

# Ancient India meets Data-Science

The 2nd and concluding Workshop of SPIRITS project

**"Chronological and Geographical Features of Ancient Indian Literature Explored by Data-Driven Science"**

## 古代インドとデータサイエンス

SPIRITS プロジェクト

「データ駆動型科学が解き明かす古代インド文献の時空間的特徴」

第2回（最終）ワークショップ

it's also

A Kick-off for Joint International Research

**"A Study of Language Layers in Vedic Literature for the Development of a Program for Age-Estimation"**

国際共同研究

「ヴェーダ文献における言語層の考察と  
それを利用した文献年代推定プログラムの開発」  
のキックオフを兼ねて



*Collection of  
Presentation  
Slides*

発表資料集

Organizer: SPIRITS Project "Chronological and Geographical Features of Ancient Indian Literature Explored by Data-Driven Science" (Kyoko Amano, Hiroaki Natsukawa, Oliver Hellwig, Yuki Kyogoku); Fostering Joint International Research (B) of KAKENHI "A Study of Language Layers in Vedic Literature for the Development of a Program for Age-Estimation" (Representative researcher: Kyoko Amano)

主催：京都大学研究支援 SPIRITS 2021「データ駆動型科学が解き明かす古代インド文献の時空間的特徴」（天野恭子、夏川浩明、Oliver Hellwig、京極祐希）、国際共同研究強化（B）2021-2026「ヴェーダ文献における言語層の考察とそれを利用した文献年代推定プログラムの開発」（研究代表者：天野恭子、課題番号：21KK0004）

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共催：京都大学学術情報メディアセンター、天野恭子白眉プロジェクト「古代インド祭式文献の言語および社会的・文化的成立背景の研究」、科研費挑戦的研究（萌芽）2020-2022「古代インド文献成立過程解明に向けた文体計量分析のためのデータベース構築」（研究代表者：天野恭子、20K20697）

**SPIRITS**  
SUPPORTING PROGRAM FOR INTERACTION-BASED  
INITIATIVE TEAM STUDIES



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# The Result of the Two-Year SPIRITS Project and Our Vision for the Next Research.

2年間のSPIRITSプロジェクトの成果と  
今後の研究への展望

**Kyoko Amano** (Kyoto University, Hakubi Center / Institute for Research in Humanities)

天野恭子 (京都大学 白眉センター／人文科学研究所)

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## The Result of the Two-Year SPIRITS Project and Our Vision for the Next Research

**Kyoko Amano**

(Kyoto University, Hakubi Center / Institute for Research in Humanities)

Workshop "Ancient India meets Data-Science"



2022/2/11

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## Our two Projects

Kyoto University SPIRITS project (FY2020-2021)

**Chronological and Geographical Features of Ancient Indian Literature Explored by Data-Driven Science**

Fostering Joint International Research (B) of KAKENHI (FY2021-2026)

**A Study of Language Layers in Vedic Literature for the Development of a Program for Age-Estimation**

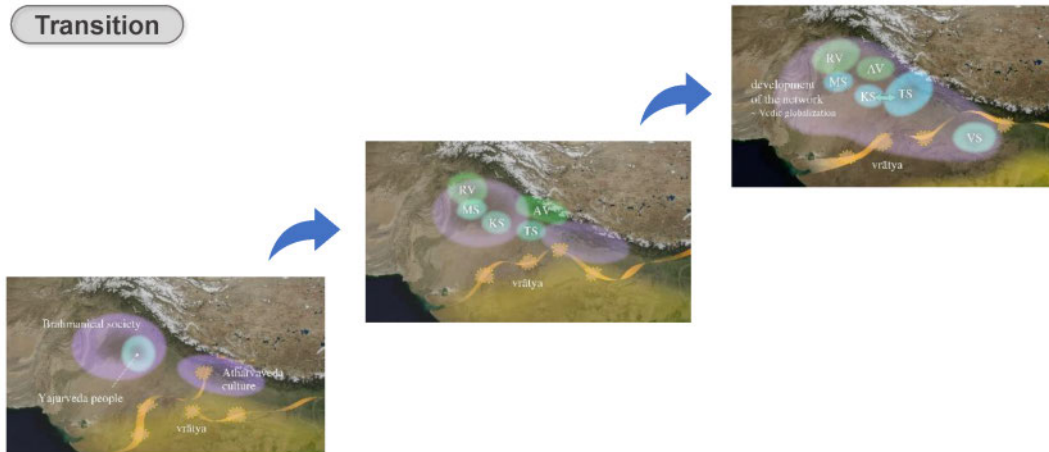
collaborating with "Chron-BMM - Bayesian Mixture Models für die Datierung von Textkorpora" lead by Oliver Hellwig

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## The Vedas: religious literature of Ancient India ca 15th to 5th century BCE

Transition



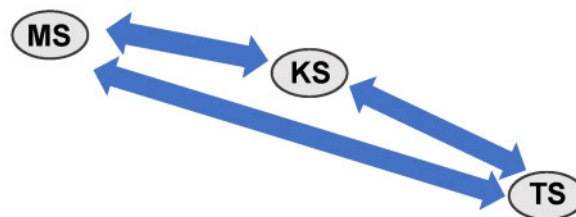
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## Focus on Maitrāyaṇī Samhitā (MS), Kāṭhaka-Samhitā (KS), Taittirīya-Samhitā (TS)

(collectively called Yajurveda-Samhitās)

900 to 700 BEC;  
an early stage of development of Vedic ritual

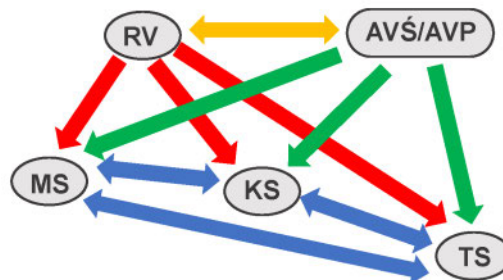


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## Older texts (1500 - 1000 BCE; probably some parts were added later)

- Rgveda (RV)
- Atharvaveda Śaunaka and Paippalāda (AVŚ and AVP)



Unraveling the relationship between these sources of influence will be the  
foundation of our quest to understand the development of Vedic ritual and society.

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## About the Vedas

**Vedic studies according to the history and localization, and details of the background of our project,**

see the collection of the presentation slides for the 1st Workshop on 2021/2/12.

in chat box and on our website

<https://ancientindia-datascience.hakubi.kyoto-u.ac.jp/en/news-en/>

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## Studies for the project "Chronological and Geographical Features of Ancient Indian Literature"

- 1) relationships among the texts considering mantra co-occurrence,
- 2) similarity among chapters of the texts using computational analysis of vocabulary.

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## Relationships among the texts considering mantra co-occurrence

**Mantra = ritual formula recited in rituals**

**Co-occurrence of mantras in several texts can indicate relationship among them.**

- Few co-occurrence . . . . . far relationship
- Many co-occurrence . . . . . close relationship

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## Relationships among the texts considering mantra co-occurrence

- **Bloomfield, Maurice (1893):**

A Vedic Concordance. [Harvard Oriental Series 10].  
Cambridge – Mass.

- **Franceschini, Marco (2007):**

An updated Vedic concordance :

Maurice Bloomfield's A Vedic concordance  
enhanced with new material taken from seven  
Vedic texts.

Cambridge: Dept. of Sanskrit and Indian Studies,  
Harvard University

-aiśāṃ vivasvantaṃ brūmah # AVŚ.11.6.2c; AVP.15.13.3c.  
-aiśāṃ na pratijñate # RV.3.45.4b.  
-aiśāva śiṣa madhuraṇṭah # ApŚ.1.25.5.  
-aiśāvah sapta saptaṇṭi # AVŚ.19.6.16b; AVP.9.5.14b.  
-aiśāś ca bhaṣāś ca # TA.1.13.3c.  
-aiśāś te hastam agrabhīt # ApMB.2.3.9 (ApG.4.10.12). Cf. agniś te etc.  
-aiśāṃ jātichvāp vi bhājāmi tñ vah # AVŚ.11.1.5c.  
-aiśāya svāhā # VS.10.5; TS.1.8.13.3; MS.2.6.11; 70.9; KS.15.7; ŚB.5.3.5.9.  
-aiśāṃ rihanti māyayā paṇipatam # RV.9.86.46c.  
-aiśāṃ soṃśayātām mūrye # AVP.5.13.4c.  
-aiśāṃ gubhastī (KS. babbastī) haritebhīr āśabhiḥ # KS.35.14d; ApŚ.14.29.3d. See aiśāṃ babbastī.  
-aiśāṃ goṇy agastyam # RV.8.5.26b.  
-aiśānā te aiśāḥ # VS.20.27a; TS.1.2.6.1a; BŚ.6.14; 171.7a. Ps. aiśānā te aiśāḥ pṛcyaṭām ApŚ.10.24.5; aiśānā te  
KS.19.1.21. (Mahīdh., anuṣṭubh, but pṛcyaṭām is enclitic).  
-aiśānetham u ād v anyathā # SV.1.305d.  
-aiśāṃ dadhanvān madhuno vi rapṣate # RV.10.113.2b.

electronic edition of A Vedic Concordance  
This index is used as a database.

Data for the investigation of the relationship among the texts:

Index for ca 90,000 mantras that appear in all Vedic literature, with names of  
literature and the places.

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## Relationships among the texts considering mantra co-occurrence

Visualizing the co-occurrence of mantras

- Relational Database using SQLite
- Co-occurrence relationships among the 19 texts
  - Identified 150 relationships involving these 19 important texts.
- Visualize the relationship between two selected texts.
- Scatter plot and parallel coordinate plot.
- Visualizing the chapter structure with colors.



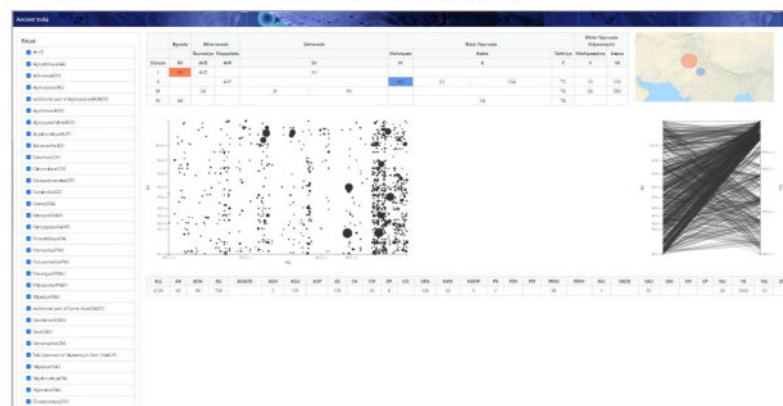
<http://34.146.175.179/>

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## Relationships among the texts considering mantra co-occurrence

New functions: Classification by ritual

Numerical Data of the number of co-occurred mantras

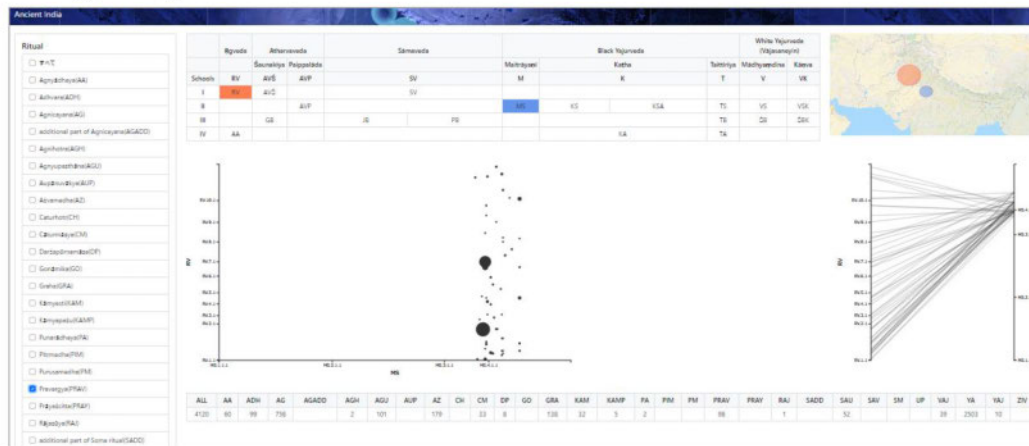


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## Relationships among the texts considering mantra co-occurrence

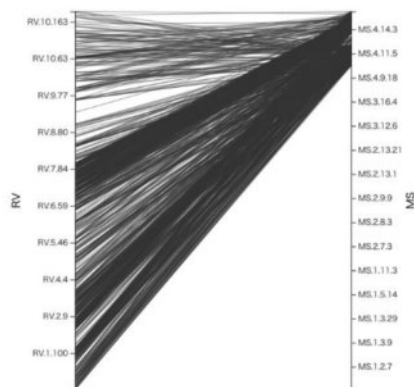
### choosing pravargya ritual



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## Relationships among the texts considering mantra co-occurrence

improving the data

[illegible]

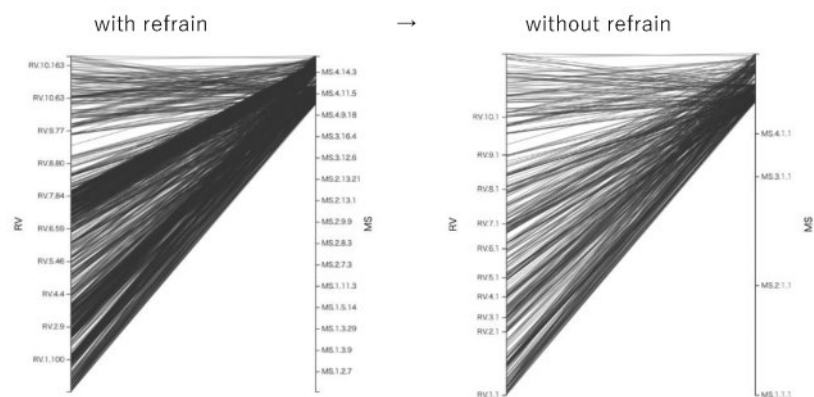
(Vedic Concordance)

Refrain...78 times in the 7th book!

