## New Perspectives on the Classical Chinese Philosophy: A Computational Approach

Co-PIs: James Miller & Charles Chang

Student Leader: Junyi Tao

Student Team:

Distant Reading: Youzhang He | Xiaoyin Chen Close Reading: Miechen Liu | Jiaming Li





## Research Objectives

• Exploring ways to capture the distinctive features of the philosophical schools of the pre-Qin and Han dynasties

• Long-term goal: track the change over time

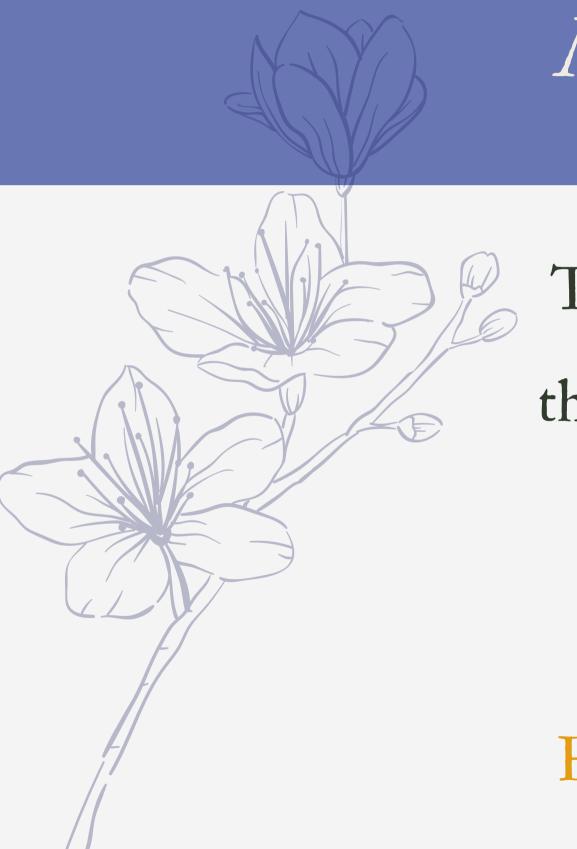


#### CONTENT

- meanings of polysemous words varying across schools
- their distributions and themes they represent

#### WRITING STYLE

- frequency of entities
- sentence structure



### Motivation

To discover perspectives that cannot be illustrated by the traditional close reading paradigm

- 1. Using the agnostic nature of algorithms
- 2. Large-scale analysis

Exploratory!



- 1. Close reading: summarize patterns + interpretations
- 2. Distant reading
  - a. Unsupervised: provide suggestive meanings/patterns
  - b. Supervised: test the importance of selected features
- 3. Close <--validate--> Distant

## Corpus Description



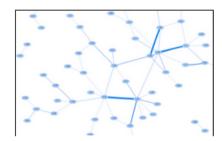
#### **Text Project** Text Project

#### Welcome

Welcome to the Chinese Text Project homepage. The Chinese Text Project is an online open-access digital library that makes pre-mc digital medium to explore new ways of interacting with these texts that are not possible in print. With over thirty thousand titles and existence.

You may wish to <u>read more about the project</u>, view the <u>pre-Qin and Han</u>, <u>post-Han</u> or <u>Wiki</u> tables of contents, or <u>consult the instruc</u> main textual sections of the site.

網站有中、英文版本,也有繁、簡體版,可通過每頁左上角的連結隨時調整。





九年末末 一世紀 十田田 十甲町	MARK PRODUCES OF LAND
(単質) ※※※	PRIMA
1 200 子曰:「季而時間2、不亦欲乎?有明白	歳方来・不許乗手?人不知而不性・不許君子子?」
2 本本 有子曰:「其為人也孝弟·而好犯上者。 本立而祖生。孝弟也者,其为仁之本與!	鲜矣;不好犯上,而好作亂者,未之有也。君子榜本。 」
3 一子曰:「巧吉令他・鮮矣仁!」	
4 100 世子曰:「吾日三倉百身:為人間而不忠	乎?與朋友交而不信乎?傳不留乎?」
5 mm 子曰:「國千集之國:敬事而位・館用而	要人,使我以時。」
6 ····· 子白:「弟子入則孝·比別弟・維而信。	汎便用・困難仁・行有勢力・則以孝文・」
7 === 子夏曰:「質質易色・事父母能竭其力・ 之事矣・」	申析能效其身、與朋友交言而有信。雖日未申、吾必謂
★ 子台:「前子不重別不威・學別不出・主	念性・無友不知己者・護則切俘改・」

