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Title

Toward understanding 17th century English culture: A structural topic model of Francis Bacon's ideas

Venue

Journal of Comparative Economics

Topic labeling

Manual

Focus

Secondary

Type of contribution

Established approach

Underlying technique

Manual labeling assisted by associated documents

Topic labeling parameters

Examined associated documents: 20

Label generation

For each estimated topic, we examined closely the twenty documents that featured a given topic most prominently.

Table 3

Topics and top words for the estimated 16-topic STM.

1. Epistemology

Highest prob: natur, man, will, thing, philosophi, may, histori, knowledg, scienc, part, use, one, experi, can, mind, great, upon, shall, make, therefor, yet, first, matter, particular, understand, caus, much, invent, observ, true

FREX: philosophi, method, defici, logic, system, scienc, axiom, histori, metaphys, idol, discoveri, everyth, aristotl, invent, inquiri, theori, abstract, mathemat, rhetor, notion, mankind, deduc, knowledg, induct, fallaci, theolog, inventor, principl, poesi, contempl

2. Probing for Facts

Highest prob: say, will, man, one, shall, upon, come, great, answer, lord, make, take, give, king, may, think, day, tell, know, ask, hous, can, sir, see, time, like, use, much, mani, friend

FREX: overburi, impoison, somerset, ask, weston, diogen, galleri, bensalem, tell, poison, answer, pompey, nichola, vespasian, dinner, aristippus, gentleman, injunct, sir, front, chamber, yes, forgiv, tower, philip, friend, chair, ladi, feast, boat

3. Land Lav

Highest prob: use, law, shall, statut, make, feoff, upon, case, will, word, take, land, yet, therefor, may, seiz, estat, heir, first, can, act, reason, say, good, one, time, life, give, right, grant

FREX: feoff, cesti, feme, lesse, remaind, disseise, statut, aver, seiz, clausula, rend, duress, usuri, claus, leas, purchas, advowson, remitt, commonlaw, fee, proviso, tail, parol, demis, atturn, void, dissent, deed, bargain, enrol

4. King, Court & Law

Highest prob: majesti, will, shall, may, good, lord, upon, time, lordship, king, make, think, self, man, can, know, great, say, take, matter, letter, give, much, well, thing, god, now, mean, one, first

FREX: lordship, plantat, majesti, humbl, undertak, letter, squir, essex, solicitor, attorney, gracious, lord, project, pleas, queen, secretari, coke, chancellor, servic, busi, con, honest, advertis, pray, manuel, antonio, wish, care, protest, beseech

5. Law & Nation

Highest prob: law, king, shall, may, england, will, natur, majesti, one, subject, case, say, make, time, first, kingdom, man, therefor, can, scotland, person, upon, court, question, sever, point, whether, parliament, take, yet

FREX: scotland, england, duel, allegi, born, union, parliament, kingdom, britain, challeng, alien, conquest, gascoign, subject, question, vote, nation, offenc, royal, law, normandi, post, preced, crown, submiss, prerog, duchi, infer, court, style

6. Religious Law

Highest prob: god, man, time, learn, law, may, great, make, church, will, shall, upon, good, work, one, say, yet, thing, see, majesti, well, give, first, natur, matter, part, can, use, mani, person

FREX: learn, church, christ, preach, preacher, atheism, benefic, scriptur, dedic, controversi, baptism, liturgi, hospit, endow, alexand, god, theme, holi, reveal, prayer, ecclesiast, bishop, institut, ministri, ministr, callisthen, censur, pastor, polici, compil

7. Legal Theory

Highest prob: land, man, shall, king, good, feloni, may, make, upon, court, treason, call, take, justic, heir, parti, give, one, can, peac, will, law, offic, constabl, everi, yet, life, lord, grant, person

FREX: feloni, constabl, sheriff, counti, debt, executor, forfeit, escheat, juri, tenur, legaci, attaint, treason, petti, assiz, shire, felon, leet, attaind, gaol, owner, chattel, chap, indict, viii, clerk, writ, clergi, outlawri, praemunir

8. Religion & Diplomacy

Highest prob: great, upon, war, will, man, state, make, spain, time, say, shall, yet, may, peopl, part, one, king, take, come, now, england, mani, law, much, like, natur, nation, true, never, princ