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## Relationships among the texts considering mantra co-occurrence

improving the data



It is important to check and examine the original texts!

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It became possible to examine the data for each ritual, further paving the way for a precise study of the internal structure and production process of the text.

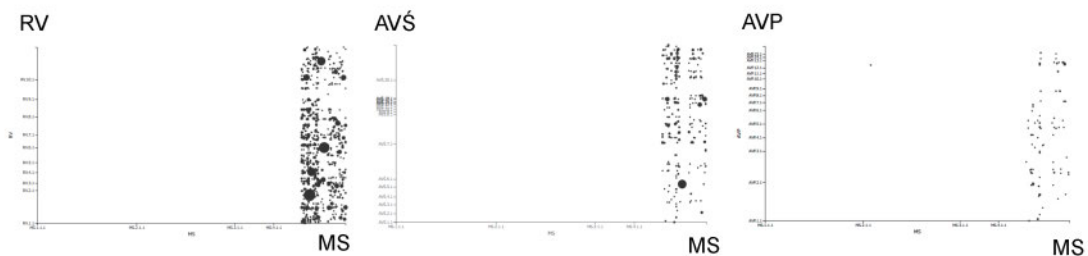
Compare the yājñānuvākyās and the agniciti mantras.

- **yājñānuvākyās (MS IV 10-14):**  
a collection of hymns praising the gods, used in various ritual offerings, composed in the late stages of MS/KS/TS editing.
- **agniciti mantras (MS II 7-13):**  
the agniciti is a ritual performed by constructing a huge fire altar, using many verses of RV/AV throughout;  
belong to the middle period of MS/KS/TS editing, when MS/KS/TS developed the śrauta ritual together.

 **Point** influence from RV/AVŚ/AVP in both rituals

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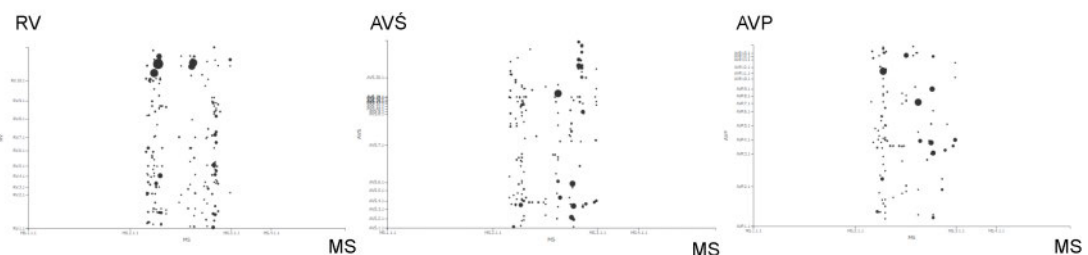
## yājñānuvākyās of MS



Influence  $RV > AVŚ > AVP$

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## agniciti mantras of MS



Influence  $RV \approx AVŚ \approx AVP$

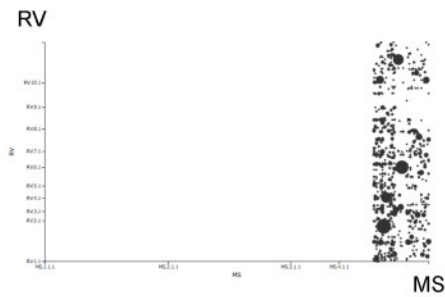
Amano (forthcoming)

"Influence of the Atharvaveda on rituals of the Maitrāyaṇī Samhitā", presentation at "The Atharvaveda and its South Asian Contexts: 3rd Zurich International Conference on Indian Literature and Philosophy (ZICILP)", University of Zurich, 27 September 2019.

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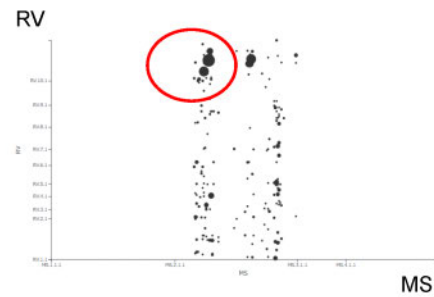


## RV-MS relationship at yājñanuvākya and agniciti



yājñanuvākya

influence from RV 1-8th books

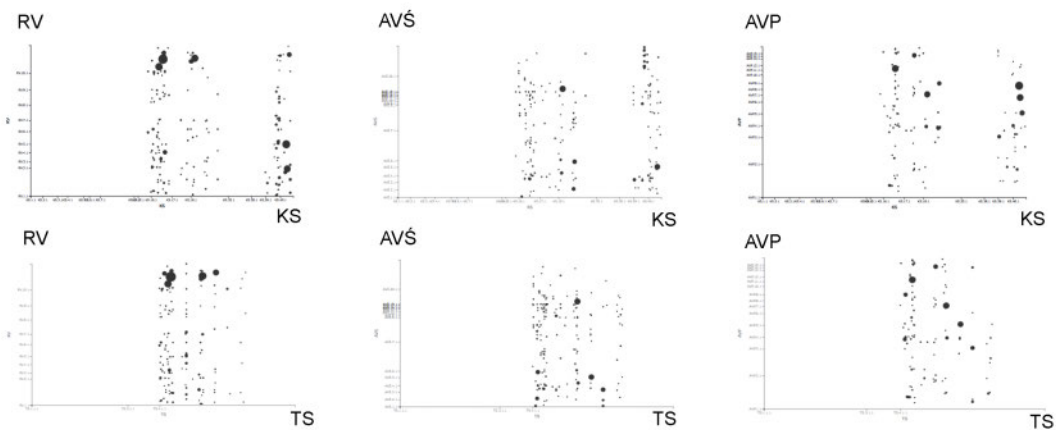


agniciti

influence from RV 10th book

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## agniciti mantras in KS and TS



Influence from AVP in KS and TS a little more than in MS.

Influence from RV 10 in the main mantra part of KS, but not in the additional part.

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## Two different phases, probably chronological

agniciti

complex of AVŚ, AVP and RV 10;  
KS, TS more contact to AVP.



yājñanuvākya

influence fo RV, less AVŚ, less AVP.



This examination can make clear each ritual's origin, schools' geography, and increase or decrease in the schools' influence.

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## Further examination using data of mantra occurrence

Using the co-occurrence relationships as a cue to measure the degree of similarity between chapters,

— how similar and to which texts can be examined as feature of a chapter — to determine the relationships between chapters (within a single text, or within MS/KS/TS) and explore the process of literature production.

This topic will be followed up in a presentation by Dr. Natsukawa.

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## Similarity analysis among chapters using vocabulary

### What does the analysis aim to reveal?

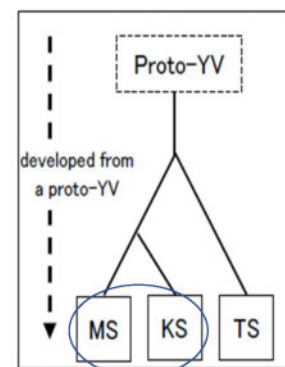
to reconsider the relationship between MS, KS, and TS.

Traditionally thought of as them having a common prototype from which the MS/KS branch and another branch, TS, split.

But in recent years, a new view of the close relationship between KS and TS.

MS (KS TS)

old model



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## MS/KS/TS relationship also underwent changes throughout their editing period.



Computational lexical analysis such as with w2v and TRACER can precisely determine the degree of similarity between MS/KS/TS chapters, that helps to classify the chapters into the periods.

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## Plan for the new project "A Study of Language Layers in Vedic Literature for the Development of a Program for Age-Estimation"

Analysis of syntax

Important: uses of particles and pronouns

: function of verb tense and mood.

These can be good indicators to stratify the linguistic layers

→ Examples from my recent studies of MS

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## Syntactic phenomena as indicator for linguistic layers

*ha vai* "consequently" or *tad* "so, then, thus" used with the phrase *ya evaṃ vidvān / veda* (Amano 2020)

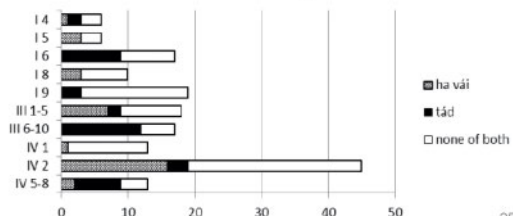
sarvā ha vā asya yakṣyamāṇasya devatā yajñam āgacchanti ya evaṃ veda //  
 sarvā ha vai idam vaj devatā vajña āgam, vad evam vid.  
 n.p.f. indecl. indecl. g.s.m. Fut., g.s.m. n.p.f. ac.s.m. 3. pl., Pre. ind. n.s.m. indecl. 3. sg., Perf.

All deities **consequently** come to his sacrifice, as he is planning to hold a sacrifice, when he knows thus.

tad ya evaṃ veda bhavaty ātmanā // (23) Par  
 tad vad evam vid, bhū ātman.  
 ac.s.n. n.s.m. indecl. 3. sg., Perf. 3. sg., Pre. ind. i.s.m.

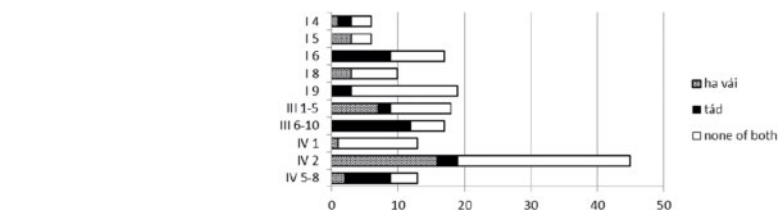
So, he himself successes, when he know thus.

The numbers of *ha vai* and *tad* at *ya evaṃ vidvān/veda* in the chapters of MS:

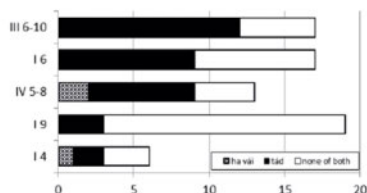


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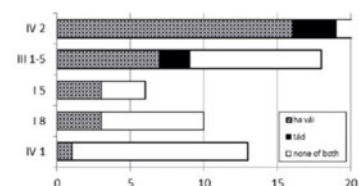
## "ha vai chapters" and "tad chapters"



chapters with frequent use of *tad*



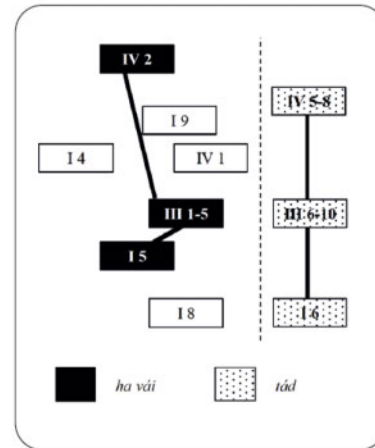
chapters with frequent use of *ha vai*



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## "*ha vai* chapters" and "*tad* chapters"

This examination of preference of *ha vai* or *tad* can be reflected to a supposition of inner structure or process for composition:

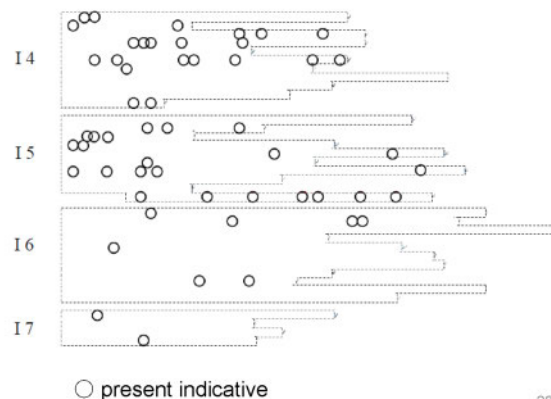


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## Ratio of the present tense in the ritual prescription (Amano 2013-2014)

Possible constructions for ritual prescription

- Present indicative *X dadāti* "he gives X."
- Optative *X dadyāt* "he should give X."
- Gerundive *X deyam* "X should be given."