This site is provided as an open-access resource. If you use this site in your teaching or research, please ask your university

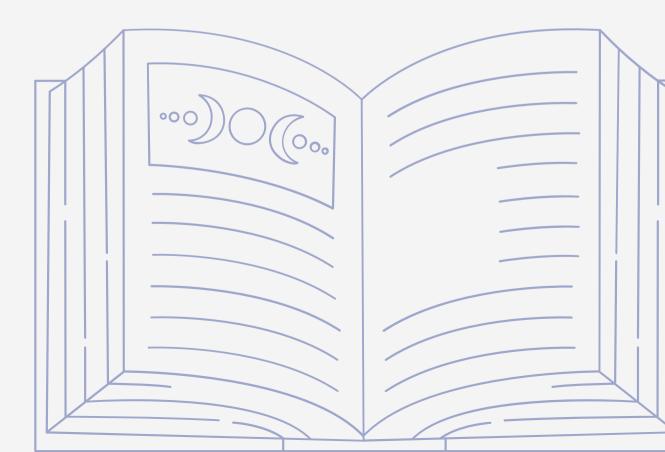
#### https://ctext.org/

The Chinese Text Project is an online open-access digital library that makes pre-modern Chinese texts available to readers and researchers all around the world. With over thirty thousand titles and more than five billion characters, the Chinese Text Project is also the largest database of pre-modern Chinese texts in existence.

Pre-Qin and Han	<u>Confucianism</u>	<u> </u>	<u>儒家</u>
	Mohism		<u>墨家</u>
	<u>Daoism</u>		<u>道家</u>
	<u>Legalism</u>		<u>法家</u>
	School of Names		<u>名家</u>
	School of the Military		<u>兵家</u>
	<u>Mathematics</u>		<u>算书</u>
	Miscellaneous Schools		<u>杂家</u>
	<u>Histories</u>		<u>史书</u>
	Ancient Classics		经典文献
	Etymology		<u>字书</u>
	Chinese Medicine		<u>医学</u>
	Excavated texts		<u> 猫文土出</u>
Post-Han	Wei, Jin, and North-South	汉代之后	魏晋南北朝
	Sui-Tang		<u>隋唐</u>
	Song-Ming		<u>宋明</u>
	Qing		清代
	Republican era		民国



## Content Analysis — meanings

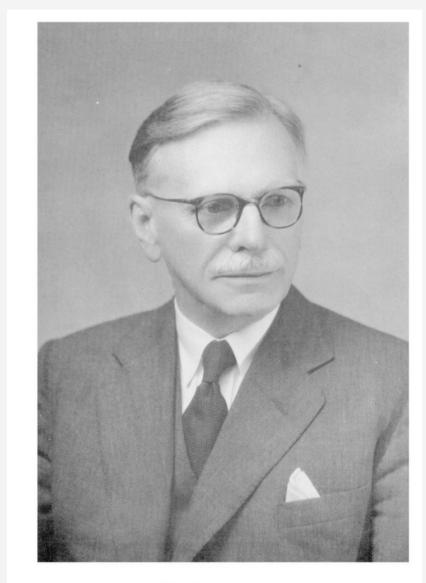


# You need a theory of the meaning of concepts And a theory of the words and phrases that express them in the corpora

What is the meaning of Tesgüino?

