

Connecting the Dots: Digital Humanities and Historical Big Data Research for Japanese Culture



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<http://codh.rois.ac.jp/> @rois_codh

Self introduction

<https://researchmap.jp/kitamoto/>



@kitamotoasanobu

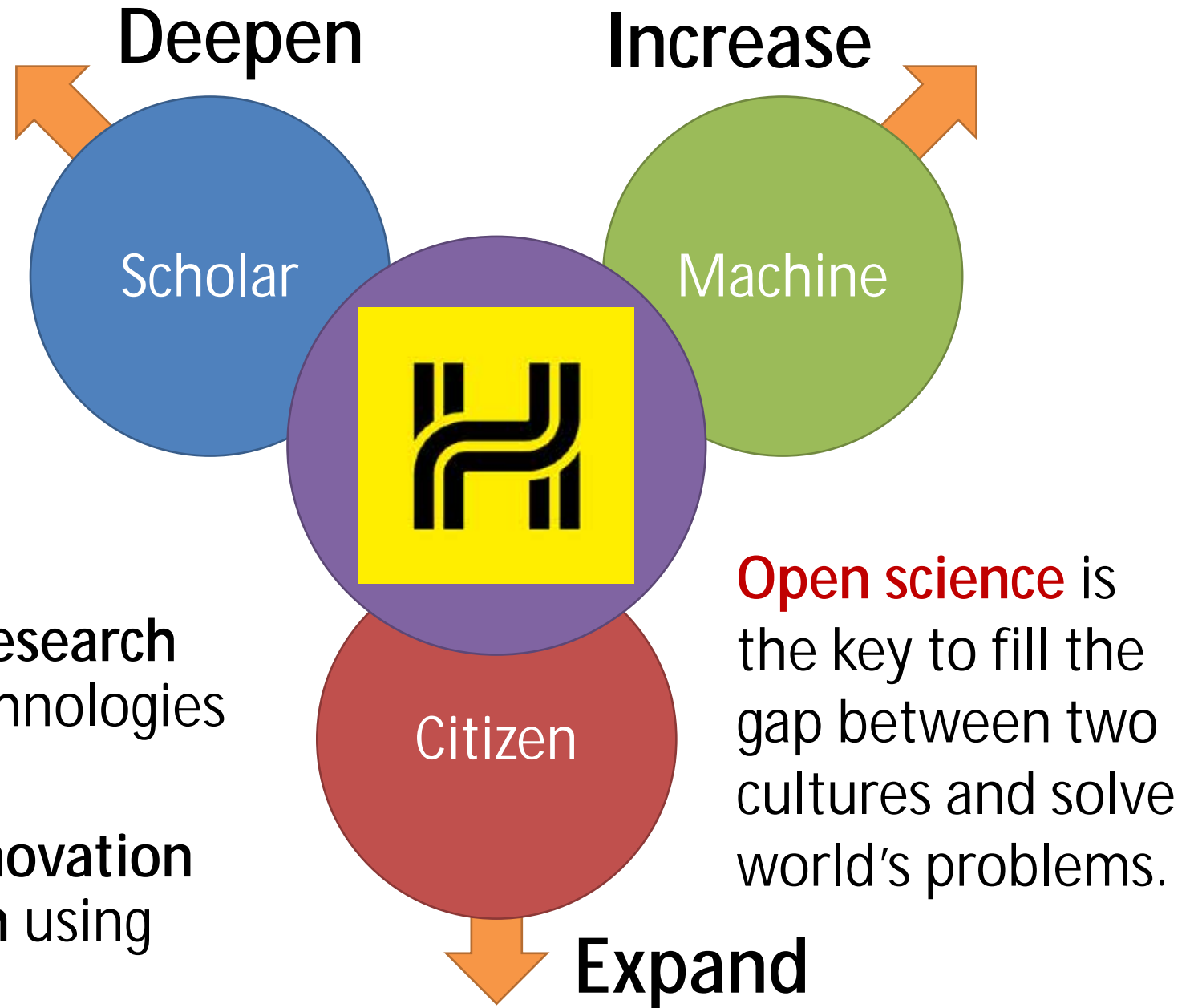
- Name: Asanobu KITAMOTO
- Professor, National Institute of Informatics
- Director, ROIS-DS Center for Open Data in the Humanities (since 2016)
- Expertise: informatics and computer science
- Research topics: digital humanities, data-driven science for earth science and disaster reduction, and open science.

ROIS-DS Center for Open Data in the Humanities (CODH)

<http://codh.rois.ac.jp/>

1. Data-driven Humanities:
Innovation in humanities research
using computer science technologies
and tools.

2. Humanities Big Data: Innovation
in non-humanities research using
humanities data.



Open science is
the key to fill the
gap between two
cultures and solve
world's problems.

NIJI-NW Project

http://www.nijl.ac.jp/pages/cijproject/index_e.html



300,000 Pre-modern Japanese Books (before 1868) are being digitized and released as open data from National Institute of Japanese Literature (NIJL).

Japanese culture
finally entered
into the big data
era...

What is Digital Humanities?

1. **Humanities**: the culture of human being, such as philosophy, literature, history, religion, linguistics and art.
2. **Traditional humanities research**: read paper materials in the physical library, use analogue tools, and work solo.
3. **Digital Humanities**: humanities research enabled or augmented by digital technology.
4. **(Transformative) Digital Humanities**: transform the style of research by taking advantage of digital technology.

Textual and Non-textual Digital Humanities

Images



Photographs



Maps



Characters



1. Interpretation of text (reading) has been a popular method.
2. Non-textual data, such as visual, spatial, and structured data, are increasing values with novel “reading” methods.

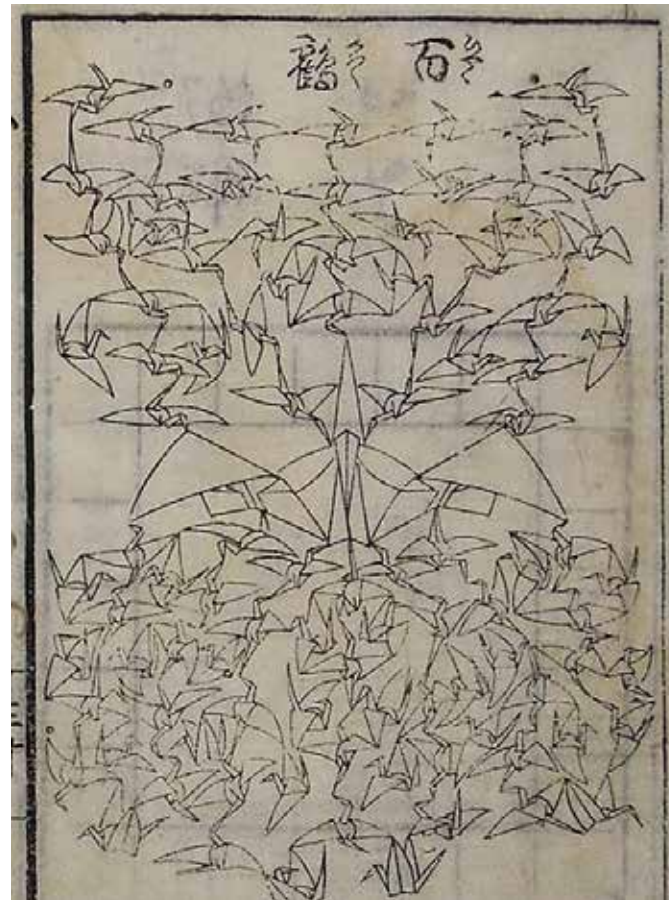
AI Kuzushiji Recognition

Collaborator: Tarin Clanuwat (Google Brain, formerly CODH)