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To recognize this feature as indicators of the linguistic layer, it is important to note that the functions and usages of present tense are differentiated in the data.

different functions/usages of present indicative (Amano 2009, 10-13):

- prescription *naktam agniṃ grhṇāti* "He (the sacrificer) takes fire at night."
- general statement *asurā vā naktam prerate* "The Asuras have action at night."
- result of a ritual act *jyotiṣaiva tamas tarati* "He overcomes the darkness (the Asuras, night) with the light (fire)."

brāhmaṇa (ritual explanation) consists of

[prescription] + [general statement / myth] + [result of ritual act].

type of sentence is important!

(Sanskrit *vidhi* "prescription" and *arthavāda* "explanation of the purpose / meaning")

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## Enhance XML/TEI data to distinguish functions

- prescription      *naktam agniṃ gr̥ṇāti* "He (the sacrificer) takes fire at night."
- general statement    *asurā vā naktam prerate* "The Asuras have action at night."
- result of a ritual act    *jyotiṣaiva tamas tarati* "He overcomes the darkness with the light."

<s /> sentence

<w /> word

<w lemma="gr̥ṇ" type="VERB" tense="PRE" function="prescription">gr̥ṇāti</w>

or

<s type="prescription">naktam agniṃ gr̥ṇāti</s>

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## Another useful indicator

In a sentence describing the **result of a ritual act**,

- 1) whether the verb is **present or aorist**, and
- 2) whether **eva** or **vā etad** stands (or others such as *tad*, *ha*, *svid*, and so on).  
*etad* acc. sg. nt. pronoun, adverbial use "in this way"

- *jyotiṣaiva tamas tarati* "He overcomes the darkness with the light."  
eva + present
- *svām vā etad devatām baṃhayate*. "He strengthens his own deity in this way."  
vā etad + present
- *tā eva bhāgadheyaṃ opāsarāt* "He has sought refuge in them with a share for them."  
eva + aorist
- *devatā vā etad agraḥīt*. "He has grasped the deities in this way."  
vā etad + aorist      about aorist for result of ritual act, see Amano (2009), 16f.

## Ratio of these constructions can be useful as indicator of linguistic layer

In a sentence describing the **result of a ritual act**,

- 1) whether the verb is **present or aorist**, and
- 2) whether **eva** or **vā etad** stands

- Aorist in this function is MS-specific. KS and TS have less examples for this aorist
- Also *eva* or *vā etad* can indicate the wording characteristics of each chapter or text.
- For aorist, we should distinguish the functions, "result\_of\_ritual\_act", "ritual\_act\_done\_before", "actual\_past". (see Amano 2009, 15-18)

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## Further distinction: Functions of the particle *eva*

*jyotiṣaiva* *tamas tarati* "He overcomes the darkness with the light."

*tā eva bhāgadheyenopāsarat* "He has sought refuge in them with a share for them."

### Distinction of *eva* in the sentence for result of a ritual act from *eva* in other function

*eva* in the sentence <s type="result\_of\_ritual\_act">

<w type="PART" function="advmod">*eva*</w>

advmod: adverbial modifier

*eva* in other type of sentence, to emphasize the foregoing word

<w type="PART" function="advmod:emph">*eva*</w>

→ useful to make Universal Dependencies;  
see Biagetti / Hellwig / Scarlata / Ackermann / Widmer (2021):  
"Evaluating Syntactic Annotation of Ancient Languages. Lessons from the Vedic Treebank"

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## Further distinction: functions and usages of acc. sg. n. *etat*

*devatā vā etat agrahīt.* <s type="result\_of\_ritual\_act">

"He has grasped the deities in this way."

<w lemma="etat" type="PRON" case="Acc" case\_function="advmod"

reference\_function="anaphoric" reference="previous\_s">

BUT NOT

*prāṇam vā etat paśavaḥ pratidhāvanti yad varṣeṣu vātaṃ pratijighrati.* <s type="general\_statement">

"Animals go against the breath in this way that they catch the scent of wind in the rain."

<w lemma="etat" type="PRON" case\_function="advmod"

reference\_function="cataphoric" reference="yad">

*etat* in normal pronominal function (anaphoric, cataphoric, recognitional)

For example, <w lemma="etat" type="PRON" case="Nom" number="Sing" gender="Neut"

reference\_function="recognitional" reference="havis">

recognitional: pointing to knowledge of the addressee (Kümmel 2014, Amano 2009)

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## Another possible indicator of linguistic layer: Position of adverbial *tad* in sentence for result of ritual

In the second position in the sentence:

*na sarvāṇi saha yajñāyudhāni prahr̥tyāni. mānuṣaṃ tad kriyate*

"One should not bring all sacrificial tools together. Then he makes something related to human."

<s type="prescription">*na sarvāṇi saha yajñāyudhāni prahr̥tyāni*</s>

<s type="result\_of\_ritual\_act">*mānuṣaṃ tad kriyate*</s>

<w lemma="tad" type="PRON"

case\_function="advmod" reference="previous\_s\_prescription">*tad*</w>

In the opening position in the sentence (and before *ya evam veda*):

*tato deva abhavan, parāsurās. tad yad evaṃ veda, bhavaty ātmanā.*

"Following this, the gods became (winner), the Asuras faded away. So, he (the sacrifice) himself successes, when he knows thus."

<w lemma="tad" ... case\_function="advmod" reference="previous\_s\_myth">

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## Another possible indicator of linguistic layer: Position of adverbial *tad* in sentence for result of ritual

In the second position of the main sentence; yad-tad construction

*yad* varāhavihatam upāsyāgnim ādhatta, imām eva *tan* nāpārāt.

"When he establishes his fire after throwing dirt drug up by boars, he doesn't **then** miss the [earth] (as target place)."

<w lemma="tad" ... case\_function="advmod" reference="yad">

Such different uses of adverbial *tad* can indicate linguistic feature of each chapter and text.

36

## Plan for a new visualization tool

- Quantify the number of sentences and draw a map (one line corresponds to one chapter)
- Mark the places showing certain linguistic phenomena.

Amano 2013-2014

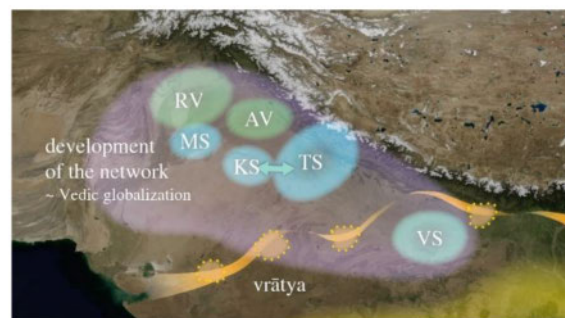


This is still my ideal visualization to highlight the linguistic layers.  
I would like to develop a tool to create automatically this kind of visualization from annotated data (XML/TEI).

37

## Future task: Geographer wanted!

From relative position to actual geography



We need to introduce geographical knowledge!

38

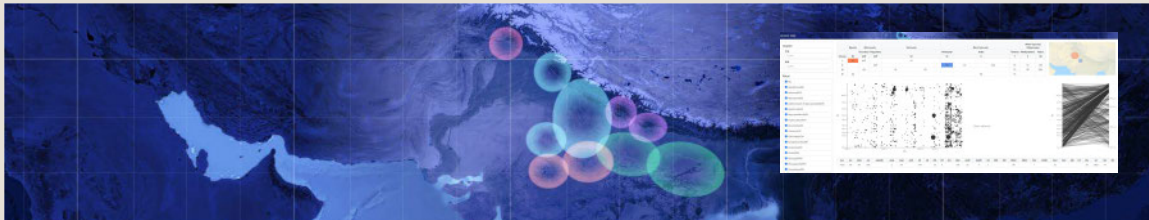
# Visualization meets Ancient India: Mapping the Structure of Vedic Texts

可視化と古代インド研究：  
ヴェーダ文献の構造のマッピング

**Hiroaki Natsukawa** (Kyoto University, Academic Center for Computing and Media Studies)

夏川浩明 (京都大学 学術情報メディアセンター)

1



## Visualization meets Ancient India : Mapping the Structure of Vedic Texts

「可視化と古代インド研究：ヴェーダ文献の構造のマッピング」

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Kyoto University, Academic Center for Computing and Media Studies



京都大学  
KYOTO UNIVERSITY

**SPIRITS**  
RESEARCH INSTITUTE FOR INTELLECTUAL PROPERTY  
INFORMATION SCIENCE

2



## Visualization meets Ancient India : Mapping the Structure of Vedic Texts

「可視化と古代インド研究：ヴェーダ文献の構造のマッピング」

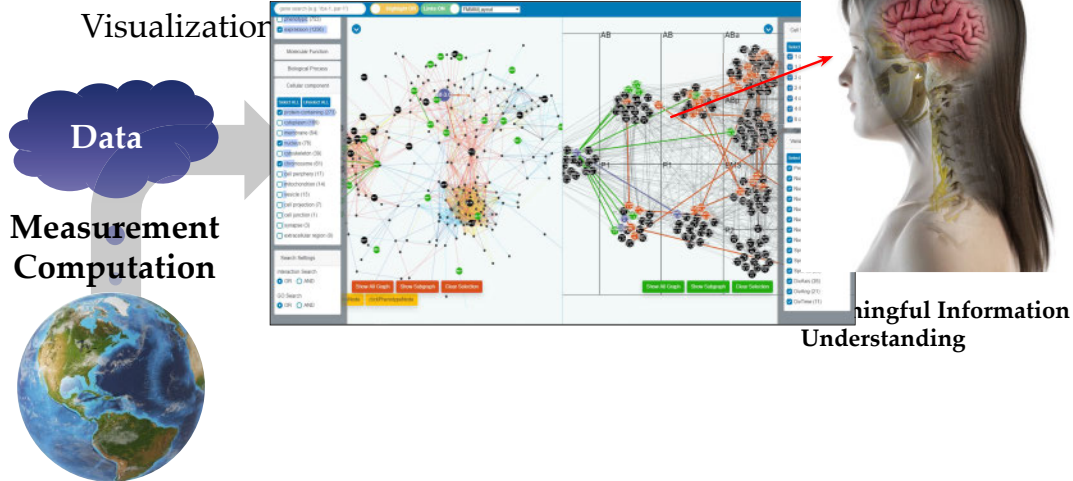
- Visualization & How to find a dinosaur
- Visualization Tool for Ancient Indian Literature
- Mapping the Co-occurrence info globally
- Mapping the structure of vedic texts



3



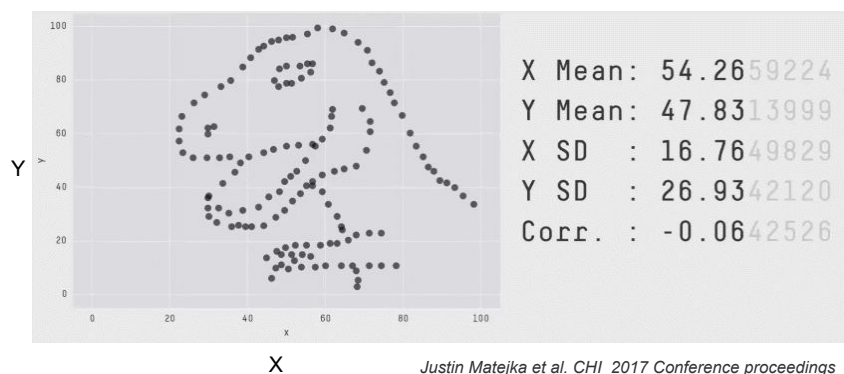
## Visualization



4



## Visualization & Visual Analytics



Justin Matejka et al. CHI 2017 Conference proceedings

**Importance of looking at the data itself**

5

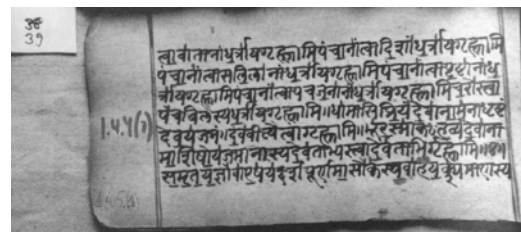


## Visualization Contributing to the Analysis of Ancient Indian Literature

Examining the origins of literature through the relationship of mantras in 19 documents