#### Some contexts:

- 1. A bottle of Tesgüino is on the table
- 2. Everybody likes Tesgüino
- 3. Don't have Tesgüino before your drive
- 4. We make Tesgüino out of corn



JOHN RUPERT FIRTH

## Distributional Hypothesis: You shall know a word by the company it keeps (Firth, 1957)

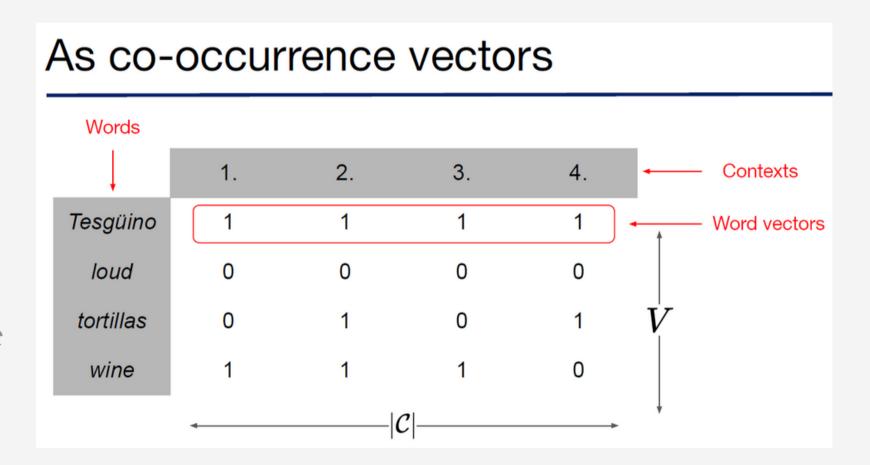
=> need to represent the contexts, e.g. collocations or embeddings...

Meaning is use! => need a lot of data

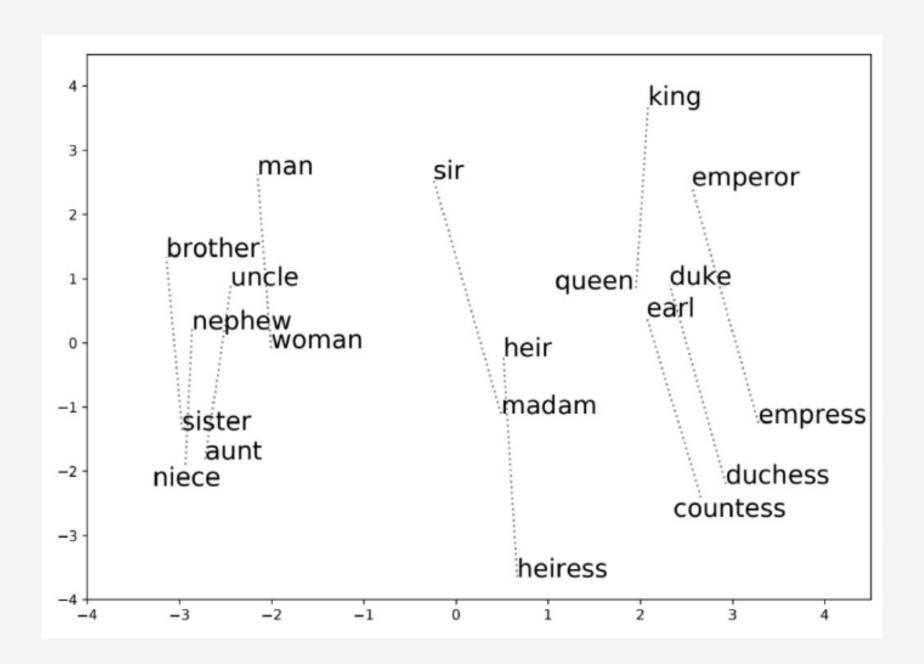
### Distributional Hypothesis: Vector similarity implies semantic similarity

What is the meaning of Tesgüino? Some contexts:

- 1. A bottle of Tesgüino is on the table
- 2. Everybody likes Tesgüino
- 3. Don't have Tesgüino before your drive
- 4. We make Tesgüino out of corn



#### Intrinsic evaluation



- a. Do the embeddings agree with human intuitions of word similarity?
- b. Do the embeddings preserve word analogies?