Japanese Knowledge over 1000 Years



How to wear makeup

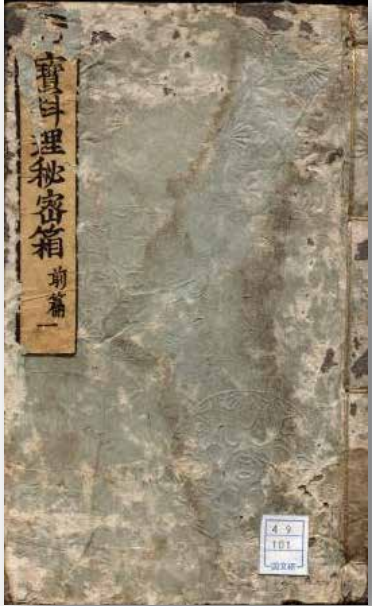


How to fold 100 cranes using one piece of paper



How to build automata

Massive Documents vs. Few Readers

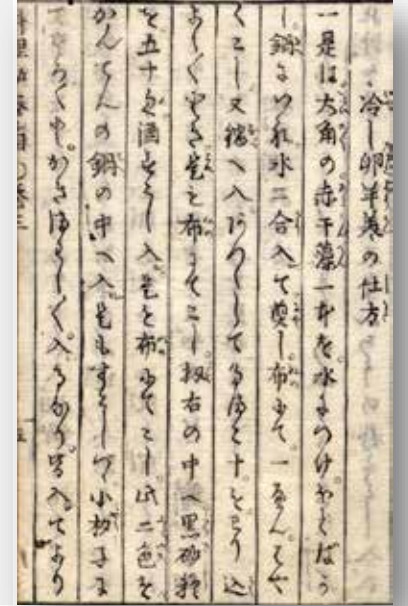


1 billion
documents

Estimated number of
old books and
documents in Japan

10000
readers

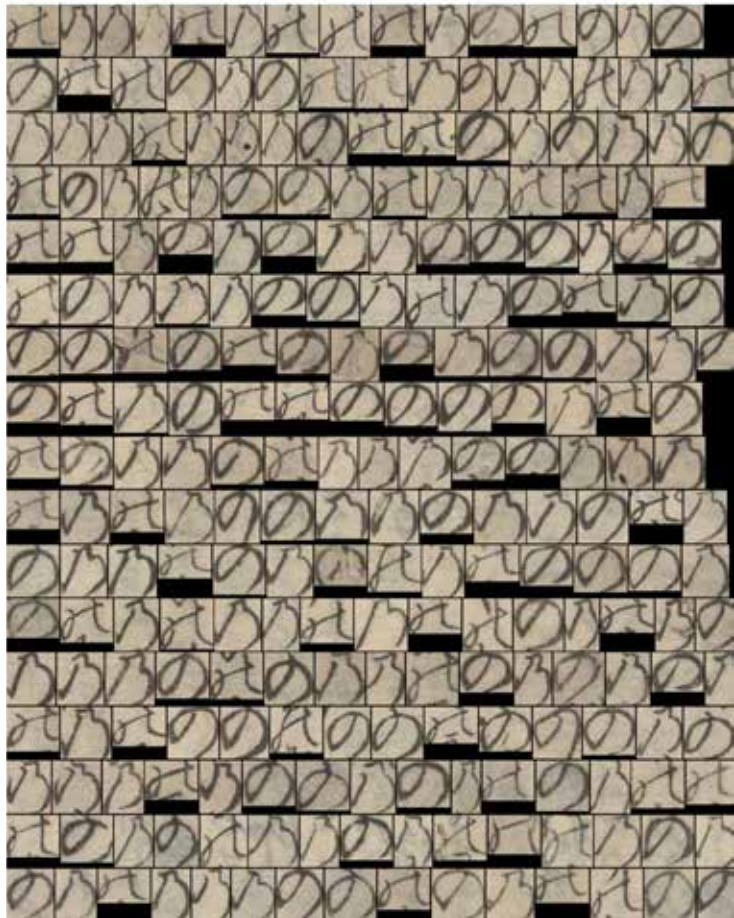
Estimated number of
people with fluency
in reading Kuzushiji



Kuzushiji Dataset

<http://codh.rois.ac.jp/char-shape/>

雨月物語 (1890)



1. National Institute of Japanese Literature created and CODH curated.
2. The open data consists of
 - Character types: 4,328
 - Character shapes: 1,086,326
3. Download the Zip file and use it as training data for machine learning.
4. The release of dataset stimulated research on AI kuzushiji recognition.