FREX: spain, invas, spaniard, speaker, libel, cathol, war, spanish, enterpris, pollio, christendom, turk, sundri, heresi, leagu, palatin, navi, indi, defens, portug, papist, religion, nation, invad, fleet, confeder, armi, worship, lowcountri, nobil

9. Political Strategy

Highest prob: man, good, will, make, great, say, thing, upon, one, may, natur, can, time, much, shall, mind, like, yet, see, well, mani, come, part, virtu, take, therefor, use, person, first, fortun

FREX: envi, anger, dissimul, malum, felic, bewar, faction, evil, bold, tacitus, reprehens, cun, solomon, lover, secreci, fortun, gradus, discontent, reprehend, simul, virtu, precept, tiberius, friendship, demosthen, quoth, cicero, busi, machiavelli, eam

10. Dynastic Politics

Highest prob: king, upon, make, great, time, will, shall, come, man, may, part, take, person, one, peopl, also, yet, unto, war, well, princ, england, think, good, lord, much, can, duke, give, peac

FREX: perkin, maximilian, duke, earl, plantagenet, ferdinando, york, french, flander, margaret, ambassador, treati, richard, castill, charl, britain, ladi, rebel, ambassag, king, fillip, henri, lovel, london, john, duchess, bruge, stanley, tower, castl

11. Classical Thought

Highest prob: thing, man, may, natur, also, shall, say, seem, god, see, will, one, yet, unto, make, matter, can, time, great, like, take, come, mani, first, kind, well, fabl, much, jupit, upon

FREX: prometheus, jupit, proserpina, page, orpheus, miss, pan, cupid, siren, typhon, pentheus, sphinx, parabl, albeit, perseus, moreov, fabl, nemesi, giant, palla, bacchus, cere, muse, allegori, atalanta, monster, hercul, proteus, hell, icarus

12. Physics, Energy

Highest prob: motion, heat, bodi, natur, instanc, water, will, air, also, must, may, fire, place, can, part, let, one, cold, first, like, flame, yet, substanc, great, spirit, differ, observ, thing, power, appear

FREX: magnet, instanc, expans, similar, class, howev, anim, rapid, latent, liquid, heat, predomin, ignit, exist, ebb, homogen, heterogen, migrat, perpendicular, negat, expand, conspicu, investig, ray, excit, concret, motion, sphere, flame, exclus

13. Physics, Air & Sound

Highest prob: wind, sound, air, will, make, one, may, blow, thing, great, motion, water, part, bodi, upon, see, like, likewis, also, much, sail, caus, place, sea, man, come, shall, yet, south, two

FREX: wind, string, sound, brass, sail, rain, tone, blow, south, echo, percuss, bell, mast, east, pipe, nois, north, presag, articul, concav, audibl, dram, lute, west, cloud, nurseri, gale, loud, engend, tin

14. Botany

Highest prob: tree, will, upon, plant, fruit, make, may, earth, water, also, put, come, ground, grow, root, caus, forth, like, great, herb, seed, flower, set, leav, see, kind, bear, one, therefor, much

FREX: sap, plum, cherri, tree, moss, oak, pear, herb, bough, holli, stalk, peach, dung, radish, fig, graft, blossom, cucumb, plant, lettuc, rosemari, mushroom, wheat, vine, escul, colewort, compost, mistleto, turnip, fruit

15. Life & Death

Highest prob: man, life, year, long, live, age, thing, old, also, hundr, spirit, bodi, may, yet, great, time, death, one, part, much, now, young, creatur, will, last, touch, shall, good, mani, without

FREX: diet, repar, eighti, nineti, canon, liver, aliment, hundr, repair, age, live, prolong, etern, statur, thi, youth, vital, life, desicc, seventi, old, long, short, year, fifti, function, consubstanti, ghost, jesus, consumpt

16. Pharmacology

Highest prob: bodi, spirit, will, water, part, may, make, upon, see, caus, also, heat, air, thing, great, therefor, like, take, much, use, man, natur, time, motion, cold, put, littl, good, one, come

FREX: liquor, tooth, oil, opiat, broth, explic, amber, stomach, beer, nitr, bottl, putrefact, opium, saffron, refriger, sugar, wine, milk, intener, astring, malaciss, purger, indur, smell, sweat, vinegar, infus, drink, candl, spirit

Note that the 'words' listed above are those used by STM after reducing all original text words to their stemmed form. Thus, for example, 'theolog' could reflect an original usage of theology, theologies, theologian, theologians, theologise, theologised, theologises, theologising, etc, etc.

