

# Cultural Disruption and Time-Dependency in Systems of Symbolic Production

CAARE, London 2016

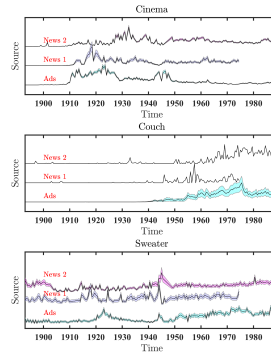
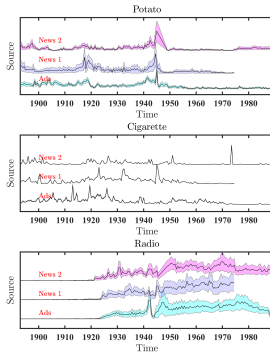
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## Cultural Disruption and Time-Dependency in Systems of Symbolic Production

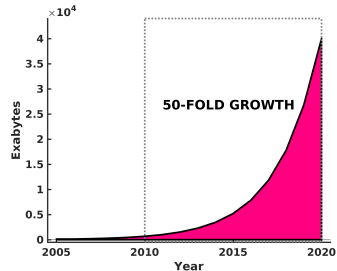
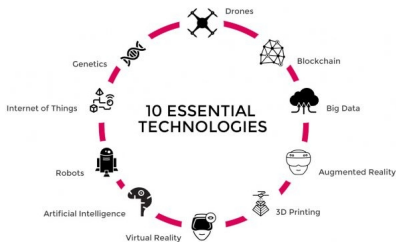
**CHALLENGES** to a valid study of human culture

- deep temporality|THEORY
- data surge|EMPIRICAL BASE
- black box solutions|METHODS implies THEORY



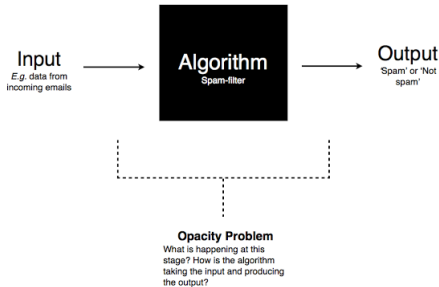
## DEEP TEMPORALITY

- human culture is characterized by a species-unique capacity for long-term planning and future-oriented information processing
- fundamental features of human culture are revealed in (persistent) temporal dynamics (e.g., cultural memory)
- ⊢ leverage tools from non-linear time series analysis



## DATA SURGE

- digitization and digital media have generated a rapid proliferation of data that is unprecedented in the history of man
- transforming knowledge discovery and understanding in every domain of human inquiry
- ⇒ build tools that can learn from data and automatically make the right decisions



## BLACK BOX

– the majority of algorithms available in machine learning libraries *black box* the solutions

– solve predictive tasks,  $P(spam | email)$ , but not conducive to the understanding of culture

⇒ combine techniques from ML with a more transparent theoretical framework that allow for time series analysis

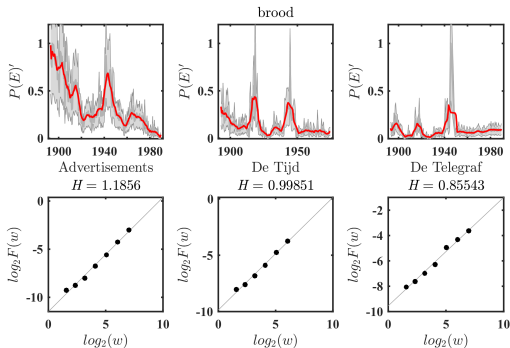
## INFORMATION THEORY

- model culture as internal and external transmission of information  $\Rightarrow$  rely on a well-established theoretical framework for quantifying information

$$H = - \sum_{i=1}^n p_i \times \log_2(p_i)$$

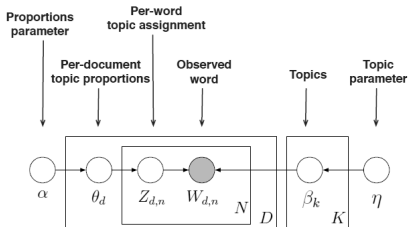
$$p_i = \frac{Fr(w_i)}{\sum_j^n Fr(w_j)}$$

- measures average amount of information in a text string as the (un-)predictability of the string in terms of its units (e.g., characters, words, ngrams)