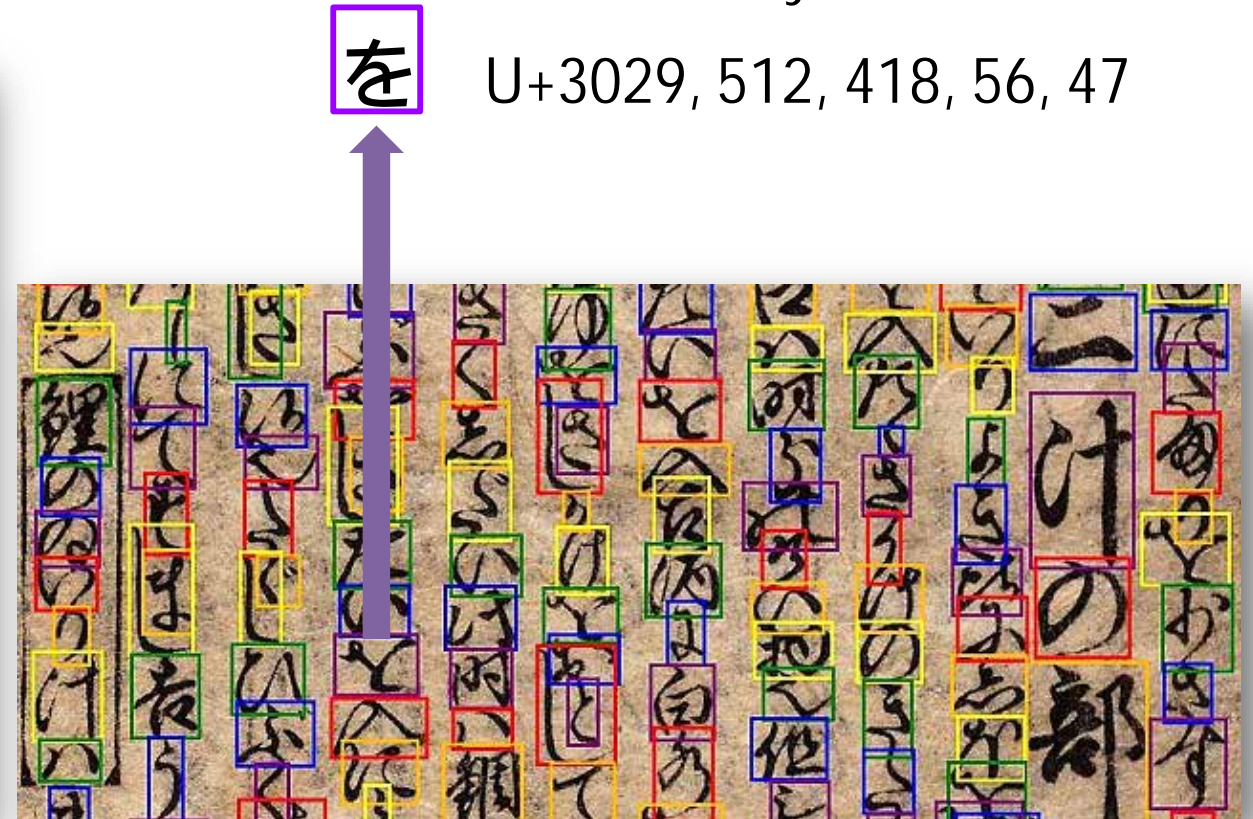
Format of the Kuzushiji Dataset

Unicode	Image	X	Y	Width	Height
U+842C	200021853-00002	634	244	127	163
U+5BB6	200021853-00002	645	424	123	156
U+65E5	200021853-00002	665	611	65	87
U+7528	200021853-00002	650	727	97	123
U+60E3	200021853-00002	644	883	121	140
U+83DC	200021853-00002	640	1048	120	164
U+4FCE	200021853-00002	638	1249	136	124
U+4E0D	200021853-00002	468	260	127	108
U+6642	200021853-00002	477	383	124	145
U+73CD	200021853-00002	462	545	151	129
U+5BA2	200021853-00002	466	692	136	141
U+5373	200021853-00002	472	851	124	124
U+5E2D	200021853-00002	465	985	132	145
U+5E96	200021853-00002	469	1149	133	131
U+4E01	200021853-00002	480	1288	121	100
U+5408	200021853-00002	533	1553	179	127

CSV Format: Unicode code point and XYWH

Unicode, x, y, w, h

U+3029, 512, 418, 56, 47



Coordinates of the bounding box of characters

Traditional OCR

Question: Can we always assume that the layout consists of lines?



Complex Layout due to Handwriting and Woodblock Printing

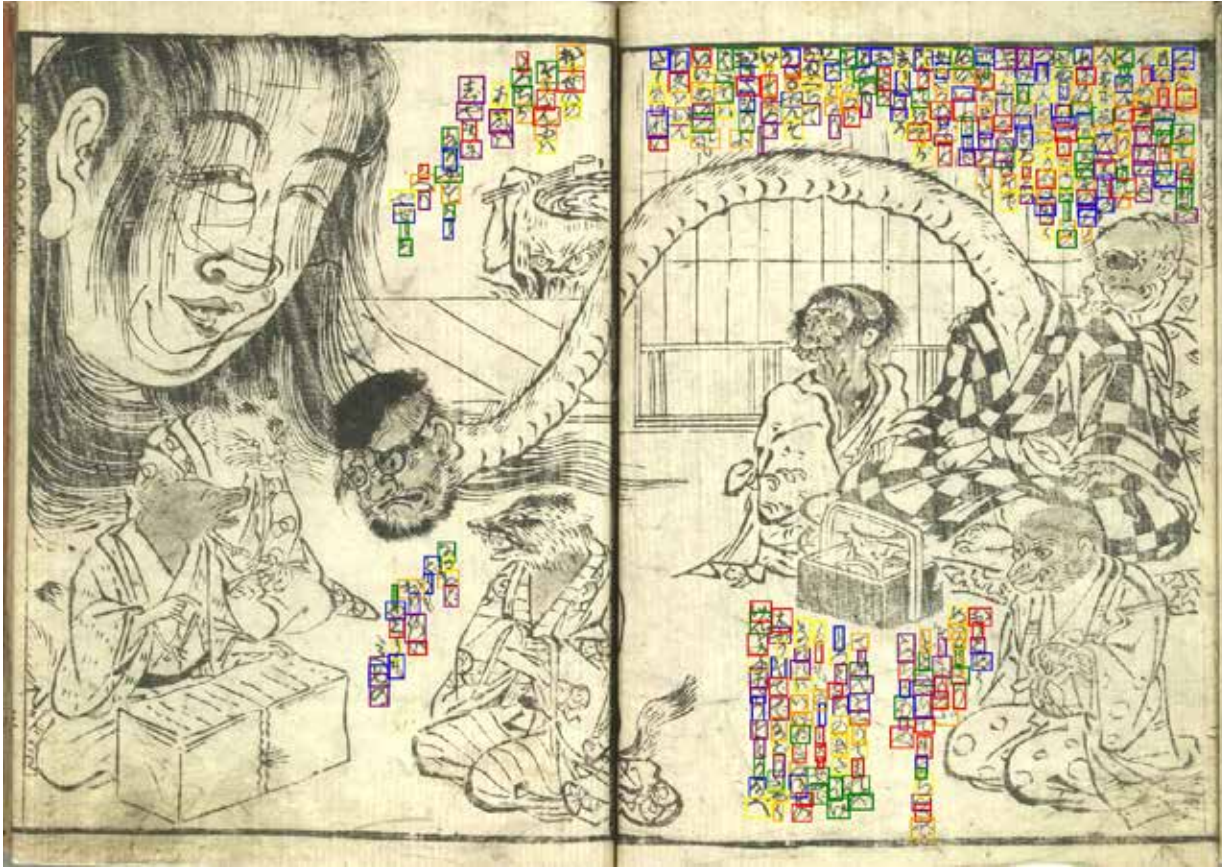
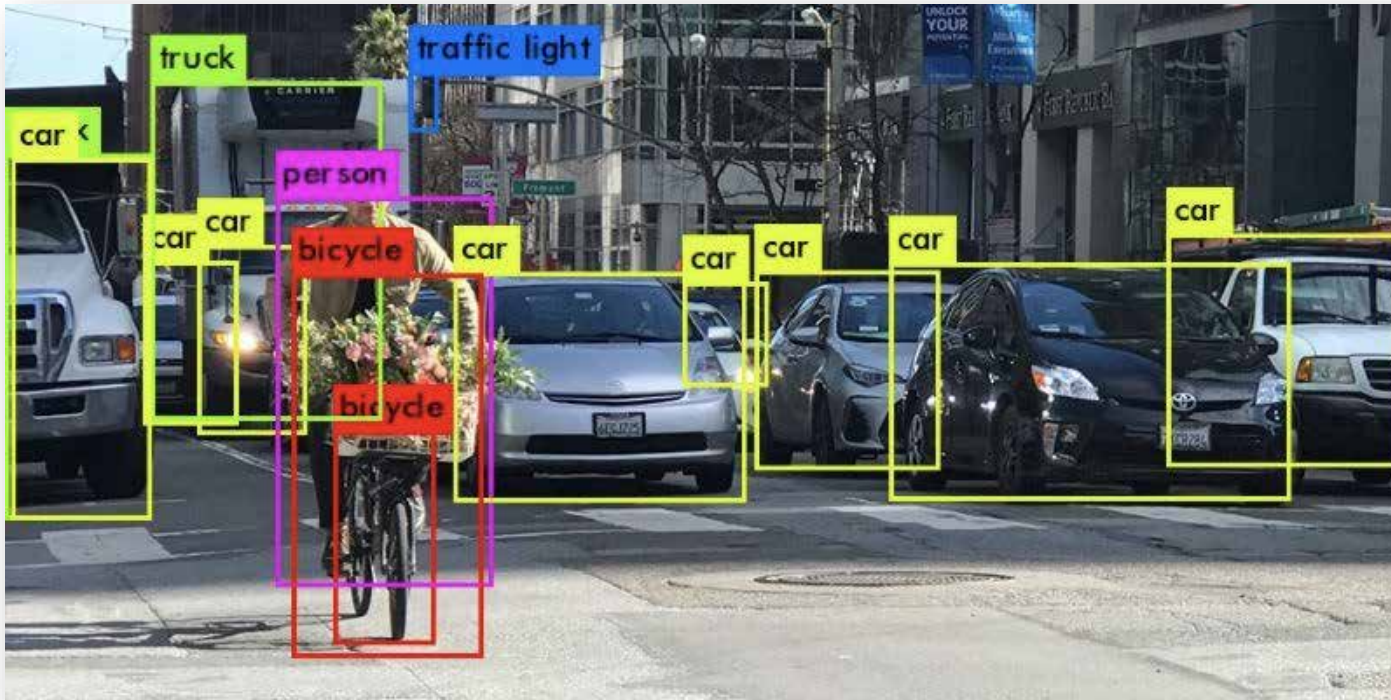


