## The Dostoyevskian Trope

Persistent Processes and State Incongruence in 19<sup>th</sup> Century Textual Cultural Heritage

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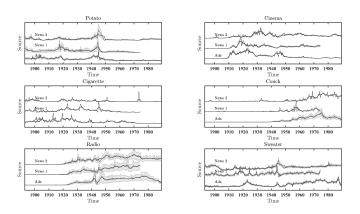
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## **PROGRAM**

0	Motivation	history and dynamics
1	RQs and Data	Danish textual cultural heritage
2	Design	fractal analysis and causal dependencies
3	Kehre	author-specific cognitive dynamics
4	D-trope	cognitive-affective dependencies
*	Extra	literary optimality

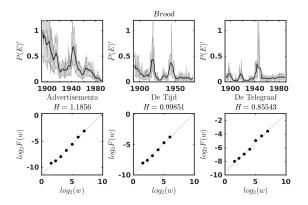


## Background



- dynamics are fundamental to cultural and historical objects of research
- in history and antropology "dynamics" almost has a status dogma





<sup>–</sup> structural features can often be "read off" the historical process, but are not captured by simple statistics

<sup>-</sup> risk of ignoring core features of the process (e.g. periodicity, fractal properties, long-range correlations).

Wevers, M., Nielbo, K. L., & Gao, J. (in review). Tracking the Consumption Junction: Temporal Dependencies in Dutch Newspaper Articles and Advertisements.

### Overview of Research Problems

### Die Kehre

- "authors of fiction (and non-fiction) undergo personal paradigm shifts"

## Dostoyevskian Trope

- "authors' creative states are inversely related to their emotional states"
- "authors' creative states *depend* on their emotional states" (state incongruent writers)

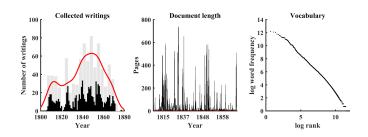
### Geertzian v-function

- particular case where the *kehre* is reflected in a topicality shift for state congruent writers, which might characterize successful innovators

### Sources of Danish Textual Cultural Heritage

- N.F.S. Grundtvig, active years 1804-1871 (born: 1783, dead: 1872)
- H.C. Andersen, active years 1829-1874 (born: 1805, dead:1875)
- S.A. Kierkegaard, active years 1830-1855 (born: 1813, dead: 1855)





## DATA Danish Textual Cultural Heritage

- -N = 1329 documents ( $n_{NSFG} = 921, n_{HCA} = 194^*, n_{SAK} = 214$ )
- language normalization (orthographic variation and casefolding)
- length normlization (slice len =  $10^2 10^3$  words)

### Normalization of Historical Texts

### Orthographic Variation

- automated analysis depends critically on existing tools and data (ex. sentiment dictionaries)
- NLP, IR and TM resources "suffer from presentism"
- projects often try to adapt the tool (ex. modify dictionary to historical data set)
- this solution scales badly due to lack of standardization

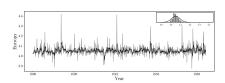
# Solution – statist

- statistical spelling corrector that treats historical variants as errors of contemporary Danish
- rule-based improvement

## the dostoyevskian trope

authors' creative states are related to their affective states (state incongruence)

- authors' creative states depend on their affective states
- use average dicationary-based
   sentiment scores as a proxy for author's affective states
- use Shannon's (source) entropy h
   as a proxy for author's cognitive complexity



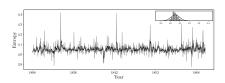
$$h = -\sum_{i=1}^K p_i \times \log_2(p_i)$$

$$p_i = Fr(w_i) / \sum_{i=1}^K Fr(w_i)$$

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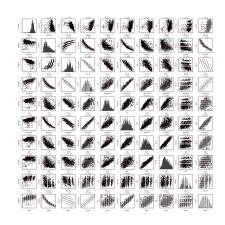


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## A comment on Shannon Entropy

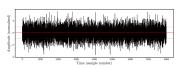
- axiomatic approach to information
- correlates with perceived complexity across modalities
- for natural language it is a direct measure of lexical variability
- associated with a wide range of readability\* measures
- lost popularity due to semiotics and chaos theory

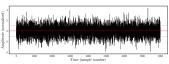


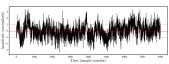


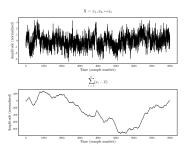
## Fractal properties of entropy

- not interested in an average state of complexity *per se*
- capture long-range correlations in h as a model of how complexity states persist
- Detrended Fluctuation Analysis or Adaptive Fluctuation Analysis
- estimate the power law relation between the overall variation for multiple time-windows (scales) as the Hurst exponent  $\cal H$



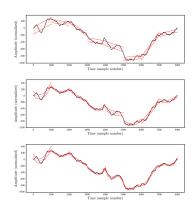






construct random walk process:

$$u(n) = \sum_{i=1}^{n} (x_i - \overline{x}), \quad n = 1, 2, \cdots, N,$$

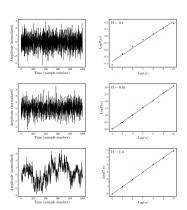




## Estimation and interpretation

for  $1/f^{2H+1}$  processes:

