# Temporal Text Ranking and Automatic Dating of Texts

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Estimate the writing date of a text.

(Linguistic complement to *material dating*.)

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- 1930? 1899? 1823?
   (Regression)
   (Preoţiuc-Pietro and Cohn, 2013)
- 18th / 19th century?
   (Classification)
   (de Jong et al, 2005)

and our previous work

Estimate the writing date of a text.

(Linguistic complement to material dating.)



#### • Which is newer?

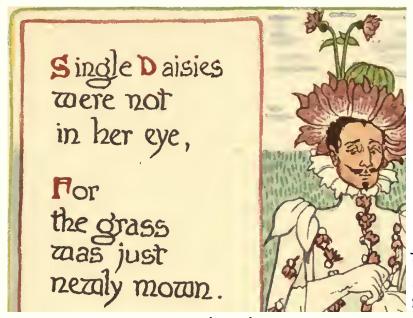
A Relation

Of some Trials of the same Operation, lately made in France.

1. M. Denys, Professor of the Mathematicks and Natural Philofophy at Paris, in a Letter of his to the Publisher relateth, That they had lately transmitted the Blood of four Weathers into a Horse of 26 years old, and that this Horse had thence received much strength, and more than an ordinary stomach.

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**1899**. W. Crane, A Floral Fantasy in an Old English Garden

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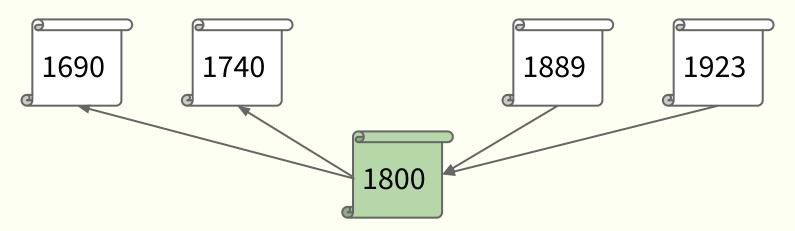
**1667**. An Account Of The Experiment Of Transfusion Practiced Upon A Man In London

## 2. This Work: Pairwise Ranking

Input: **pairs** of documents

Output: "<", ">"

Not all input samples need to be comparable.

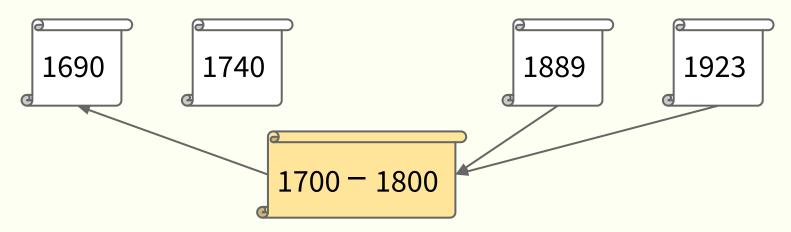


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Use a moment in time instead of a document:

$$W \cdot d_1 > \theta(1850)$$

# **Evaluation**

## 4. Historical Corpora

#### Three languages:

- Colonia Corpus of Historical Portuguese (Zampieri and Becker, 2013)
- Corpus of Late Modern English Texts (CLMET)
   (de Smet, 2005)
- Romanian Historical Corpus

(Ciobanu et al. 2013)

## 5. Simple Features

A. lexical (word counts)

B. naive morphological

(character n-grams at the end of words)

+ feature transformation and selection

#### 6. Results

## Comparable to the regression approach

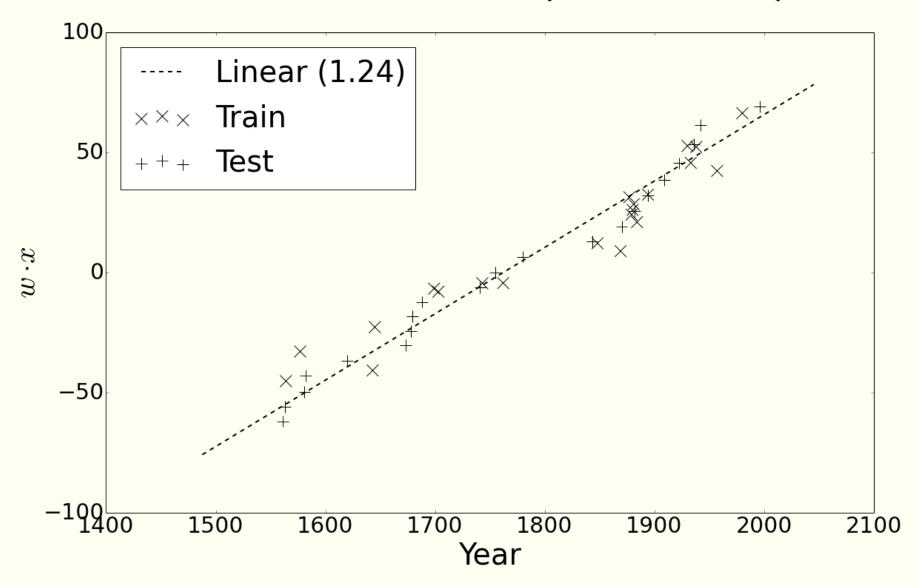
	size	pairwise score	Ridge pairwise score
en	293	83.8%	83.7%
pt	87	82.9%	81.9%
ro	42	92.9%	92.4%