**Ancient Indian ritual texts BC1200-500**

- Mantras (祝詞)
- Historical classification of literature
- Schools of literature
- Geographical characteristics of the schools



	Rgveda			Atharvaveda			Sāmaveda			Black Yajurveda			White Yajurveda (Vajrasaneyin)		
	Saunakiya			Paippalāda						Maitrayani			Katha		
Schools	RV	AVS	AVP	SV	SV	SV	M	K	T	V	VK				
I		RV	AVS		SV										
II			AVP				MS	KS	KSA	TS	VS	VSK			
III		GB		JB	PB								TB	SB	SBC
IV	AA							KA	TA						



## Database

### Ancient Indian ritual texts BC1200-500

• avāryāni pakṣmāṇi pāryā iṣṣavaḥ TS.1.6.1.1 MS.1.1.2 KS.1.10 BŚ.3.16

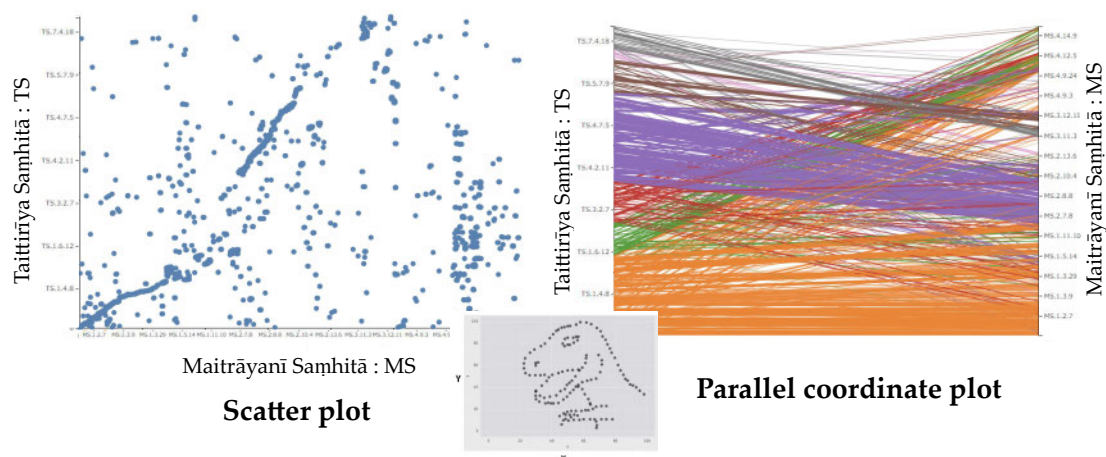
**We've tried to look at the co-occurrence of mantras in each literature**

- Relational Database using SQLite
- Co-occurrence relationships between 19 literatures
- Chapter structure of literature
  - Relationships among about 150 sets of documents

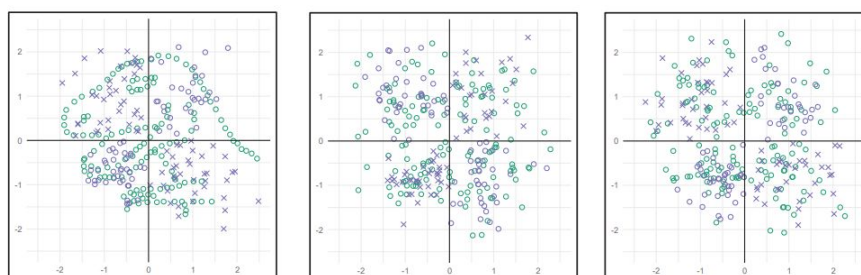
id	section	section_group	name	type
70	RV 1.2.7a	RV 1.2	RV	RV
71	RV 1.2.7b	RV 1.2	RV	RV
72	RV 1.2.7c	RV 1.2	RV	RV
73	RV 1.2.7d	RV 1.2	RV	RV
74	RV 1.2.7e	RV 1.2	RV	RV
75	RV 1.2.7f	RV 1.2	RV	RV
76	RV 1.2.7g	RV 1.2	RV	RV
77	RV 1.2.7h	RV 1.2	RV	RV
78	RV 1.2.7i	RV 1.2	RV	RV
79	RV 1.2.7j	RV 1.2	RV	RV
80	RV 1.2.7k	RV 1.2	RV	RV
81	RV 1.2.7l	RV 1.2	RV	RV
82	RV 1.2.7m	RV 1.2	RV	RV
83	RV 1.2.7n	RV 1.2	RV	RV
84	RV 1.2.7o	RV 1.2	RV	RV
85	RV 1.2.7p	RV 1.2	RV	RV
86	RV 1.2.7q	RV 1.2	RV	RV
87	RV 1.2.7r	RV 1.2	RV	RV
88	RV 1.2.7s	RV 1.2	RV	RV
89	RV 1.2.7t	RV 1.2	RV	RV



## Visualizing the Co-occurrence of Mantras in Ancient Indian Literature



## How to find a dinosaur: Inattentional Blindness



An example dinosaur

Plot type 1: Forward-slash ("x"s only in quadrants 1 and 3)

Plot type 2: Back-slash ("x"s only in quadrants 2 and 4)

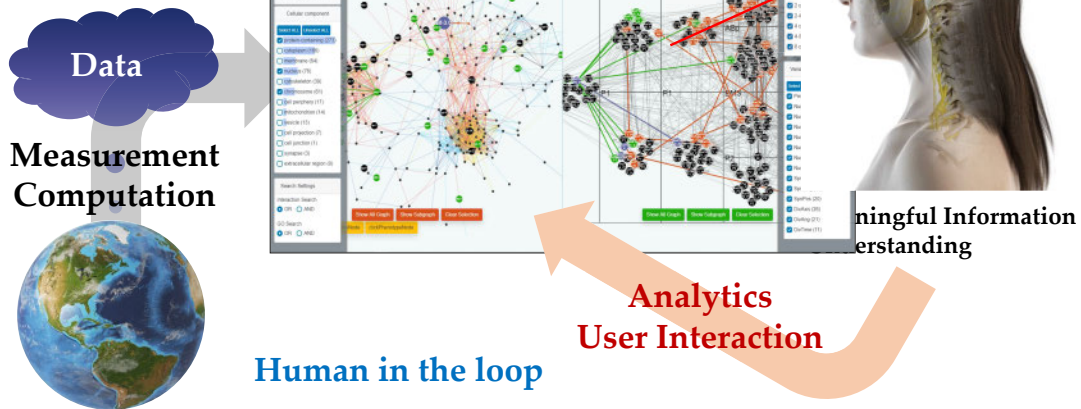
Tal Boger et al. IEEE VIS 2021 Conference short paper

**Importance of iterative process of exploration**

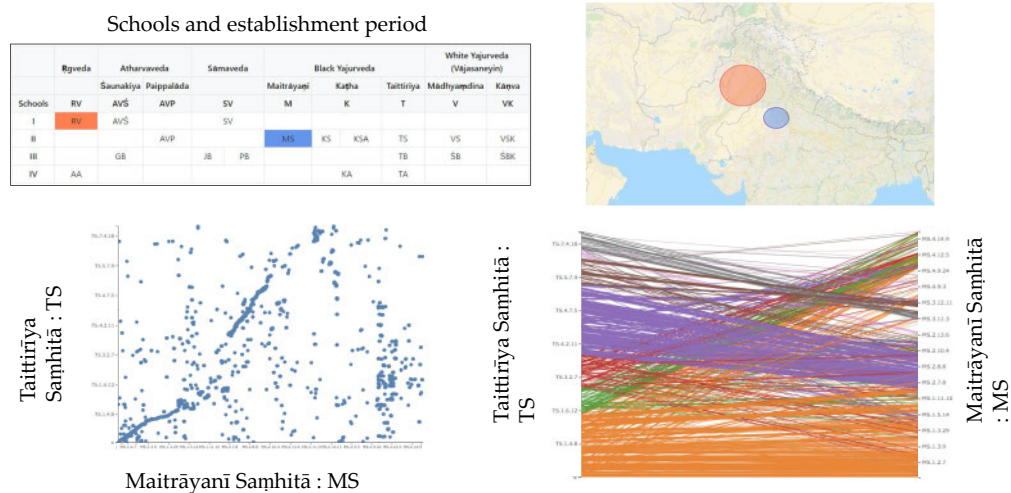


## Visual Analytics

### Interactive Visualization



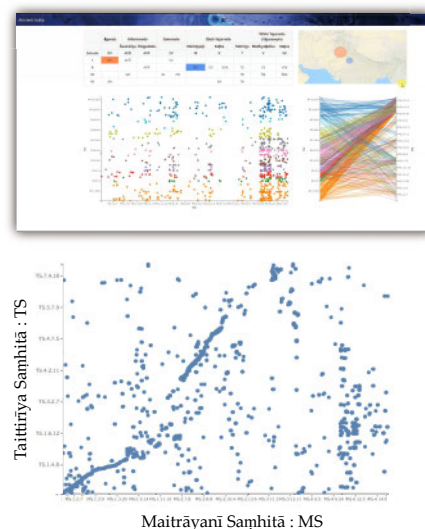
## A tool for visualizing the co-occurrence of Mantras



## A tool for visualizing the co-occurrence of Mantras

### Challenges

1. How do we handle ritual information?
2. Analyzing features across multiple references, not just one-to-one literature relationships
3. Further development requirements





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## A tool for visualizing the co-occurrence of Mantras

**User goal:** To examine the characteristics and similarities of mantra co-occurrence in different literature. To understand the co-occurrence of mantras by considering the ritual information.

**Analysis tasks:**

1. to identify the patterns of co-occurrence of mantras in the literature
2. to present the correspondence with the schools and geographical information in the literature
3. link mantra co-occurrences with ritual and chapter information for interpretation.

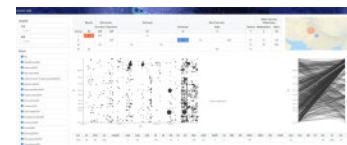
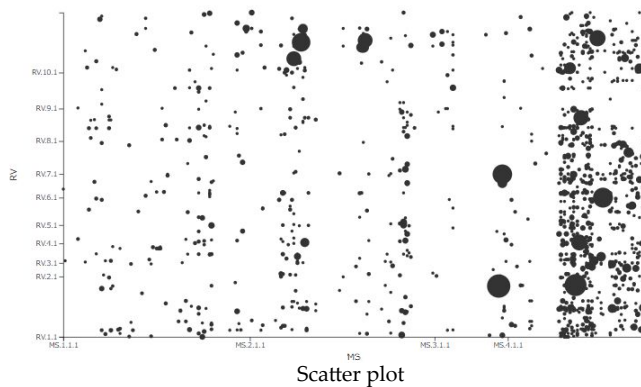
30 types of ritual event such as Agnicayana(AG).