### PIPELINE

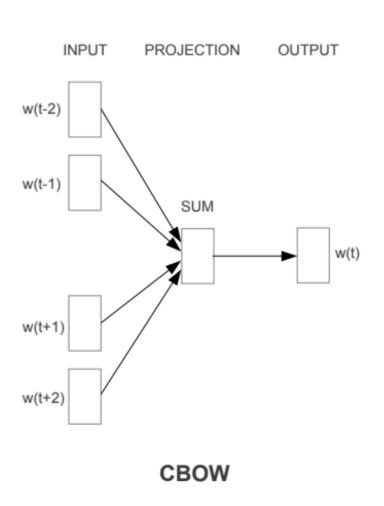
identify
polysemous words
identify key
philosophical concepts

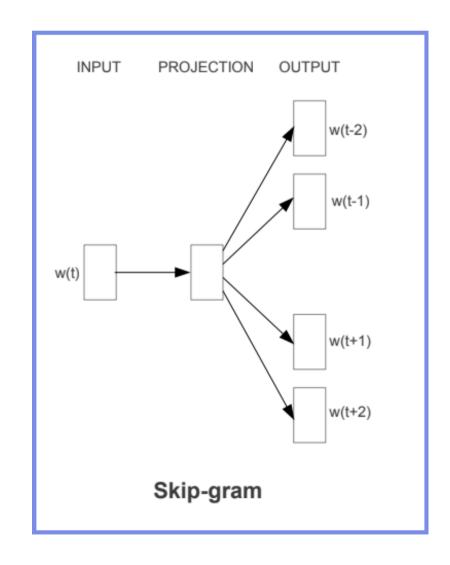
represent
these words
summarize
themes

word embedding meanings interpret features (skipgram - word2vec) (in each schools) of schools

try: context embedding (bert)

