# We find that a **neural network** partof-speech tagger implicitly **learns** to model **syntactic change**.

# Detecting Syntactic Change Using a Neural Part-of-Speech Tagger

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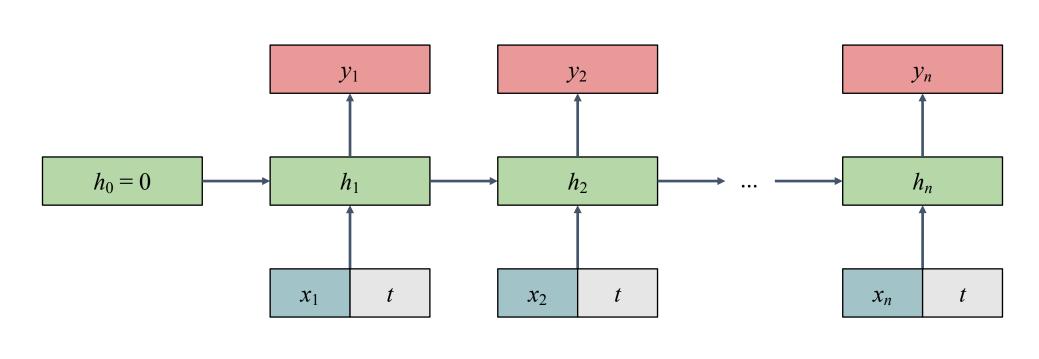


Does the network learn a temporal progression?

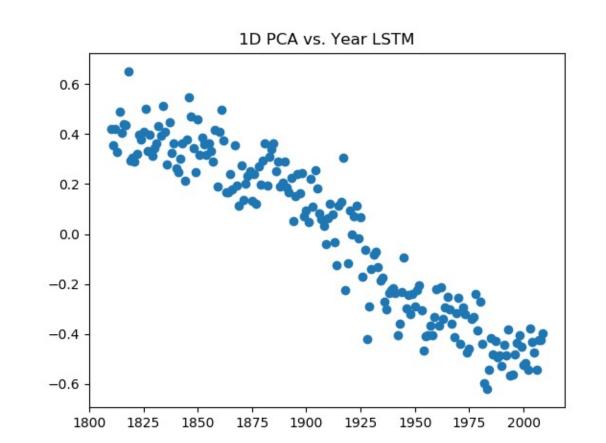
- PCA analysis of year embeddings
- Perplexity analysis to date new sentences

Does the temporal progression encompass syntax in addition to word frequency?

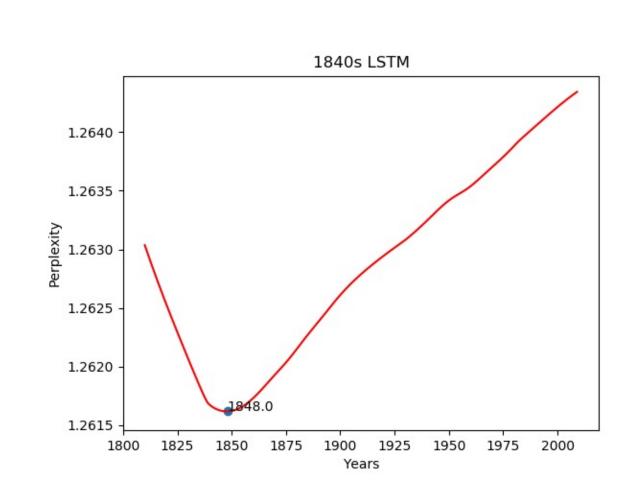
Feedforward baseline comparisons



**LSTM** tagger architecture



First principal component of year embeddings **correlates** strongly with time ( $R^2 = 0.89$ )



1848 is **predicted composition year** for 1840s sentences

## DISCUSSION

- Diachronic knowledge learned by network must encompass syntactic—not just lexical—change
- Neural networks are a viable method for further computational work regarding syntactic change

#### **TAGGING PERFORMANCE**

	FF	LSTM
Year	82.6	95.5
No Year	77.8	95.3

#### **PCA ANALYSIS**

- LSTM  $R^2 = 0.89$
- Feedforward  $R^2 = 0.68$

#### **PERPLEXITY ANALYSIS**

	Baseline	FF	LSTM
Decade	50.0	26.6	12.5
Year	50.0	37.5	21.9

Average prediction error when dating sentences using decade and year-level buckets

### **EXAMPLE DATED SENTENCE**

It is of great consequence, that we adorn the religion we profess, and that our light shine more and more that we grow in grace as we advance in years, and that we do not resemble the changing wind or the inconstant wave.

Actual Year: 1817

Predicted Year (LSTM): 1817

Prediction Error (FF): 86
Prediction Error (LSTM): 0