Image from Waseda University Kotenseki Database

1. **Handwriting**, especially letters, songs and annotations, uses complex layout patterns.
2. **Woodblock printing** allows a creative layout.
3. **Movable type printing** had been minor before the late 19th century.

Computer Vision-based Object Detection

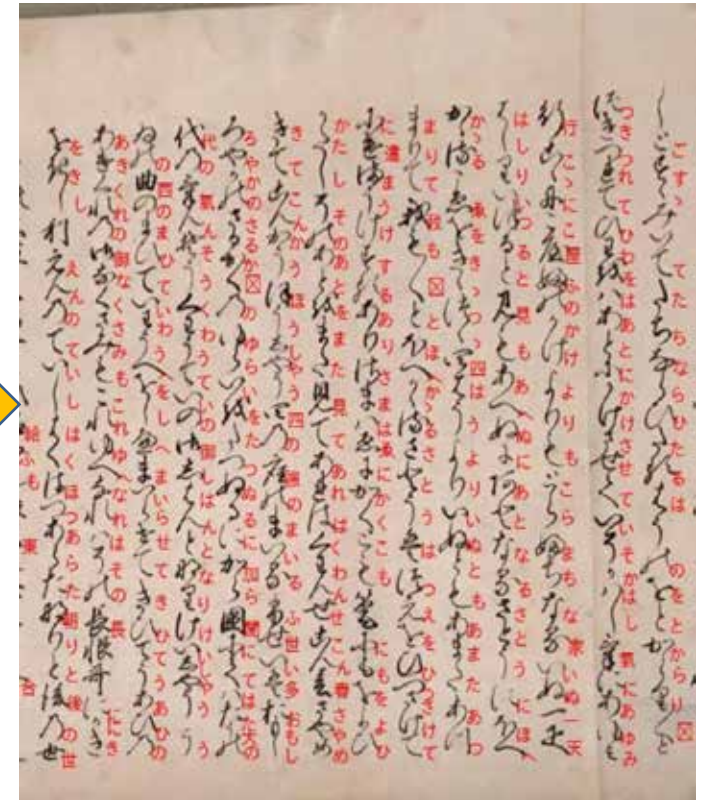
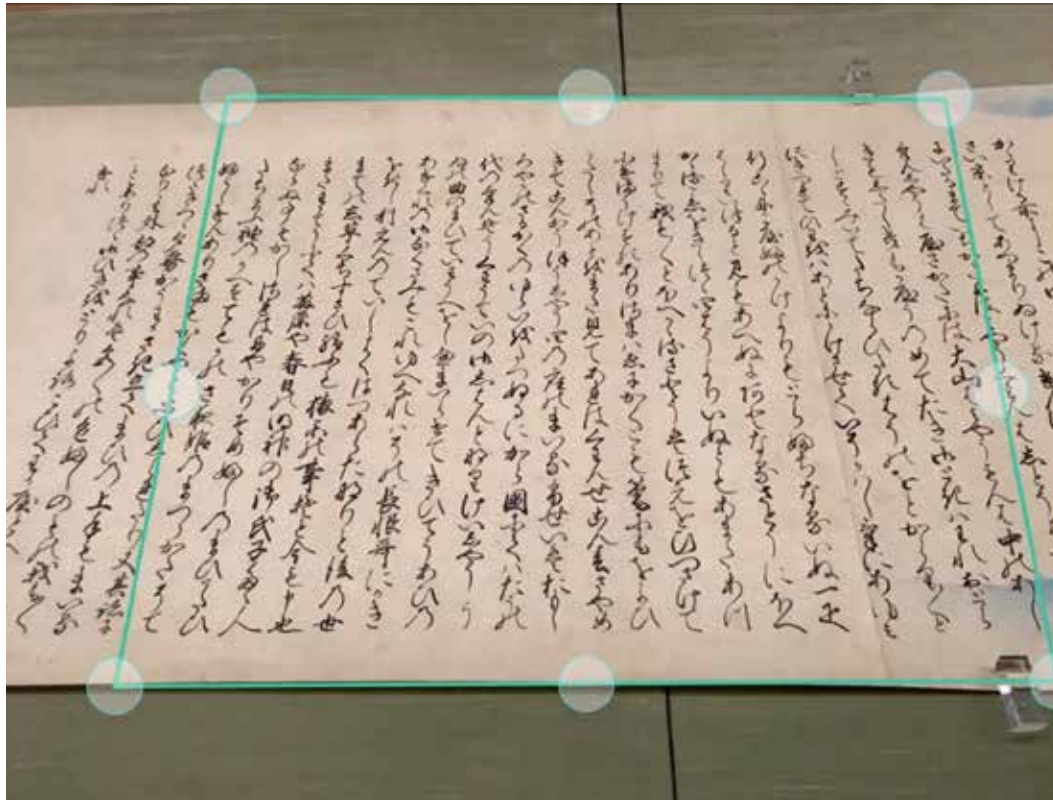


1. Object detection is a vibrant research area with **industrial value** such as autonomous driving.
2. Can we apply this technology for kuzushiji? A simple idea, but it was not possible before.