13



## Analysis tasks

1. to identify the patterns of co-occurrence of mantras in the literature

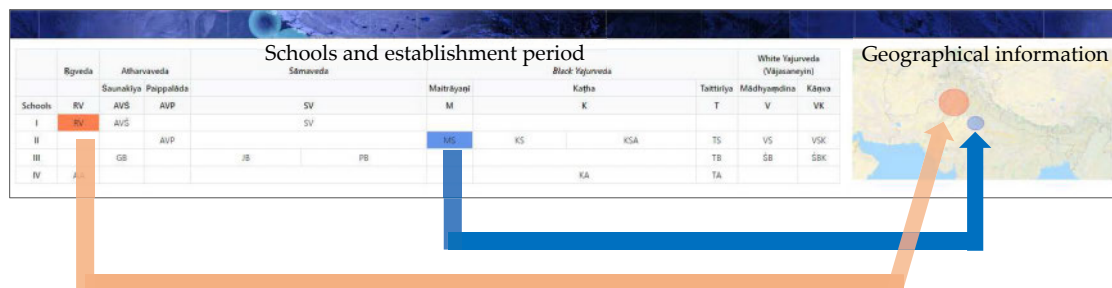
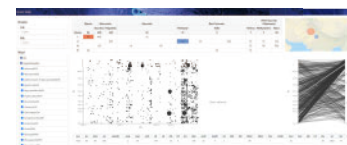


14



## Analysis tasks

2. to present the correspondence with the schools and geographical information in the literature

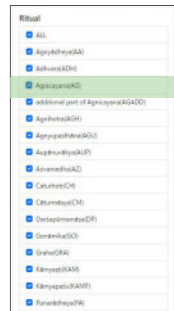


15

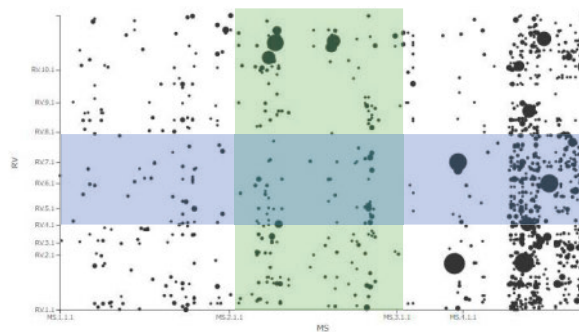


## Analysis tasks

3. link mantra co-occurrences with ritual and chapter information for interpretation.



Ritual filtering



Chapter filtering

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## A tool for visualizing the co-occurrence of Mantras

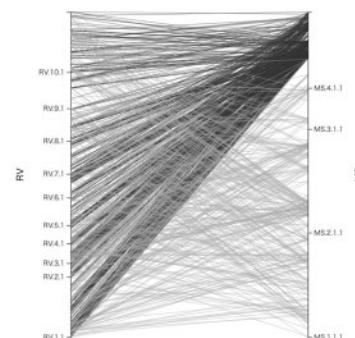
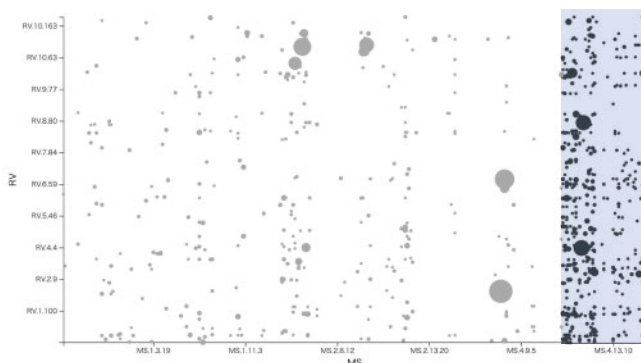


17



## A tool for visualizing the co-occurrence of Mantras

YA: Yājñānuvākya "Verses to invite and worship gods"



In MS, mantras related to YA are in chapter 4, but they are distributed over a whole chapter in RV.

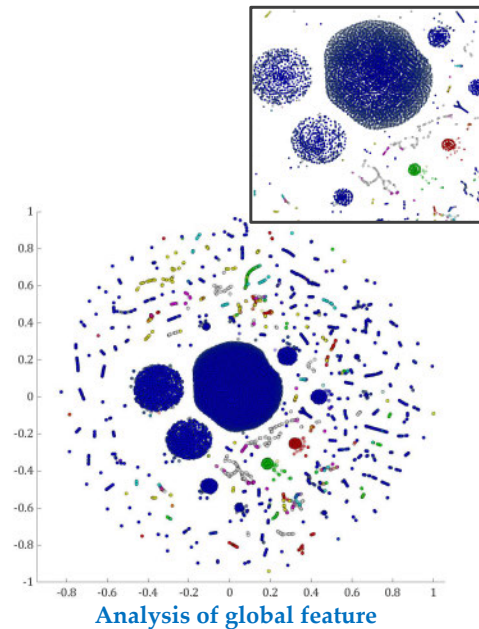
18



## A tool for visualizing the co-occurrence of Mantras

### Challenges

1. How do we handle ritual information?
2. Analyzing features across multiple references, not just one-to-one literature relationships
3. Further development requirements



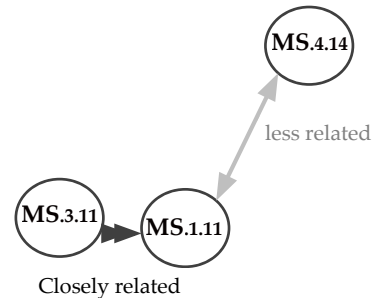
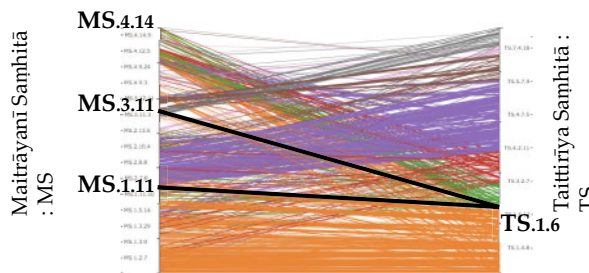
19



## Mapping chapter information based on co-occurrence similarity

Ancient Indian ritual texts BC1200-500

•avāryāṇi pakṣmāṇi pāryā ikṣavaḥ TS.1.6.1.1 MS.1.1.2 KS.1.10 BŚ.3.16



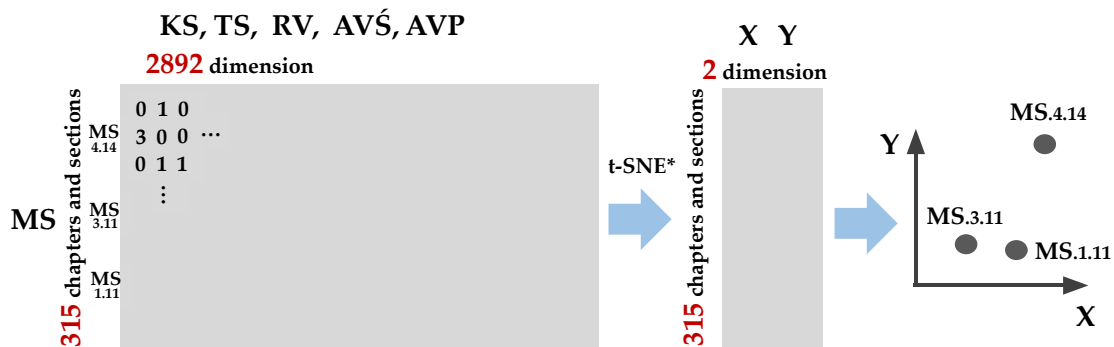
20



## Mapping chapter information based on co-occurrence similarity

Ancient Indian ritual texts BC1200-500

•avāryāṇi pakṣmāṇi pāryā ikṣavaḥ TS.1.6.1.1 MS.1.1.2 KS.1.10 BŚ.3.16



\*Laurens van der Maaten and Geoffrey Hinton (2008)



21



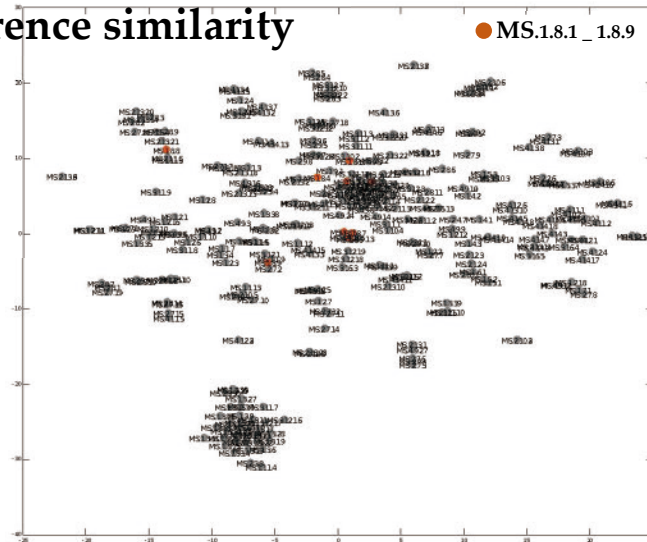
## Mapping chapter information based on co-occurrence similarity

Maitrāyaṇī Saṃhitā : MS

2892 dimensions

315 chapters and sections

Some clusters can be found  
based on co-occurrence  
similarity.



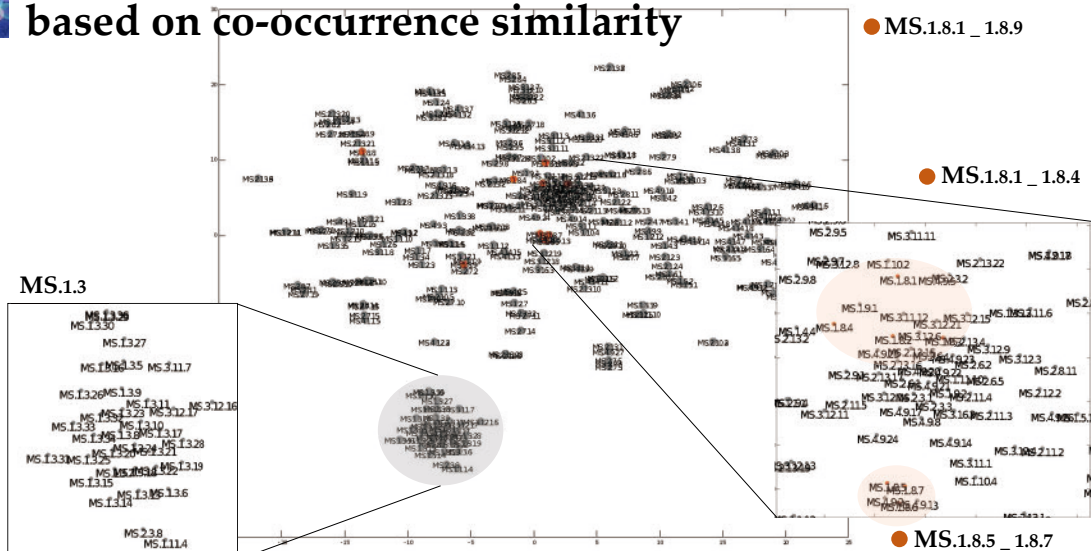
22



## Mapping chapter information based on co-occurrence similarity

MS.13

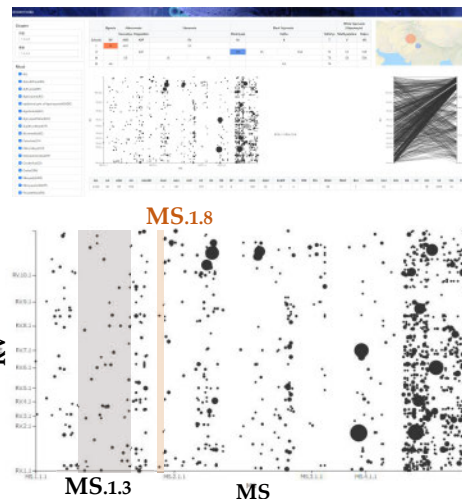
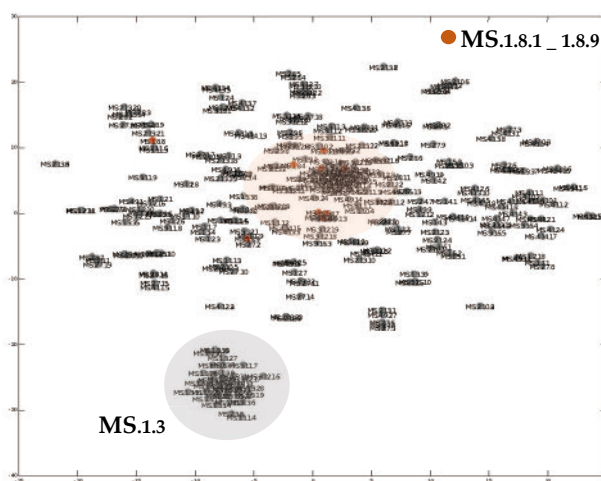
MS.1330  
MS.1337  
MS.1335  
MS.1317  
MS.1326  
MS.1339  
MS.1311  
MS.1322  
MS.1316  
MS.1333  
MS.1310  
MS.1318  
MS.1317  
MS.1333  
MS.1315  
MS.1316  
MS.1314  
MS.1314  
MS.1314



23



## Mapping chapter information based on co-occurrence similarity



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## Visualization meets AI

### Visualization meets Ancient India:

Visualization enabling effective data analysis leading to scientific discovery in Indology

It's **tough task** for users to look at co-occurrence pattern for all combination of literature!