our system

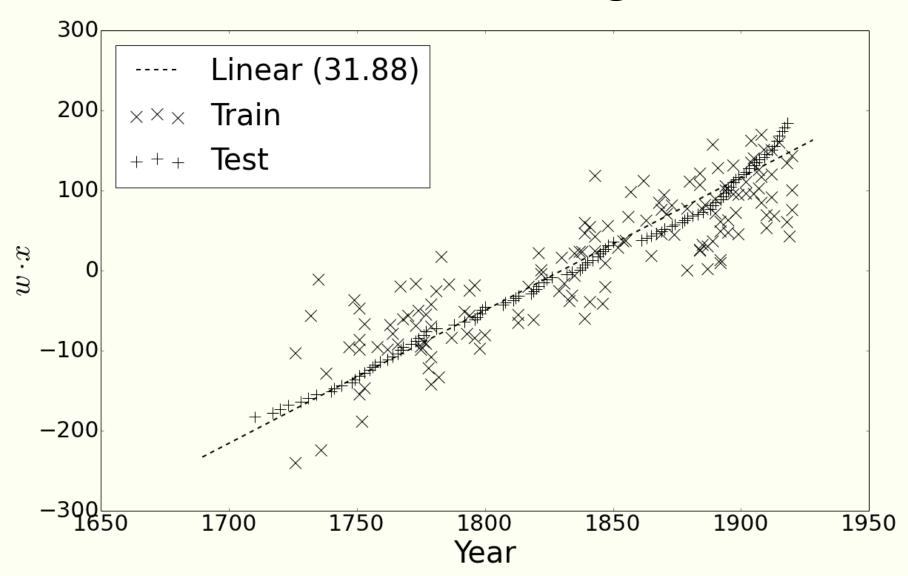
## 7. Function estimation ( $\theta$ )

*w · x* (projection of documents onto a rank-preserving line)

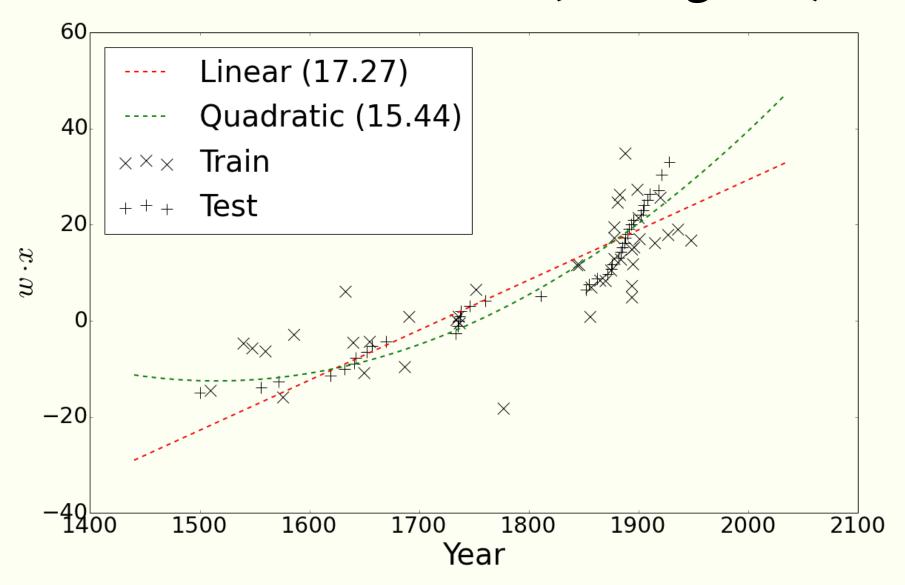
## 8. Function estimation (Romanian)



## 9. Function estimation (English)



## 10. Function estimation (Portuguese)



## 11. Dating uncertain texts

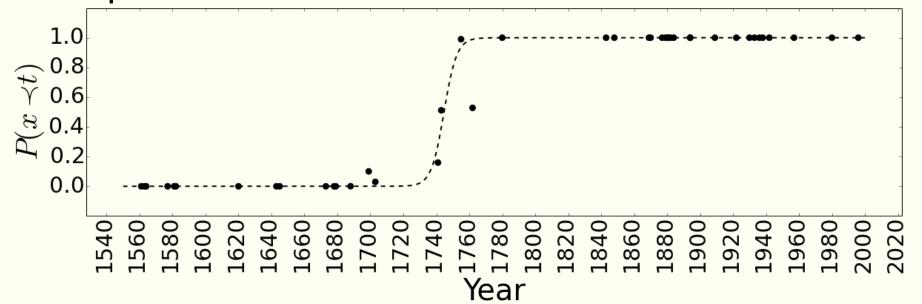
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We predict 1736.2 – 1753.2:



#### 12. Conclusion & Future Work

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- application-specific feature engineering
- other historical corpora wanted!