Object Detection-based OCR

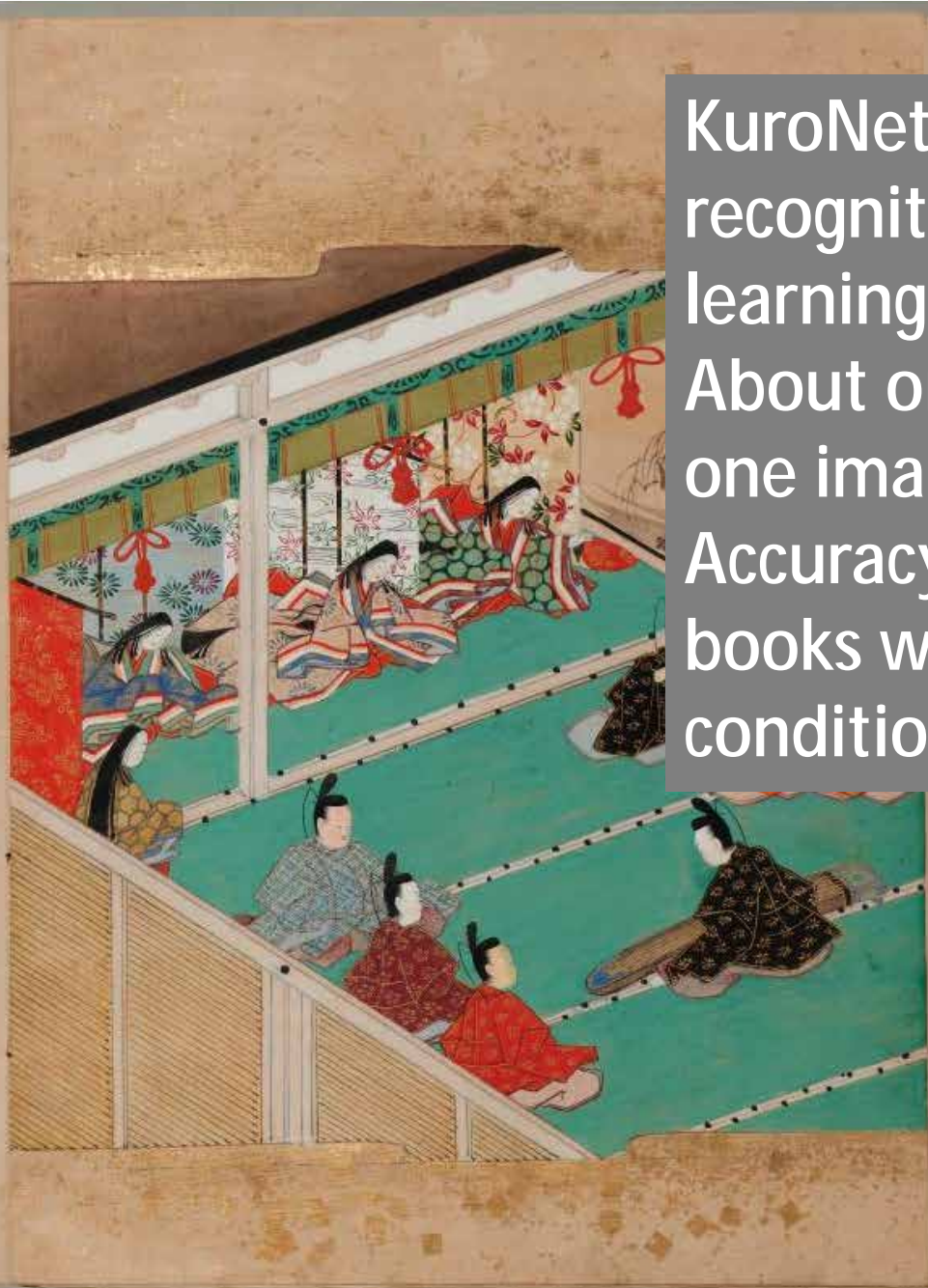
Image

Character
recognition

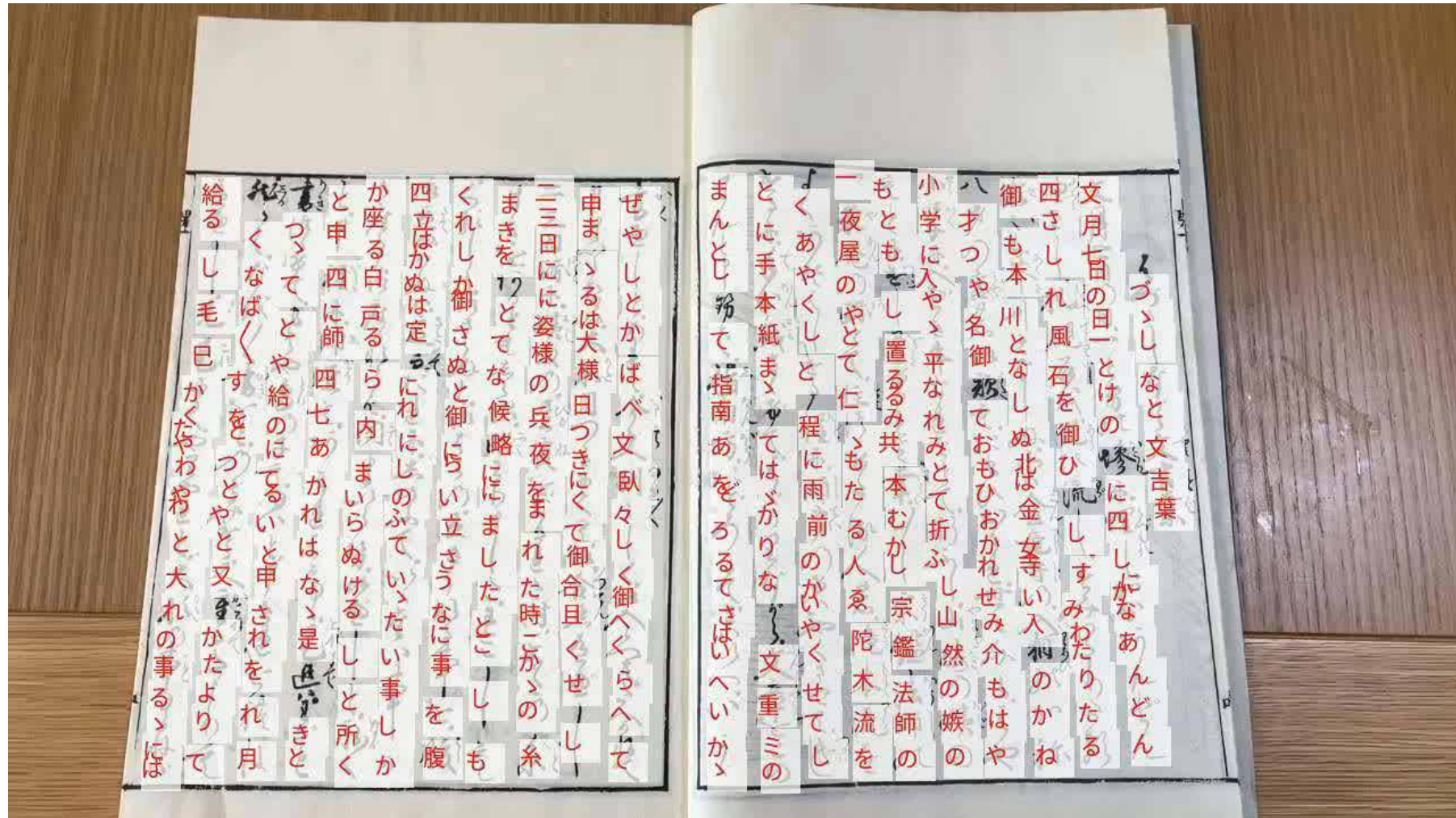


KuroNet: Kuzushiji
recognition using deep
learning.
About one second for
one image.
Accuracy is 95% for
books with the best
condition.

三てう殿に殿きたのかたならひておはし
ます御たいまいれりしううちよりまう
てたまへりくにくのしやうよりたうき
ぬぬのなともてまいれり御いそきのれう
にとてあやうす物かとりきぬなとお
ほく奉れたれはみくしけのする人御
まへまてはからひきたむそめくさ何くれの
としやうこのものともは一てう殿にもわかち
奉り給おはする事はなければ御かた
におほしなけきまくにきおとろかし



Kuzushiji Recognition using Object Detection



Layout First?

Traditional OCR:

1. layout analysis
2. character recognition

KuroNet:

1. character recognition
2. layout analysis

1. **Layout analysis is not hard for humans**, as long as characters are recognized.
2. **Layout analysis is hard for machines** because woodblock printing allows free layout without alignment on lines.
3. In **KuroNet**, character recognition is **not affected by the failure of layout analysis**.



kaggle Kuzushiji Recognition












<http://codh.rois.ac.jp/competition/kaggle/>



Kaggle is the largest **AI competition** platform.
Our competition was **the first in the humanities domain**.

- **Period:** July 19 to October 14, 2019
