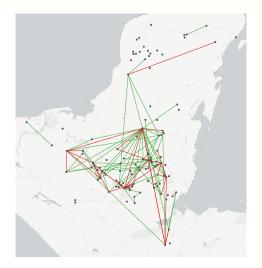








#### Comparison of relationship graph with inferred influence paths









#### Inferring complex diffusion graphs:

- multiple sources of influence
- increasing the number of graphemes
- Robustness of the inference model: cross validation
- Incorporating relationship data as an explanatory variable
- No. of inscriptions of a grapheme
- "Linguistic attributes" of graphemes







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