## Methods: Word2vec (Skipgram)





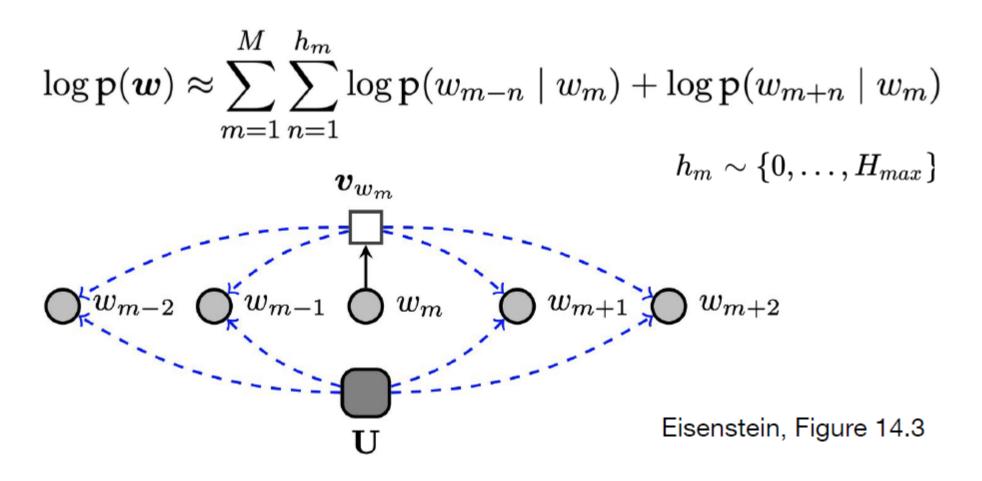
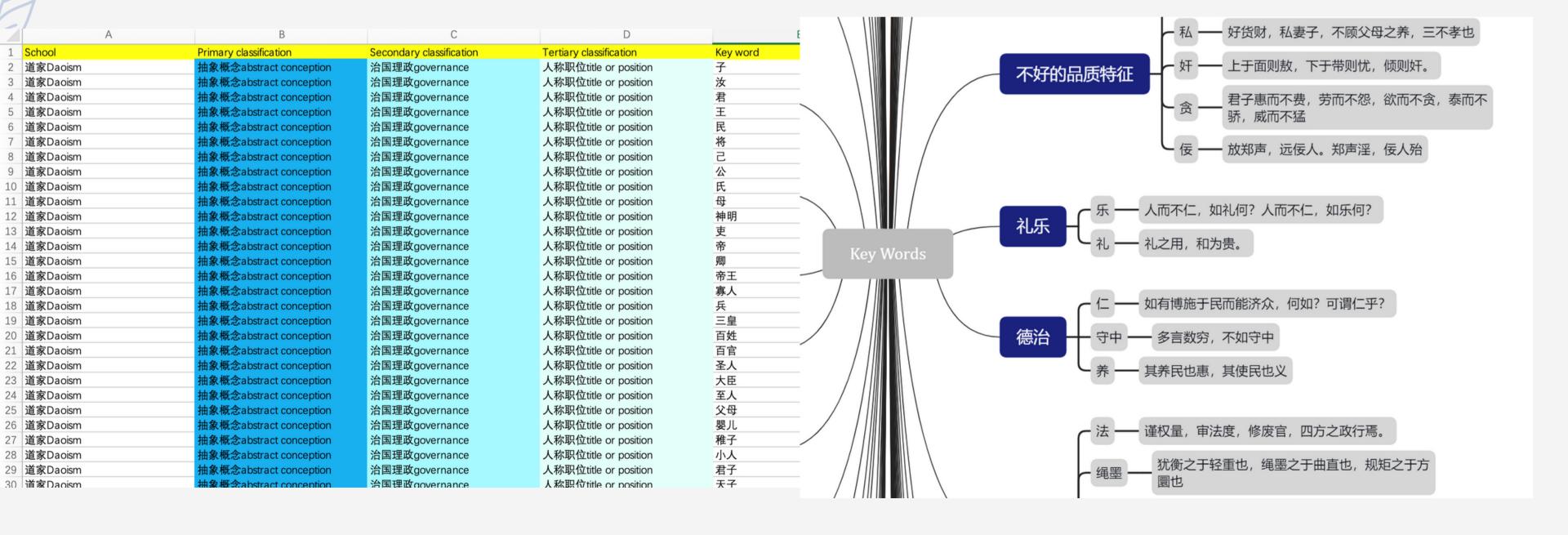


Figure 1: New model architectures. The CBOW architecture predicts the current word based on the context, and the Skip-gram predicts surrounding words given the current word.