### Visualization meets Artificial Intelligence:

Combining visualization and AI to support exploration. For example, given a context, it can automatically detect it with pattern recognition.

25

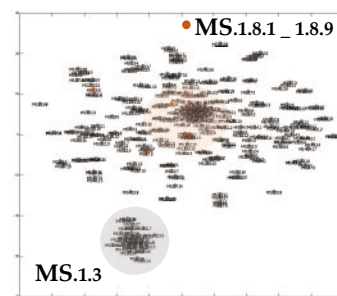
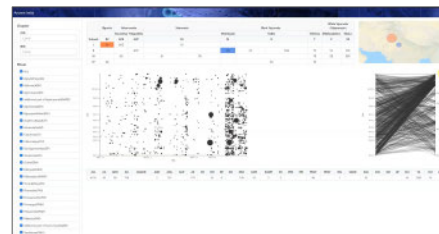


## Summary

- Visualization & How to find a dinosaur
- Visualization Tool for Ancient Indian Literature
- Mapping the Co-occurrence info globally
- Mapping the structure of vedic texts

### Future direction

- Improve the design of the tool and publish officially as a web tool



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Thank you for your attention



# One Step Further: Assessing Semantic Similarity in Sanskrit Using Word Embeddings with a Weighting Factor

検証の次なる段階へ：重み付けを伴う単語分散表現によるサンスクリット文献の類似度推定

Yuki Kyogoku (Leipzig University, Indology)

京極祐希 (Leipzig University, Indology)

1

## One Step Further: Assessing Semantic Similarity in Sanskrit Using Word Embeddings with a Weighting Factor

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Yuki Kyogoku  
Doctoral Candidate, Institute of Indology



UNIVERSITÄT  
LEIPZIG

2

## Outline

- 1) Research Objective
- 2) Digital Corpus
- 3) Method
- 4) Evaluation
- 5) Results
- 6) Summary

## 1. Research Objective

- Quantitatively evaluate four models proposed for the task of comparing the similarity of chapters in *Maitrāyaṇīsaṃhitā* (MS), *Taittirīyasaṃhitā* (TS) and *Kāṭhakaśaṃhitā* (KS).  
→ The performance of the models is compared with a human evaluation, which is chiefly based on parallel passages.
- Examine effects of weighting factor and vector type on result.

## 2. Digital Corpus

GitHub: → [OliverHellwig/sanskrit/dcs/data/conllu/files](https://github.com/OliverHellwig/sanskrit/dcs/data/conllu/files)

	Training	MS	TS	KS
Number of Chapters	12253	261	81	9
Avg. Sentences/Chapter	52.54	34.46	31.83	56.67
Avg. Tokens/Chapter	290.95	173.17	179.98	221.78

## 3. Method

word embedding: one type of vector representation of a word

e.g.,

$v(\text{book}) = (0.01, 0.2, 0.04, \dots)$

### 3. Method

<Model components>

1. Word vector type  
→ Word2Vec or FastText
2. Method of creating chapter vector  
→ Averaging or normalized weighting of word vectors

### 3. Method

<1. Word vector type>

[Word2Vec]: Trained at word / token level

e.g., win. = 2

"I eat an **apple**, an **orange** and a banana."

[FastText]: Trained at character level

e.g., win. = 2, word\_ngrams = 1

"I eat an apple, an **orange** and a banana."

### 3. Method

<2. Method of creating chapter vector>

1) Average of word vectors

2) TF-IDF weighting: tf\*idf

$$\frac{1}{n} \sum_{i=1}^n v_i$$

- Used to measure the importance of words
- One of the simplest and most common keyword extraction methods
- Agarwal et al. (2019) "Authorship Clustering using TF-IDF weighted Word-Embeddings"

### 3. Method

<TF: Term Frequency>

$$tf(t, d) = \frac{freq(t, d)}{\sum_{t_i \in d} freq(t_i, d)}$$

\*  $freq(t, d)$  counts the occurrence of token  $t$  in document  $d$

### 3. Method

<IDF: Inverse Document Frequency>

$$idf(t, D, N) = \log \frac{N}{\sum_{t \in d_i, d_i \in D} freq(d_i)}$$

\*  $D$  denotes a set of documents in a corpus

\*\*  $N$  denotes the total number of documents

### 3. Method

<Formula for Chapter Vector with TF-IDF Weighting>

$$\sum_{i=1}^n tf-idf_i \cdot v(w_i)$$

\*  $v_i$  denotes the  $i^{\text{th}}$  word vector

\*\*  $tf-idf_i$  denotes a normalized tf-idf value of the  $i^{\text{th}}$  word

\*\*\* If the word is a stopword, its tf-idf value becomes 0



### 3. Method

<Summary of four Models>

- 1) Word2Vec x Average
- 2) Word2Vec x tf-idf
- 3) FastText x Average
- 4) FastText x tf-idf

\* Word2Vec is fed with lemmas, while FastText is fed with forms (tokens).

\*\* tf-idf is based on lemmas.

### 4. Evaluation

<Definition of Similarity>

There are several aspects for measuring the similarity of chapters, e.g., vocabulary, topics, grammatical features (the usage of imperative, optative, etc.), writing style.

### 4. Evaluation

<Definition of Similarity>

There are several aspects for measuring the similarity of chapters, e.g., **vocabulary, topics**, grammatical features (the usage of imperative, optative, etc.), writing style.

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## 4. Evaluation

- MS chapters are compared to TS and KS chapters.
- Based on vocabulary and topics as a similarity measure, especially on the fact that the chapters share parallel passages, a human evaluator (Prof. Amano) assigns the most similar TS or KS chapter(s) to each MS chapter.
- The top-3 most similar TS or KS chapters for each MS chapter are extracted by the four models.
- Question: Are the most similar chapter(s) extracted by the human evaluator contained in the top three chapters extracted by a given model?

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## 4. Evaluation

<Recall>

- Chapters correctly extracted by model = True Positive
- Chapters evaluated as similar by human evaluator but not extracted by model = False Negative

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## 4. Evaluation

<Recall>

$$\text{Recall} = \frac{\text{True Positives}}{\text{True Positives} + \text{False Negatives}}$$

$$= \frac{\text{\#Chapters properly extracted by the model}}{\text{\#Chapters evaluated as similar chapters by the human evaluator}}$$

## 5. Results

Model	Recall
Word2Vec x Average	0.661765
Word2Vec x tf-idf	0.617647
FastText x Average	0.602941
FastText x tf-idf	0.558824

\* n = 68 (#Chapters extracted by the human evaluator)

\*\*w2v\_aver > w2v\_tfidf > fast\_aver > fast\_tfidf

## 5. Results

<Latent potential of tf-idf weighting>

- For the specific pair MS 1.8 and KS 6, models with tf-idf weighting extracted more similar chapters than the models with averaging
- Tf-idf may be capable of capturing the characteristic vocabulary in chapters

## 6. Summary

- In terms of vocabulary and topics as a measure of similarity, the simplest model, i.e., Word2Vec x Average, brings the best result
- In some specific cases, tf-idf weighting may be capable of capturing some characteristic vocabulary (?)
- The poor performance of FastText can probably be improved by optimizing its parameters (?)

Thank you for listening!  
Questions or Suggestions?



# Computational Stylometric Analysis on Intertextuality in Historical Written Languages: A Case Study of Coptic

文献言語における間テキスト性の計算言語学的・計量文献学的分析：コプト語における事例研究

**So Miyagawa** (Kyoto University, Graduate School of Letters /  
Center for Cultural Heritage Studies and Inter Humanities)

宮川 創 (京都大学 文学研究科 / 文学研究科附属文化遺産学・人文知連携センター)

1



GEORG-AUGUST-UNIVERSITÄT  
GÖTTINGEN



## Computational Stylometric Analysis on Intertextuality in Historical Written Languages:

### A Case Study of Coptic

**So Miyagawa\***

\*Currently an assistant professor at Kyoto University,  
but the work was done at Georg-August-Universität Göttingen

## Research questions

1. Do the textual findings indicate quotations from memory rather than from books or excerpts?
2. How accurate is the quotation?
3. What signals were employed to mark quotations?
4. Is a marked quotation more literal than an unmarked quotation?
5. What are the opportunities and limitations of digital tools?

2

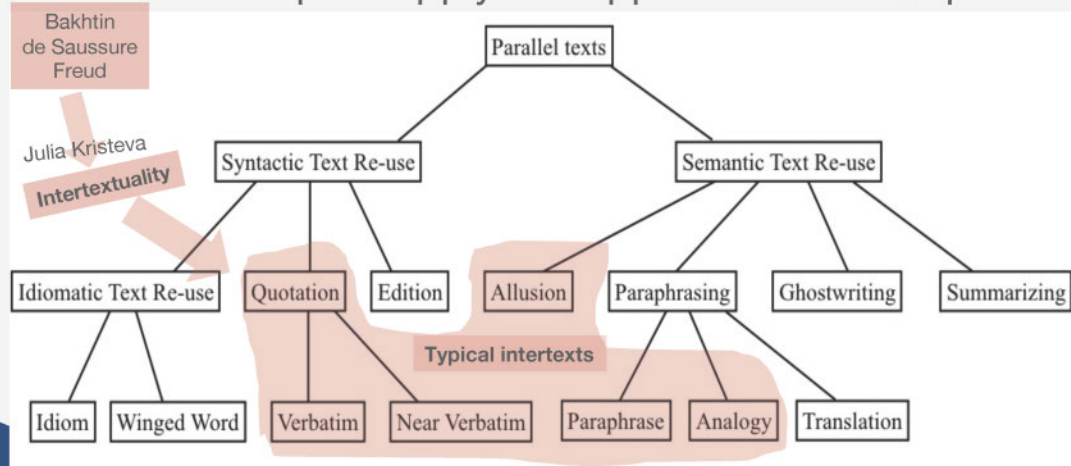
## Introduction

- This study is based on
  - SFB1136 “Education and Religion in Cultures of the Mediterranean and Its Environment from Ancient to Medieval Times and to the Classical Islam”
  - Sub-project “B 05 Scriptural Exegesis and Educational Traditions in Coptic-Speaking Egyptian Christianity in Late Antiquity: Shenoute, Canon 6”
- Chapter 1: Introduction to the life and works of Shenoute and Besa
- Chapter 2: State of research for intertextuality studies with a focus on Biblical and Early Christian and Coptic Studies

3

# Application of text reuse detection technology to intertextuality

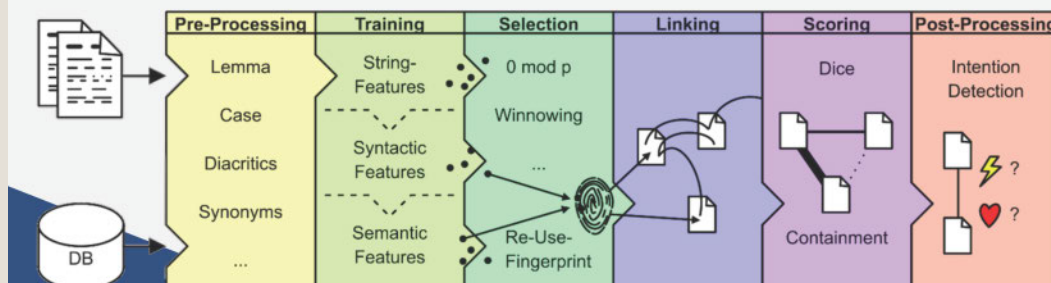
First attempt to apply this approach to the Coptic



Taxonomy of text reuses: Büchler (2013), Franzini et al. (2016), Miyagawa et al. (forthcoming)

4

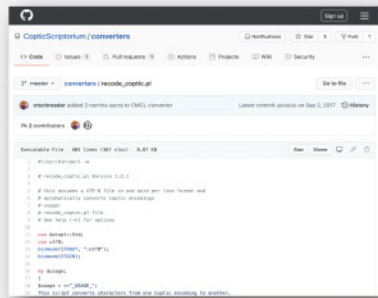
- Text reuse detection tool coded in Java
- Product of eTRAP research group (2015-2019, Göttingen)
- Automatic detection of text reuses for any corpora using ca. 700 algorithms



5

# Tools for pre-processing 1

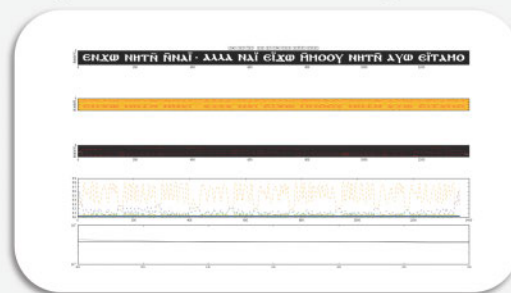
## Unicode converter



Zeldes, Schroeder and Miyagawa  
(2013-2016)