Motivation

The assignment of names to the estimated topics is a crucial step in the analysis because our ultimate conclusions about the features and the cultural origins of Bacon's thought are based on which particular topics are reflected in Bacon's corpus, which topics are correlated across documents, which topics entail overlapping vocabulary, and how Bacon's usage of different topics varies with both intended audience and document form.

Readers will note below that we are able to easily identify the underlying ideas for all 16 topics and assign non-controversial names for each. This is evidence for the internal validity of our results.

Topic modeling

STM

Topic modeling parameters

Nr of topics: 5 to 25

Nr. of topics

16

Label

Single or multi-word manually assigned labels

Label selection

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Label quality evaluation

Assessors

Domain

Paper: Law, History

Dataset: Law

Problem statement

We use machine-learning methods to study the features and origins of the ideas of Francis Bacon, a key figure who provided the intellectual roots of a cultural paradigm that spurred modern economic development.

Bacon's works are the data in an estimation of a structural topic model, a recently developed methodology for analysis of text corpora.

The estimates uncover sixteen topics prominent in Bacon's opus. Two are key elements of the ideas usually associated with Bacon-inductive epistemology and fact-seeking.

We provide the first quantitative evidence that the genesis of Bacon's epistemology lies in his experience in the common-law.

Combining our findings with accepted arguments in the existing literature, we suggest that the effects of common-law culture can help explain the coincidence of early political and economic development in England.

Corpus

Origin: Project Gutenberg, Hathi Trust, Internet Archive, The Text Creation Partnership for Early English Books Online (2014).

Nr. of documents: 282

Details:

all Bacon's works that had been digitized accurately enough that most words could be machine read.

orks included in the corpus.	orks included in the corpus.					
Name or type of work	No. of text documents (chunks					
New Atlantis	5					
Novum Organum	17					
The Advancement of Learning	12					
The Use of the Law	5					
A Collection of Apothegms, New and Old	6					
History Natural and Experimental of Life and Death	9					
Sylva Sylvarum	10					
The History of The Reign of King Henry the Seventh	6					
The Natural and Experimental History of Winds	7					
The Wisdom of the Ancients	5					
The Elements of the Common Laws of England	28					
Other (various essays, letters, speeches, case reports)	172					
Total	282					

Form of communication								
Audience	Apothegm	Case report	Essay	Letter	Speech	Tome	Total	
Historians	0	0	2	0	0	12	14	
Lawyers	25	1	12	22	10	4	74	
Methodologists	1	0	3	1	0	34	39	
Philosophers	6	0	42	2	0	0	50	
Politicians	2	1	16	36	3	0	58	
Scientists	0	0	20	0	1	26	47	
Total	34	2	95	61	14	76	282	

Document

Document (chunk) part of one of Bacon's literary work + two metavariables, namely:

- Bacon's intended audience—historians, methodologists, lawyers, politicians, scientists, or philosophers
- Form of his finished work-case reports, apothegms, letters, essays, book-length tomes, or speeches.

Topical prevalence (or importance) is modelled as a function of a linear combination of the dummy variables reflecting the two metadata covariates. Thus, the *K*topics that we identify with Bacon are the same across all documents but the prevalence of each topic (element of d) varies with document type.

Pre-processing

- The chaotic orthography of late 16th and early 17th century English was converted into standard modern orthography using a program that absorbed the database available with MorphAdorner.
- word inflections were then removed by converting all words to their lexical roots (stemming)

- latin words were stemmed and translated into English
- all words were converted to lower case
- Standard English stop words (natural language words which carry very little meaning, such as 'and', 'the', 'a', 'an'), numbers, and punctuation were removed.

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ural_topic_model_of_francis_bacons_ideas,
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of the ideas of Francis Bacon, a key figure who provided the intellectual roots
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prominent in Bacon's opus. Two are key elements of the ideas usually associated
with Bacon---inductive epistemology and fact-seeking. The utilitarian promise
of science and the centralized organization of the scientific quest, embraced
by Bacon's followers, were not emphasized by him. Using strategic
communication, Bacon facilitated reception of his scientific methodology,
targeted influential groups, and finessed powerful opponents. We provide the
first quantitative evidence that the genesis of Bacon's epistemology lies in
his experience in the common-law. Combining our findings with accepted
arguments in the existing literature, we suggest that the effects of common-law
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