### Content - close reading Summarize key concepts and themes

# Keywords -> themes





### Content - close reading Summarize key concepts and themes

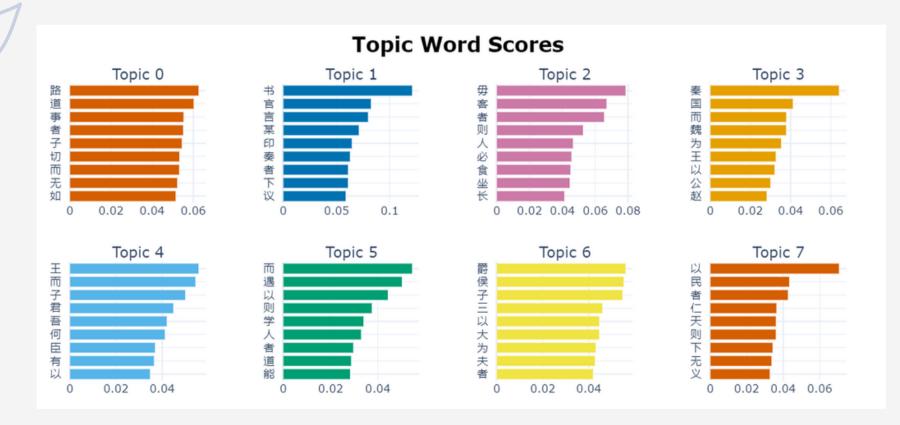
# Keywords -> themes

1	Meaning		nool of thou	title	original text	ılish_transla	\key concept\	nterpretation
2	自然界 material world	https://cte xt.org/hes hanggong/ 23/zhs?se archu=自 然 &searchm ode=show	道家	《老子河上公章句·虚无》	帝言目然。帝言者,謂愛言也。愛言者,目然之追。 取飄風小終朝,驟雨小終日。 飄風,疾風也。驟雨,暴雨也。言疾不能長,暴不能久也。孰為此者?天地。孰, 誰也。誰為此飄風暴雨者乎?天地所為。天地尚不能久,不能終於朝暮也。而況於 人乎?天地至神合為飄風暴雨,尚不能使終朝至暮,何況人欲為暴卒乎。故從事於 道者,從,為也。人為事當如道安靜,不當如飄風驟雨也。道者同於道,道者,謂 好道人也。同於道者,所謂與道同也。德者同於德,德者,謂好德之人也。同於德 者,所謂與德同也。失者同於失。失,謂任己而失人也。同於失者,所謂與失同也 。同於道者,道亦樂得之。與道同者,道亦樂得之也。同於德者,德亦樂得之,與 德同者,德亦樂得之,因失同者,生亦樂失之也。信於		風、雨、德、朝、日、天地、人、从、道、失 、同、乐、信、云、龙、风、虎、水、火	
3	自然界 material world	https://cte xt.org/huai nanzi/yuan -dao- xun/zhs?se archu=自 然 &searchm ode=show all#result	杂家	《淮南子·原道训》	夫萍樹根于水, 木樹根於土, 烏排虛而飛, 獸蹠實而走, 蛟龍水居, 虎豹山處, 天地之性也。兩木相摩而然, 金火相守而流, 員者常轉, 窾者主浮, 自然之勢也。		萍、树、木、水、土、鸟、飞、兽、走、蛟龙 、虎豹、山、天地、性、金、火、员、传、窾 、浮、势	
4	自然界 material world	https://cte xt.org/lv- shi-chun- qiu/lun- ren/zhs?se archu=自 然 &searchm ode=show all#result	<b></b>	《吕氏春秋·论人》	何謂反諸己也?適耳目,節嗜欲,釋智謀,去巧故,而游意乎無窮之次,事心乎自然之塗,若此則無以害其天矣。無以害其天則知精,知精則知神,知神之謂得一。凡彼萬形,得一後成。故知一,則應物變化,闊大淵深,不可測也。德行昭美,比於日月,不可息也。豪士時之,遠方來賓,不可塞也。意氣宣通,無所束縛,不可收也。故知知一,則復歸於樸,嗜欲易足,取養節薄,不可得也。離世自樂,中情潔白,不可量也。威不能懼,嚴不能恐,不可服也。故知知一,則可動作當務,與時周旋,不可極也。舉錯以數,取與遵理,不可惑也。言無遺者,集肌膚,不可革也。讒人困窮,賢者遂興,不可匿也。故知知一,則若天地然,則何事之不勝,何物之不應?譬之若御者,反諸己,則車輕馬利,致遠復食而不倦。昔上世之亡主,以罪為在人,故日殺僇而不止,以至於亡而不悟。三代之興王,以罪為在己,故日功而不意,以至於王		己、适、节、释、去、欲、智谋、巧故、游、 意、无穷、事、心、天、害、精、神、知、一 、变化、德行、日月、意气、得、量、极、贤 者、物、王、罪、功	
	自然界 material world	https://cte xt.org/gui- gu-zi/sun- dui-fa- ling- shi/zhs?se archu=自		《鬼谷子·损兑法灵蓍》	損兌者,機危之決也。事有適然,物有成敗,機危之動,不可不察。故聖人以無為 待有德,言察辭,合於事。兌者,知之也;損者,行之也。損之兌之,物有不可 者,聖人不為之辭。故智者不以言失人之言,故辭不煩而心不虚,志不亂而意不邪 。當其難易,而後為之謀;因自然之道以為實。圓者不行,方者不止,是謂大功。 益之損之,皆為之辭。用分威散勢之權,以見其兌威,其機危乃為之決。故善損兌		损兑、事、适然、物、成败、危机、动、察、 圣人、德、知、行、言、辞、心、志、谋、难 易、功、益、形势	