Old transcription into  
Unicode

## Optical Character Recognition



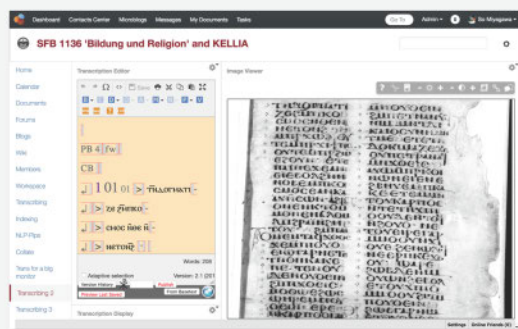
Lincke et al. (2019) and Miyagawa et  
al. (2019)

Automatic transcription

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# Tools for pre-processing 2

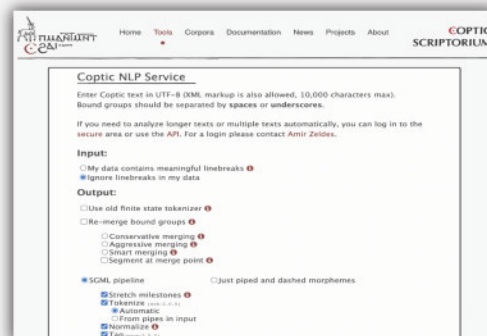
## Virtual Manuscript Room



See Behlmer & Feder (2017)

Digital transcription

## Coptic NLP Service



See Zeldes & Schroeder (2016)

Linguistic tagging

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## Corpus 1: Shenoute, *Canon 6*

- (at least) 6 codices
  - MONB.XF, XM, XV and YJ | YK and XL (varia)
- (at least) 5 works
  - *He Who Sits Upon His Throne* | *Remember, O Brethren* | *Is It Not Written* | *Then Am I Not Obligated* | *People Have Not Understood*
- Text reuses found by previous studies
  - Amélineau, Wiesmann, Young, Layton....

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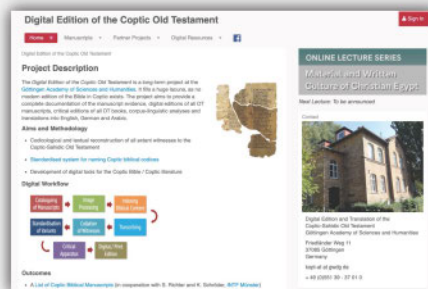
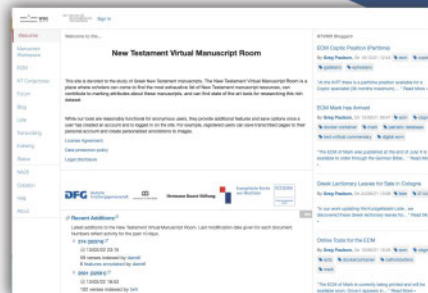
## Corpus 2: Besa's *Letters and Sermons*

- Besa, Shenoute's successor
- Two codices with several fragments
  - MONB.BA, MONB.BB ...
- Quotations and allusions were already studied thoroughly by Karl Heinz Kuhn
  - Very precise descriptions of intertextuality
  - Touchstone for TRACER

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# Comparison corpus

- Sahidic Bible 2.0
- Digital “base text” of Sahidic NT & OT
  - Product of INTF Münster and CoptOT Göttingen



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## First attempt (2016)

Source Text	Target Text	TR Cand.
Sahidic Bible	Besa	13,835
Sahidic Bible	Canon 6	8414



Too many text reuse candidates!



I chose the Sahidic Psalms

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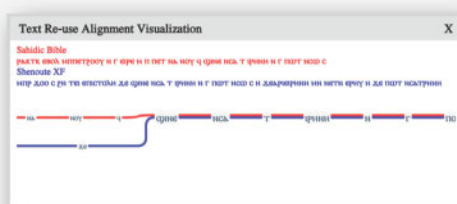
## Chosen comparison corpus: Sahidic Psalms

- Desert Fathers and Mothers
  - Both in solitude and with others
- Rituals and liturgies at coenobitic monasteries
- Pachomian Rules
- Previous research
  - Kuhn, Amélineau, Wiesmann
  - Psalms is the second most quotation and allusion source in Besa, the first in Shenoute, Canon 6



British Library, Or. 5000 "London Psalter"

## Second attempt (2018)



Besa	TR Cand.
Letters and Sermons	629

Shenoute, Canon 6	TR Cand.
He Who Sits Upon His Throne	84
Remember, O Brethren	31
I Am Not Obligated	207
Is It Not Written	98
People Have Not Understood	3
Total	423

Most of them are idiomatic text reuses such as "Fear God/Lord"...

## Strategies for analysis

- Levenshtein distance (edit distance)
  - Used as a de facto standard in computer science to measure difference between two texts
  - For objective observation of modifications
  - Quantification of modifications
  - LD = 0 means a verbatim quotation
- Analyzing changes from the source if LD > 0
  - Deletion, insertion, word order change....
  - Synonymic alternation, co-hyponymic alternation...

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## Summary of newly found quotations

Besa	B1			B2		B3			B4		B5		
Levenshtein distance	15			2		0			3		13		
Quotative index phrase	None			None		None			None		None		
Shared morphs	14			11		18			11		11		
Previous studies	Kuhn												
Canon 6	S1	S2	S3	S4	S5	S6	S7	S8	S9	S10	S11	S12	S13
Levenshtein distance	1	8	3	23	0	4	13	0	20	0	11	7	15
Quotative index phrase	None	None	None	None	None	None	None	Post-posed	Post-posed	None	None	None	Pre-posed
Shared morphs	14	11	18	11	11	8	16	7	11	10	7	7	15
Previous studies	Amélineau				Unpublished	Amélineau Zoega							Amélineau

Already found by Behlmer 2017



## Do the textual findings indicate quotations from memory rather than from books or excerpts?

- Probably, most of the time, from memory, but sometimes with aids (provisional hypothesis)
  - Because of the number of altered and recontextualized quotations
  - This needs more comprehensive studies
- Shenoute and Besa built on the audience's collective memory of the Bible by blending Biblical phrases and concepts with their own monastic ideals

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## How accurate is the quotation?

- **Verbatim** [LD=0]: B3, S5, S8, S10
- **Non-verbatim** [LD > 0]: B1, B2, B4, B5, S1, S2, S3, S4, S6, S7, S9, S11, S12, S13
  - **Morph alternation**: B1, B2, B4 (x2), B5 (x4), S1, S2 (x2), S3 (x2), S4 (x2), S6 (x1), S7 (x3), S11 (x1), S12 (x2), S13 (x2)
  - **Morph deletion**: B1 (x3), S2, B2, S4 (x2), S11
  - **Morph insertion**: S4 (x3), S6 (x2), S13 (x5)
  - **Word order change**: S9

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## Research Question 3

## What signals were employed to mark quotations?

- Grammatical signals: τὰ-/ἡτὰ-, Second Tense, ἀγῶ + First Future, τὰρεϥ-... (Shisha-Halevy's studies)
- Phrasal signals: Quotative Index Phrases
  - Preposed QIP (ἡθε εἰτχηρ ἄε-): S13
  - Postposed QIP (ἡθε εἰτχηρ): S8, S9
  - Consecutive: ἀγῶ οἷν ἄε-, ἀγῶ ἄε-, καὶ γὰρ, ... (Behlmer, unpublished)
- Wider study of pre-/post-posed QIP
  - Miyagawa and Behlmer (forthcoming)
  - 21% in Canon 6 and 80% in Besa are pre-posed

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## Research Question 4

## Is a marked quotation more literal than an unmarked quotation?

- Insufficient number of samples
- Three quotations had QIPs
  - Two of them are verbatim
- The version of the Psalms which the abbots used can be different from Sahidic Bible 2.0
- More comprehensive study is needed

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## Research Question 5:

## What are the opportunities and limitations of digital tools?

- Digital tools (i.e., TRACER and pre-processing tools) aid researchers
  - 5 newly found quotations in Besa (TRACER also missed several quotations Kuhn found)
- Current problem: long preparation time
  - If more digital corpora and tools are provided, the time will be more shortened
  - This study provides the Canon 6 and Besa corpora to Coptic SCRIPTORIUM, etc. in the future

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## Thank you!

### So Miyagawa

- Contact: miyagawa.so.36u@kyoto-u.jp
- Website: <http://somiyaagawa.com/>



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# Dependency parsing of Vedic Sanskrit — Algorithms and linguistic conclusions

**Oliver Hellwig** (Dusseldorf University, Institute for Language and Information)

**Sebastian Nehrdich** (Dusseldorf University, Institute for Language and Information)

**Sven Sellmer** (Dusseldorf University, Institute for Language and Information)

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## Dependency Parsing of Vedic Sanskrit - Algorithms and Linguistic Conclusions

Oliver Hellwig, Sebastian  
Nehrdich, Sven Sellmer -  
University of Düsseldorf

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### Structure

- Annotation
- Designing a dependency parser for Vedic
- First linguistic and philological results



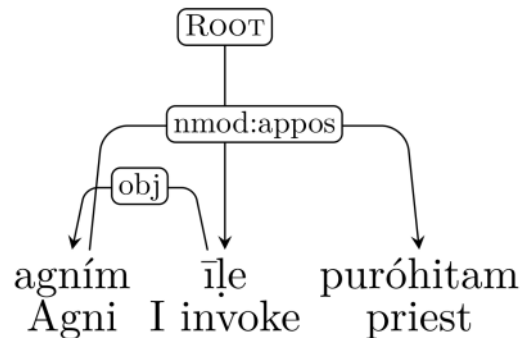
## Syntactic dependencies

Aim: Labelling a sentence with syntactic roles and arcs connecting the constituents

Universal Dependencies (UD) standard

Our guidelines:

<https://doi.org/10.5167/uzh-212699>



## Annotation

Performed directly in the DCS interface

Dependency annotations

## Annotation

Labeler based on neural networks

See: Hellwig, O., Scarlata, S., Ackermann, E. and Widmer, P. (2020): The Treebank of Vedic Sanskrit. In: Proceedings of the LREC

## Annotation

Group	Words (dep.)	Sens. (dep.)
Samhitā	44666 [35]	6512 [39]
Brāhmaṇa	35489 [28]	4707 [28]
Āraṇyaka	3455 [3]	582 [4]
Upaniṣad	13415 [11]	1747 [11]
Śrautasūtra	12445 [10]	1107 [7]
Gṛhyasūtra	16854 [13]	1837 [11]
Dharmasūtra	205 [0]	33 [0]
	126529	16525

Current dump of the syntactic data:

<https://github.com/OliverHellwig/sanskrit/tree/master/papers/2020lrec/treebank>

## Background of Dependency Parsing

- Dependency parsing is the process of analyzing the grammatical structure of a sentence by determining the relationship between “head” words and the words that modify those heads
- Two parsing methods are widely used: transition-based and graph-based
- graph-based parsers show better performance for morphologically rich IE languages and for those of the SOV-type; Vedic has both characteristics

## Parser design

- We adapt the biaffine parser of Dozat and Manning, 2017 since it achieved state of the art UAS on all CoNLL 09 languages and because it has better performance on non-projective languages
- We add a character-based CNN on the inflected form and integrate a larger number of categorical input features: Morpho-syntax, Verbal nouns, inflected word forms, punctuation and text-historical layers
- We augment the training data by randomly concatenating up to four, not necessarily subsequent sentences from the training set
- We evaluate the effect of deep contextual embedding models such as ELMo and BERT on the biaffine parser
- Other parsers for Sanskrit such as Kulkarni 2021 or Krishna et al. 2020/2021 exist, but their application to Vedic is not promising since they either rely on the Pāṇinian system of grammar (Kulkarni) or are trained on a rather small corpus of “Neo-Sanskrit” (Krishna et al. 2020/2021) and thus don’t perform satisfyingly on cross-domain tasks

## Parser Performance

•Among other available treebanks of premodern languages, the situation of Vedic is probably best compared with that of Latin and Ancient Greek

Corpus	UAS	LAS
Latin PROIEL (Straka 2019)	83.34	78.66
Ancient Greek PROIEL (Straka 2019)	85.93	82.11
Vedic treebank biaffine	87.63	81.68
Vedic treebank DCST	87.61	81.84

## Lexical Embedding strategies

•Evaluation of static (fastText) vs. contextual (RoBERTa-Vedic-GRETIL) embedding strategies with a fixed corpus size of 5000 sentences