- anti-persistent process: 0 < H < 0.5
- short-range correlations only H = 0.5
- -0.5 < H < 1 persistent process





Finally, we estimate time-varying  $\boldsymbol{H}$  for the data in order to build "creativity" processes resulting in an:

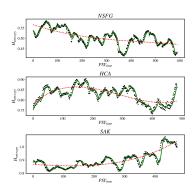
## Author Typology

**Kehre prototype** (persistence  $\rightarrow$  anti-persistence): NSFG

eternal child (persistence): HCA

extended 27 Club (persitence →

intermittency): SKS





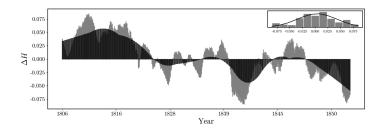


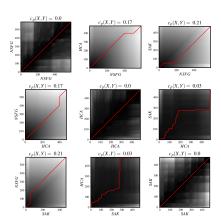
Table: Dominant Dynamic in the Phases of N.F.S. Grundtvig's Writings

Time period	Age of onset	Coarse	Fine	Behavior	Profile
1806-1826	23	H > 0.5	H > 0.5	persistent	theoretician
1826-1839	43	$H \leq 0.5$	$H \approx 0.5$	short memory	pragmatic
1839-1845	56	$H \leq 0.5$	H < 0.5	anti-persistent	breakthrough
1845-1848	62	$H \leq 0.5$	$H \approx 0.5$	short memory	disease
1849-1872	65	$H \stackrel{-}{\leq} 0.5$	H < 0.5	anti-persistent	politician

Nielbo, K. L., K.F. Baunvig, B. Liu & Gao, J. (in review). A Curious Case of Entropic Decay: Persistent Complexity in Textual Cultural Heritage.

### **Author comparison**

- with sequence alignment techniques (*DTW*), it becomes possible to compare dynamics between authors
- SKS is similar to HCA and dissimilar to NFSG, but that might have changed had SKS developed a late style



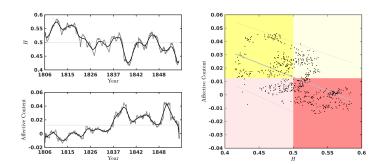


### Affective state

- Lexical matching based on a contemporary Danish sentiment dictionary
- Technique is popular for author profiling (among other things)

### Example

"Ingen veed, trods Halfreds Sange, Hvor Kong Olav fandt sin Grav;" nobody knows, in spite of Halfred's songs, where king Olav found his grave ingen vide trods Halfred sang hvor kong Olav finde sin grav  $\langle -1, 1, 0, 0, 0, 0, 0, 0, 0, 0, 0, -2 \rangle$ 



## Creativity::affect

 Author's creative states are inversely related to his emotional states – NSFG is an example of a state incongruent author



## **Granger Causality**

compare nested model:

$$y_t = \beta_0 + \beta_1 y_{t-1} + \dots + \beta_k y_{t-k} + \epsilon$$

with full model:

$$\mathbf{y}_{t} = \beta_{0} + \beta_{1} \mathbf{y}_{t-1} + \beta_{1} \mathbf{y}_{t-2} + \ldots + \beta_{k} \mathbf{y}_{t-k} + \alpha_{1} \mathbf{x}_{t-1} + \alpha_{1} \mathbf{x}_{t-2} + \ldots + \alpha_{m} \mathbf{x}_{t-m} + \epsilon$$

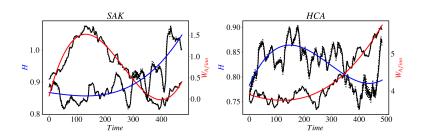
to see which one does the better job at explaining y by testing:

 $H_0: \alpha_i = 0$  for each i of [1, m]

 $H_1: \alpha_i \neq 0$  for at least one i of [1, m]

- bidirectional test such that dostoyevskian trope finds support IF we can confirm that 'Sentiment Granger cause h' AND reject that 'h Granger cause Sentiment'





## The Dostoyevskian Trope

state incongruent authors (creativity::affect): NFSG, HCA, SAK

writes on affective state (affect  $\rightarrow$  creativity): NFSG, SAK



### Conclusion

#### Kehre

- "No mathematician should ever allow himself to forget that mathematics, more than any other art or science, is a young man's game." (G.H. Hardy, *A Mathematician's Apology*, 1940)
- -30-40 yrs
- change in scaling dynamics for creativity that separates early and late writer: NFSG, SAK\*

### Dostoyevskian trope

- support for the state incongruent author among authors from 19<sup>th</sup> century Denmark
- some authors seem to be driven by their affective state

### Literary optimality

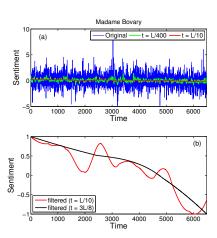
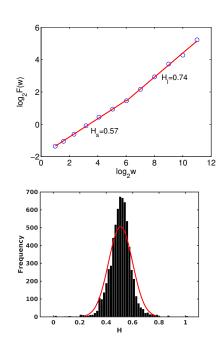


Figure: sentiment analysis and adaptive filtering reconstructs narrative vectors that reflect the reader experience. Particular fractal scaling-range,  $0.6 < H \leq 0.8$ , indicates literary optimality.



### THANK YOU

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