- **Teams:** 293
- **Members:** 338
- **Submissions:** 2652

kaggle Competition Result

#	Δpub	Team Name	Notebook	Team Members	Score 🏆	Entries
1	—	tascj			0.950	13
2	—	Konstantin Lopuhin			0.950	60
3	—	Kenji			0.944	161
4	▲1	YoudaoOCR			0.942	49
5	▼1	See--			0.940	42
6	—	abc			0.939	15
7	—	K_mat			0.934	20
8	—	t-hanya			0.920	21
9	—	Ollie, Nanashi, and Tom			0.910	35
10	—	Zenkei_R&D			0.903	144
11	—	masayai			0.903	12
12	▲5	Kirill Brodt (shad nsk)			0.901	4
13	▲1	James Day			0.901	33
14	▼1	NEU			0.900	54
15	▼3	s tatsuya			0.900	29

Best
Accuracy
95%

1. All winners have developed good machine learning models **without reading kuzushiji**.
2. To design a competition with a clean dataset and a meaningful metric, **collaboration with domain experts is a must**.

Miwo: App for AI Kuzushiji Recognition

<http://codh.rois.ac.jp/miwo/>



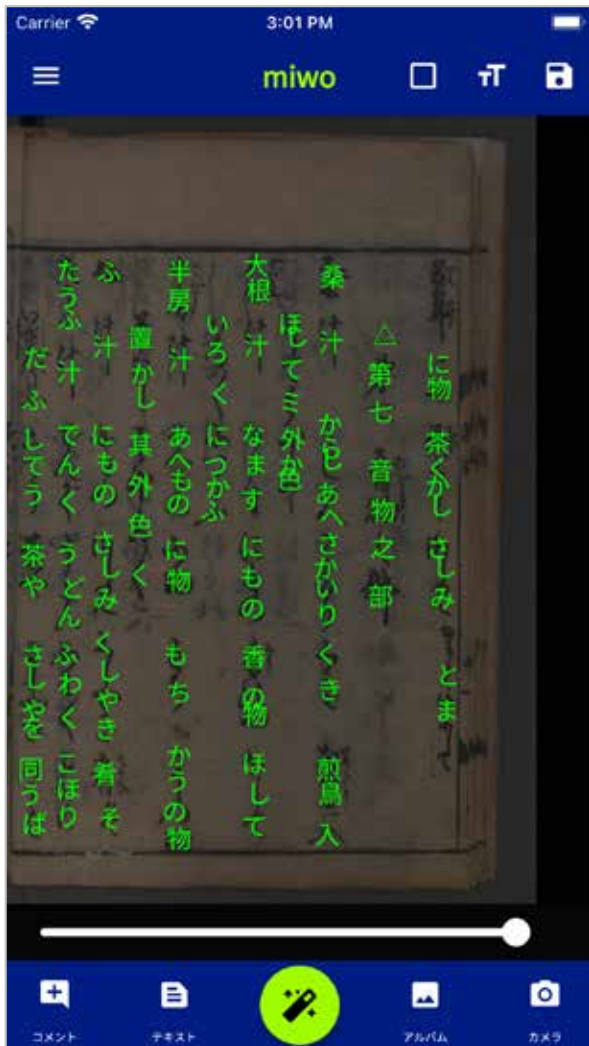
The name comes from the 14th chapter of **The Tale of Genji** "**miwotsukushi**," referring to waterway signs. Just as the miwotsukushi is a guide for boats in the sea, we aim to make our "miwo" app as a **guide for traveling the ocean of historical documents**.