## LONG RANGE DEPENDENCIES

- Hurst exponent is an index of the degree of persistence/long-term memory in time series (trends existing over a long time scale)
- $H_{exp} = 0.5$  indicates lack of long-term memory,  $0.5 < H_{exp} \leq 1$  indicates persistent behavior (i.e., long-term memory),  $H_{exp} < 0.5$  indicates anti-persistent behavior



## LATENT DIRICHLET ALLOCATION

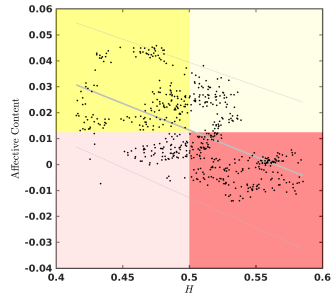
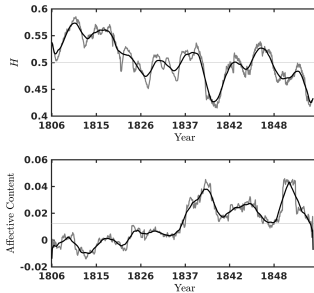
– culture is not only about information, it is about semantics  $\Rightarrow$  use a simple Bayesian mixed model to capture semantics at the lexical level

– model each document as a distribution on lexical topics (e.g.,  $P_1 = [0.09 \ 0.78 \ 0.11 \ 0.2]$ ), where each ‘topic’ is a distribution on words, and compare document similarity

$$D_{KL}(P \parallel Q) = \sum_{i=1}^n P(i) \times \log_2 \frac{P(i)}{Q(i)}$$

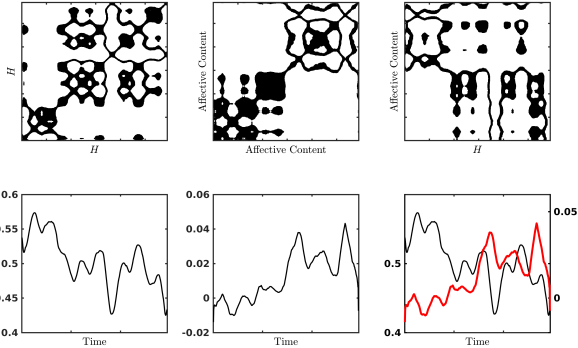
– bracket concrete semantics ( $\sim$  reduce interpretive load) and only compare relative documents on topics (need to validate the model)





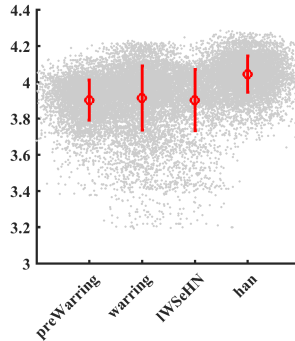
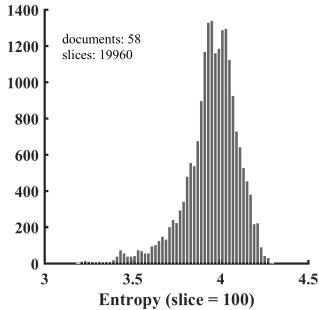
## PERSISTENCE in INDIVIDUAL COGNITION

- contours of cognitive profile (creativity and memory) of specific author
- use information to reconstruct the cognitive and affective mind of NFS Grundtvig



## INTERDEPENDENCIES and PREDICTIVE CAUSALITY

- coupling between creativity and affective content
- affective content *granger-cause* creativity

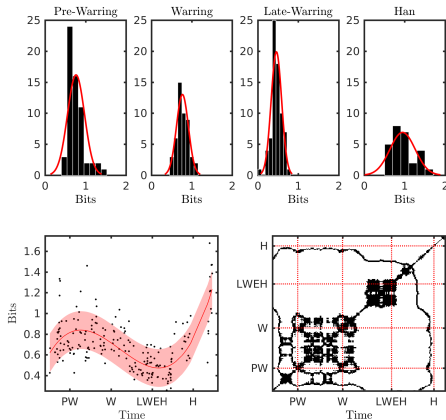


## LEXICAL DENSITY in SYMBOLIC PRODUCTION

$$H(\text{a rose is a rose is a rose}) < H(\text{a rose is red and thorny})$$

$$H(\text{a rose is a rose is a rose}) = H(\text{a a a is is rose rose rose})$$

$$H(\text{a rose is a rose is a rose}) = H(\text{erea oisassesar oiors})$$



## DISRUPTION in COLLECTIVE COGNITION

- trace evolution of ideas in classical Chinese literature
- use information to date controversial chapters of the Shangshu

## THANK YOU

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