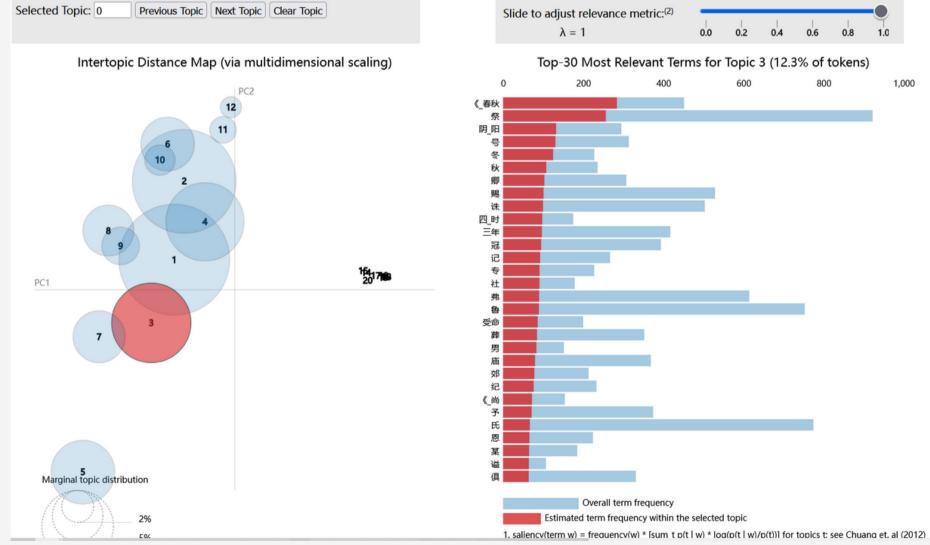


### Content - distant reading Topic modeling

# Keywords -> themes



Suggest representative key words for the close reading team to interpret, select, and categorize



Close reading

Distant reading



## Pipeline of Content Analysis (iterative) 24, 2023

- human-summarized patterns (of key words and meanings of polysemous words)
- topic modeling-produced results -> suggest representative words
- revise human-selected lists with the results + identify topics and categorize words
- input into word embedding
- separate background and target words (separate the same words in different schools), based on frequency and interpretations
- test out word embeddings
- interpret the results and compare with the pre-made hypotheses



### Content - distant reading Unsupervised embedding (key concepts)

#### Hypotheses

- 1. target words -- for hypothesis testing
  - a. differences in meanings across schools
  - b. relations with other concepts in certain contexts
- 2. background words -- for pre-defined assumptions