- | **Released on August 2021 for iOS and Android for free**
- | The app has been downloaded **100,000+** times, and has recognized more than **one million** images
- | The daily usage is about 3,000 images.

miwo app
prototype
version at the
KeMCo
Museum (April
2021)





Show a recognition result in characters



Show a recognition result with bounding boxes

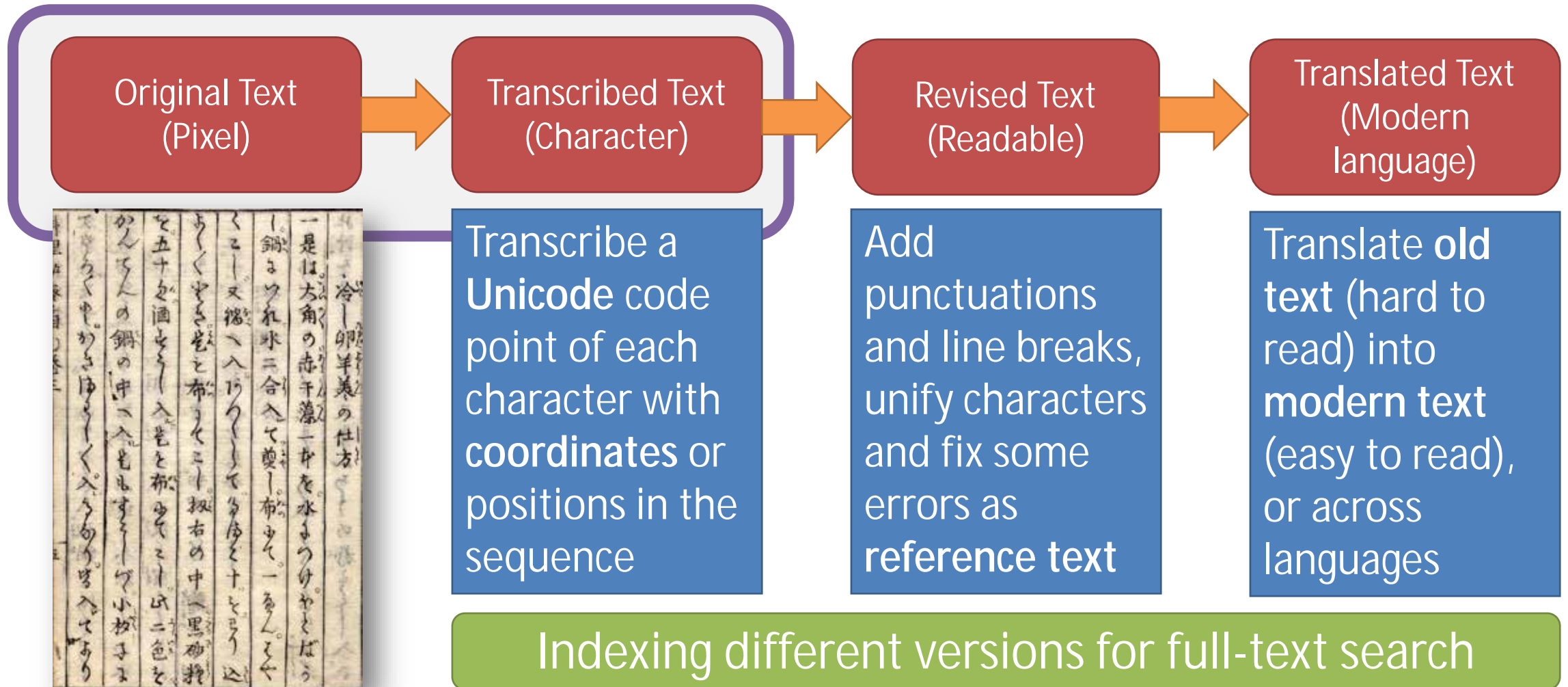


Modify the error with reference to root characters.



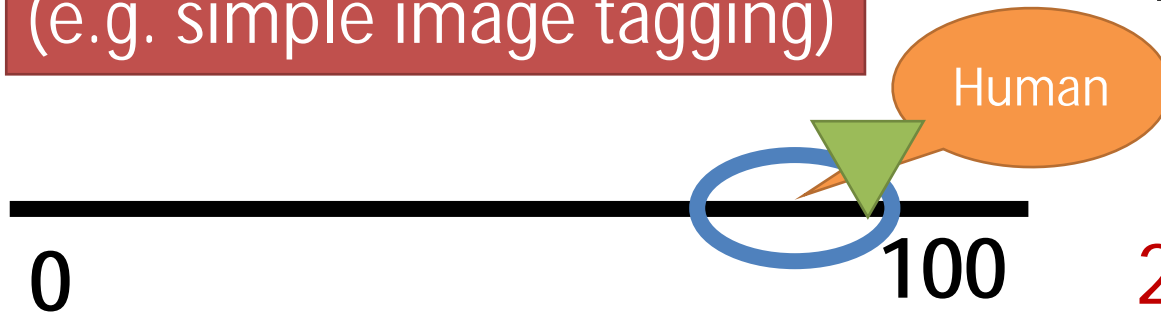
Generate the text output from the recognition result

Text Processing Workflow



Machines are Better than Humans?

General tasks
(e.g. simple image tagging)



1. Typical benchmarking = **AI can surpass the performance of human?**

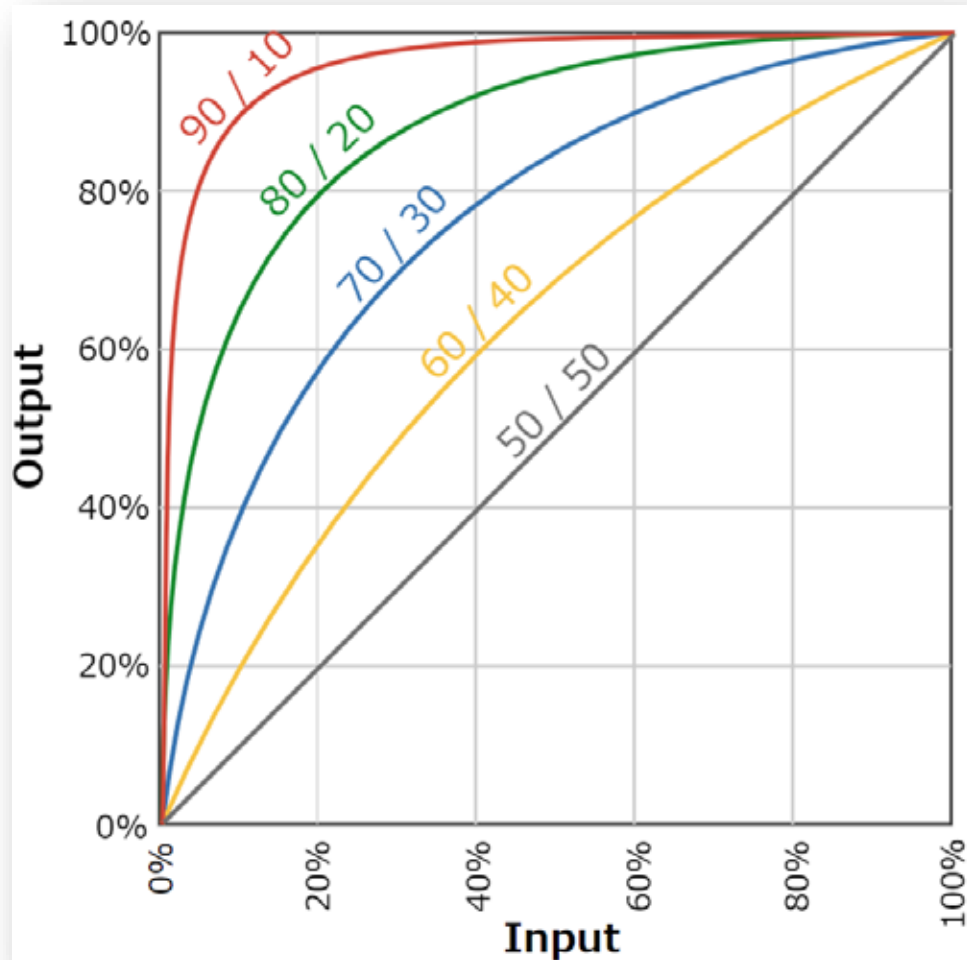
Specialized tasks
(e.g. kuzushiji recognition)