Features	Model	UAS	LAS
None	RoBERTa-Vedic-GRETIL	<b>73.4</b>	<b>63.5</b>
	fastText	70	60.3
+POS	RoBERTa-Vedic-GRETIL	<b>75.2</b>	<b>66</b>
	fastText	74.4	65.8
All features	RoBERTa-Vedic-GRETIL	78.5	70.6
	fastText	<b>79.5</b>	<b>72</b>

## Parsing::Conclusions

- The performance of the biaffine parser on the Vedic treebank is superior for UAS and on pair for LAS with the current state of the art for Ancient Greek PROIEL and Latin PROIEL
- The larger number of categorical input features and the augmentation of the training data lead to decisive performance gains
- The additional pretraining performed by DCST does not lead to clear improvements
- Contextual embedding strategies, while being expensive to train, show a visible performance gain when no or little linguistic information is available; as soon as enough annotation data is available, static embedding strategies in combination with the full ensemble of linguistic information are superior

## Parser::Annotation Pipeline

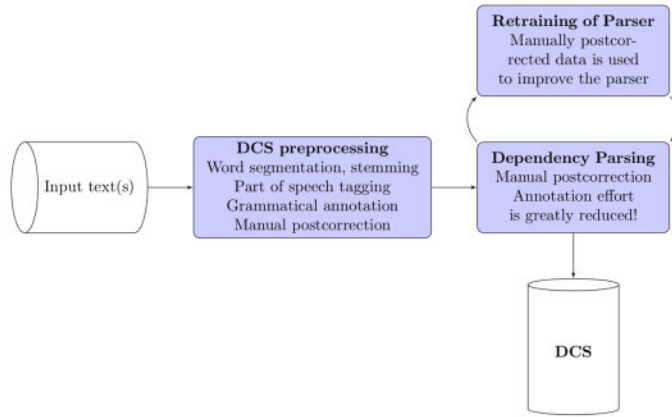


Figure 1: Diagram of the annotation pipeline for Vedic texts within the Digital Corpus of Sanskrit. With the help of the dependency parser, the necessary time and effort for parsing sentences is greatly reduced.

## Evaluation

Vedic syntax not too popular as a research topic:

- Delbrück and a lot of details studies on the Rigveda
- Strong focus on pragmatics
- Few studies on long-range developments
- Few studies quantify their findings with corpus data.
- See: Hock: Issues in Sanskrit syntax, 2-4

What can the treebank data tell us?

## Evaluation

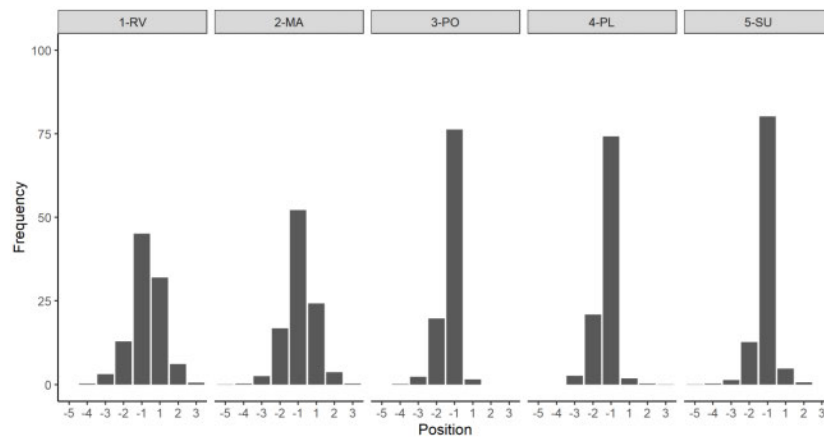
Q: Are there any relevant diachronic trends in the placement of direct objects?

Data: ~ 5,300 main clauses

Register					
metrical	prose				
2122	3132				
Diachronic layers					
1-RV	2-MA	3-PO	4-PL	5-SU	
388	1680	874	1127	1185	
Animacy classes					
Pers. pron.	Pronoun	Person	Animate	Non-animate	Unassigned
375	689	514	173	2945	558

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## Evaluation



negative = to the left of the verb

positive = to the right of the verb

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## Evaluation

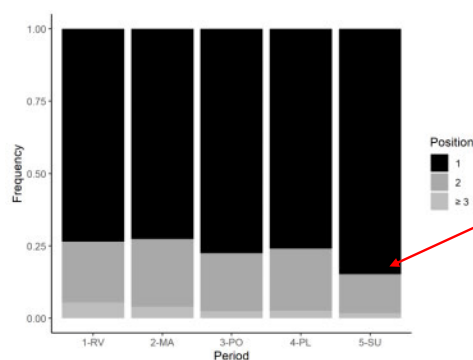
Animacy and register interact with object placement.

Cochran-Mantel-Haenszel tests show that there is a diachronic development even when using animacy/register as control variables.

Which factors are responsible?

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## Evaluation



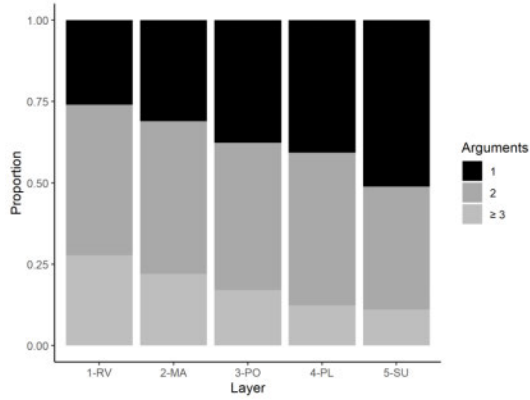
Objects seem to move to the directly preverbal position over the Vedic period.

Is this a diachronic trend? Well, ...

Objects in preverbal placement



## Evaluation



> The number of verbal arguments (nsubj, obj, obl, iobj) decreases significantly during the Vedic period.

## Summary

- Syntactic data open new perspectives on the Vedic literature.
- Annotation interface and parsers are available. Collaborations are most welcome!
- Current focus: Detecting chronological syntactic trends and markers in an unsupervised manner.

# Ancient India meets

## Ancient India meets Data-Science

The 2nd and concluding Workshop of SPIRITS project  
"Chronological and Geographical Features of Ancient Indian Literature  
Explored by Data-Driven Science",



2022

02/11

FRI

JP National Day

16:00-19:00 JST  
(8:00-11:00 CET)

it's also

A Kick-off for Joint International Research

**"A Study of Language Layers in Vedic Literature  
for the Development of a Program for Age-Estimation"**

16:00-16:30 JST (= 8:00-8:30 CET)

**The Result of the Two-Year SPIRITS Project and Our Vision for the Next Research**

Kyoko Amano (Kyoto University, Hakubi Center / Institute for Research in Humanities)

16:30-17:00 JST (= 8:30-9:00 CET)

**Visualization meets Ancient India: Mapping the Structure of Vedic Texts**

Hiroaki Natsukawa (Kyoto University, Academic Center for Computing and Media Studies)

17:00-17:30 JST (= 9:00-9:30 CET)

**"One Step Further: Assessing Semantic Similarity in Sanskrit Using Word Embeddings with a Weighting Factor"**

Yuki Kyogoku (Leipzig University, Indology)

17:30-17:45 JST (= 9:30-9:45 CET)

Break

17:45-18:15 JST (= 9:45-10:15 CET)

**"Computational Stylometric Analysis on Intertextuality in Historical Written Languages: A Case Study of Coptic"**

So Miyagawa (Kyoto University, Graduate School of Letters / Center for Cultural Heritage Studies and Inter Humanities)

18:15-18:45 JST (= 10:15-10:45 CET)

**Dependency parsing of Vedic Sanskrit - Algorithms and linguistic conclusions**

Oliver Hellwig, Sebastian Nehrlich, Sven Sellmer (Dusseldorf University, Institute for Language and Information)

Please register using the Google Form on the official website of the project.  
The Zoom Meeting ID and password will be sent to you by e-mail.

**URL: <https://ancientindia-datascience.hakubi.kyoto-u.ac.jp>**

Registration is available until the end of the workshop.  
No registrant limit. No registration fee.

18:45-19:00 JST (= 10:45-11:00 CET)

Discussion and Concluding remark: Oliver Hellwig

Organizer: SPIRITS Project "Chronological and Geographical Features of Ancient Indian Literature Explored by Data-Driven Science" (Kyoko Amano, Hiroaki Natsukawa, Oliver Hellwig, Yuki Kyogoku); Fostering Joint International Research (B) of KAKENHI "A Study of Language Layers in Vedic Literature for the Development of a Program for Age-Estimation" (Representative researcher: Kyoko Amano)

Co-Organizer: Kyoto University, Academic Center for Computing and Media Studies; Kyoko Amano Hakubi Project "Language and Social-Cultural Background of the Ancient Indian Ritual Literature" ; Grant-in-Aid for Challenging Research (Exploratory) "Constructing a Database for Quantitative Analysis of Style Toward Elucidation of the Formation Process of Ancient Indian Texts" (Representative researcher: Kyoko Amano, 20K20697)

**SPIRITS**  
SUPPORTING PROGRAM FOR INTERACTION-BASED  
INITIATIVE TEAM STUDIES



# Ancient India meets

## Ancient India meets Data-Science

### 古代インドとデータサイエンス

SPIRITS プロジェクト

「データ駆動型科学が解き明かす古代インド文献の時空間的特徴」

第2回（最終）ワークショップ



# 2022

# 02/11

金・祝

オンラインにて開催

16:00-19:00 JST

(8:00-11:00 CET)

国際共同研究

「ヴェーダ文献における言語層の考察と  
それを利用した文献年代推定プログラムの開発」  
のキックオフを兼ねて。

16:00-16:30 JST (= 8:00-8:30 CET)

**The Result of the Two-Year SPIRITS Project and Our Vision for the Next Research**

「2年間の SPIRITS プロジェクトの成果と今後の研究への展望」

天野恭子（京都大学 白眉センター / 人文科学研究所）

16:30-17:00 JST (= 8:30-9:00 CET)

**Visualization meets Ancient India: Mapping the Structure of Vedic Texts**

「可視化と古代インド研究：ヴェーダ文献の構造のマッピング」 夏川浩明（京都大学 学術情報メディアセンター）

17:00-17:30 JST (= 9:00-9:30 CET)

**"One Step Further: Assessing Semantic Similarity in Sanskrit Using Word Embeddings with a Weighting Factor"**

「検証の次なる段階へ：重み付けを伴う単語分散表現によるサンスクリット文献の類似度推定」

京極祐希（Leipzig University, Indology）

17:30-17:45 JST (= 9:30-9:45 CET)

Break 休憩

17:45-18:15 JST (= 9:45-10:15 CET)

**"Computational Stylistic Analysis on Intertextuality in Historical Written Languages: A Case Study of Coptic"**

「文献言語における間テキスト性の計算言語学的・計量文学的分析：コプト語における事例研究」

宮川創（京都大学 文学研究科 / 文学研究科附属文化遺産学・人文知連携センター）

18:15-18:45 JST (= 10:15-10:45 CET)

**Dependency parsing of Vedic Sanskrit - Algorithms and linguistic conclusions**

Oliver Hellwig, Sebastian Nehrlich, Sven Sellmer (Dusseldorf University, Institute for Language and Information)

18:45-19:00 JST (= 10:45-11:00 CET)

Discussion and Concluding remark

ディスカッションおよび総括：Oliver Hellwig

本プロジェクトウェブサイト上の Google フォームより参加登録をお願いいたします。登録いただいた皆様に、e-mail にて Zoom ミーティング ID およびパスワードをお知らせいたします。

**URL: <https://ancientindia-datascience.hakubi.kyoto-u.ac.jp>**

定員なし、参加費無料

ワークショップ終了までご登録いただけます。

主催：京都大学研究支援 SPIRITS 2021「データ駆動型科学が解き明かす古代インド文献の時空間的特徴」（天野恭子、夏川浩明、Oliver Hellwig、京極祐希）、国際共同研究強化 (B)2021-2026「ヴェーダ文献における言語層の考察とそれを利用した文献年代推定プログラムの開発」（研究代表者：天野恭子、課題番号：21KK0004）

共催：京都大学学術情報メディアセンター、天野恭子白眉プロジェクト「古代インド祭式文献の言語および社会的・文化的成立背景の研究」、科研費挑戦的研究（萌芽）2020-2022「古代インド文献成立過程解明に向けた文体計量分析のためのデータベース構築」（研究代表者：天野恭子、20K20697）

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