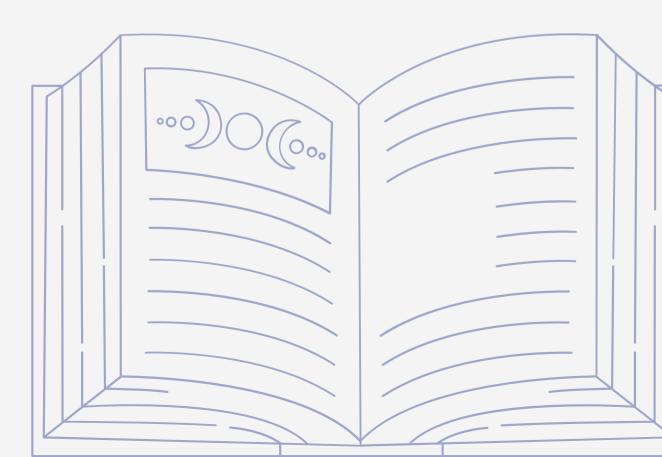
.1	1 1	<u> </u>	Г	G
theme	target_word	detailed category	backgrou	nd_word
political/sociological	家	命运	辱	_
political/sociological	国	命运	宠	
political/sociological	民	命运	福	
political/sociological	君			
person - negative	小人	命运	中和	
person - positive	君子	命运	和气	
person - positive	圣人	事物变化规律	祸	
virtue - positive	仁	事物变化规律	变	
virtue - positive	德	事物变化规律	盈	
virtue - positive		事物变化规律	虚	
virtue - negative	恶	事物变化规律	妙	
myth/metaphysical	命	事物变化规律	常	
myth/metaphysical	自然	事物变化规律	乱	
spiritual/intellectual	道	事物变化规律	物	
spiritual/intellectual	理	事物变化规律	万物	
spiritual/intellectual	心	官职称呼	郡县	
spiritual/intellectual	性	官职称呼	寡人	
others	法	官职称呼	人事	
others	死	官职称呼	郡守	
others	病	官职称呼	执政	
others	富贵	官职称呼	举兵	



demo



## Writing Style Analysis

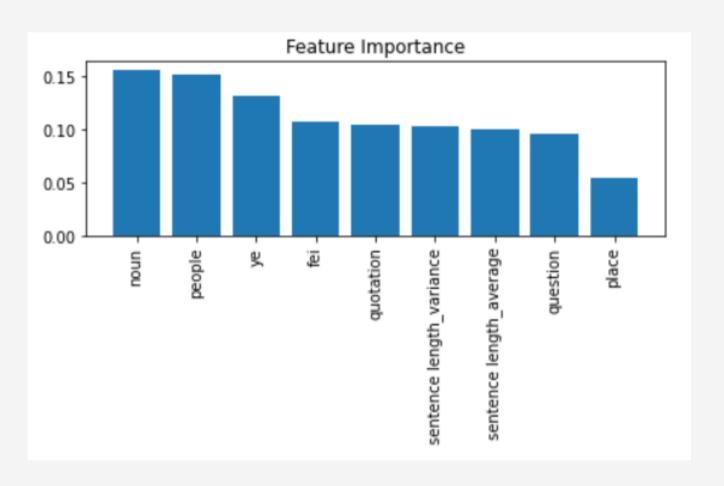


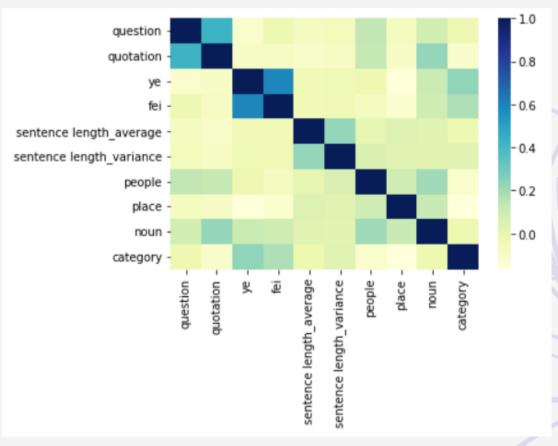


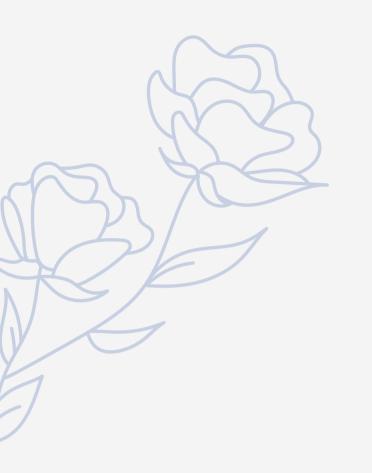
- human-summarized patterns (of sentence structures)
- design features for the machine learning model
- analyze feature correlations and importance
- keep experimenting

## Writing Style

### Parameters: frequency of entities, sentence structure







## Thank you