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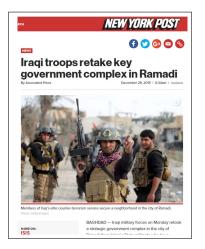
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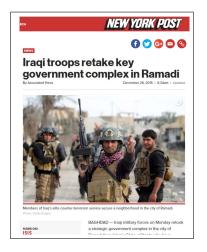
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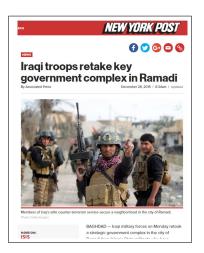
e.g. authors with limited vocabularies will have a low lexical diversity.

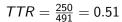
February 13, 2018





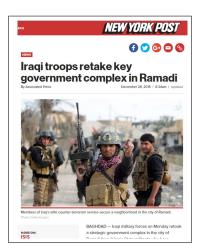
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February 13, 2018



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$$TTR = \frac{428}{978} = 0.43$$



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• Kincaid et al later translate to US School grade level that would be (on average) required to comprehend text.

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#### However...

Score	Education	Description	Clve % US popn
0–30	college graduates	very difficult	28
31–50		difficult	72
51–60		fairly difficult	85
61–70	9th grade	standard	_
71–80		fairly easy	_
81–90		easy	_
91–100	4th grade	very easy	_

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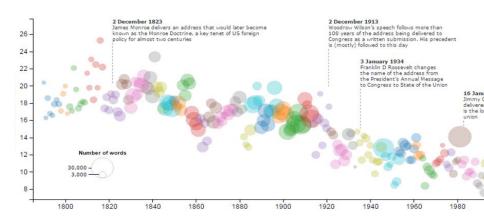
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# The state of our union is ... dumber:

How the linguistic standard of the presidential address has declined

Using the Flesch-Kincaid readability test the Guardian has tracked the reading level of every State of the Union



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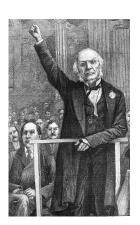
new voters tended to be poorer and less literate

↓ local, clientalistic appeals via bribery...



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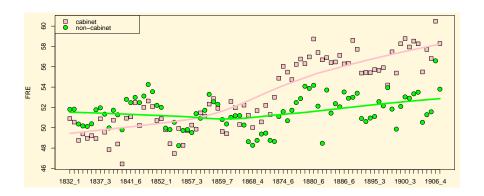


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# Flesch overtime plot



yields grade level of text sample.

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### DC

$$0.1579 \times (\text{PDW}) + 0.0496 \times \left(\frac{\text{total words}}{\text{total sentences}}\right)$$

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### Dale-Chall, 1948

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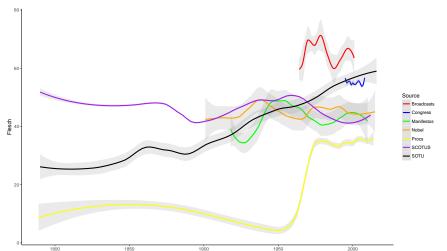
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e.g. about, back, call, etc.

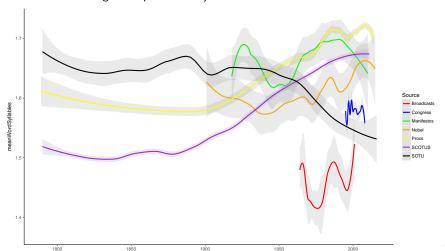
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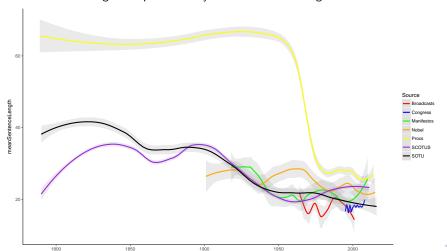
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February 13, 2018

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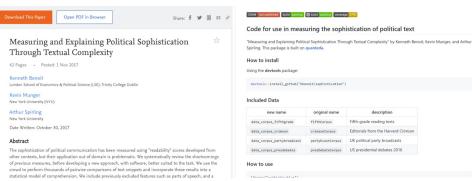
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github.com/kbenoit/sophistication