2. Comparison is uncertain when the variance of human performance is large.

3. Benchmarks can measure only a fraction of human performance.

80-20 Rule and Bullshit Jobs



1. AI is a technology for **leveraging productivity**.
2. AI can finish 80% of the work for only 20% time (4x faster).
3. Then humans do 20% for 80% time (1/16 slower).
4. **AI takes a juicy part, and humans fix hard problems.**
5. AI transforms the task into a painful one (bullshit jobs).

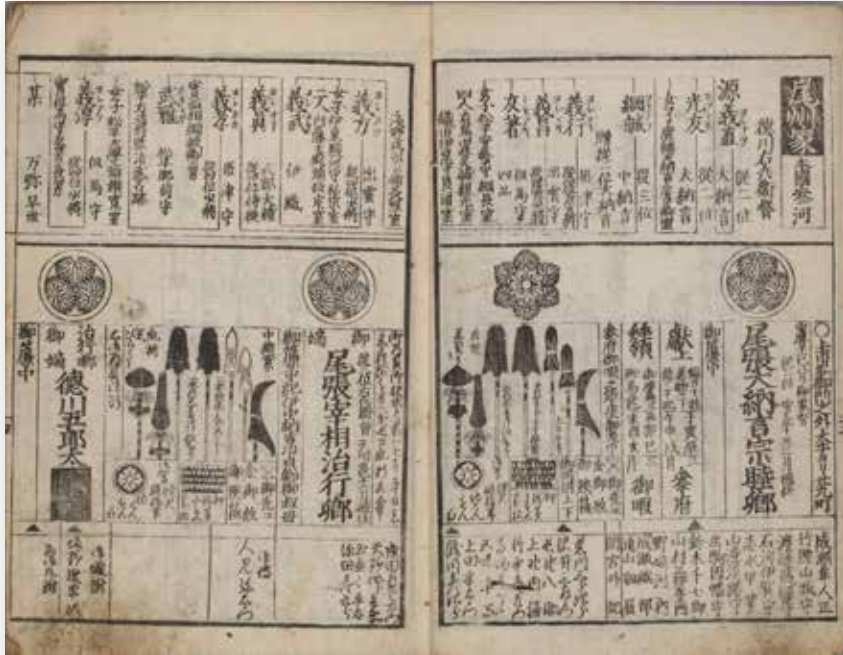
Impact on the Humanities Research

1. We showed that **AI models for kuzushiji recognition are now reality** and actually help humans to **transcribe fast**.
2. **We democratized the AI model as a mobile app** so that everyone can use the model at any time from everywhere.
3. **Tsukushi project:** Results of AI kuzushiji recognition will be fed into a **full-text search engine**.
4. A full-text search engine will accelerate the information seeking process and **transform the humanities research**.

Bukan Complete Collection

Collaborator: Kumiko Fujizane (National Institute of Japanese Literature)

What is Bukan (武鑑) ?



Kansei Bukan (1789), Dataset of
Premodern Japanese Text (NIJL)
<http://codh.rois.ac.jp/pmjt/book/200018823/>

1. Bukan is a “data book” of Daimyo and personnel in the Edo Bakufu compiled in a structured format.
2. Published for 200+ years before 1867, until the end of the Edo Period.
3. Long-seller books with practical usage.
4. The frequency of updates had increased to a few times a month at the peak.

Reference: Kumiko Fujizane, 2008

Diachronic Transcription using Difference

Question: how can we transcribe books over 200+ years?



Solution: detect and transcribe the difference to create diachronic data.



Text-based and Image-Based Collation

Text-based Collation = Many tools are available

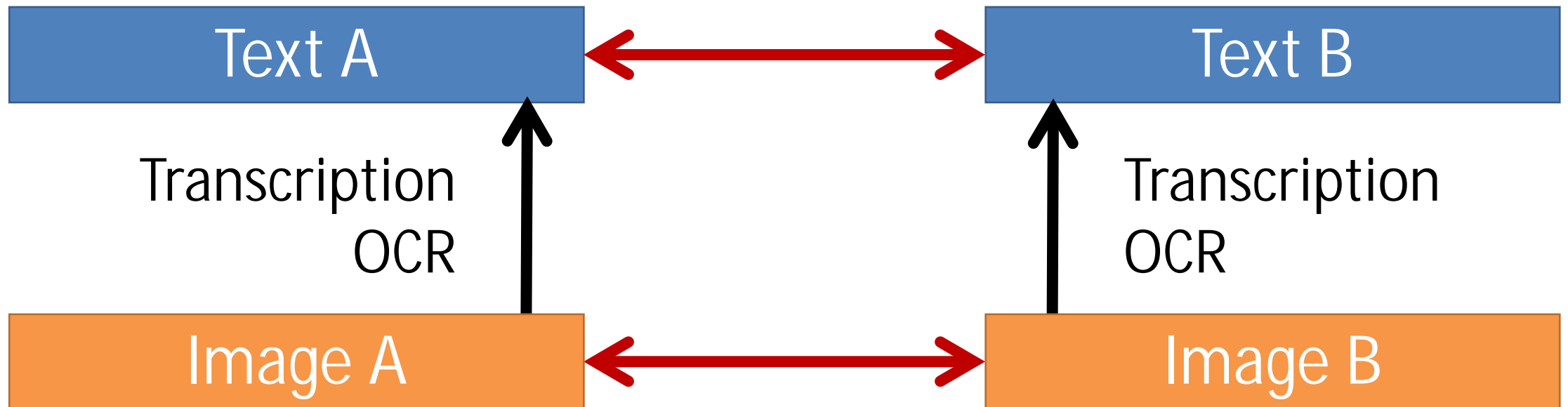
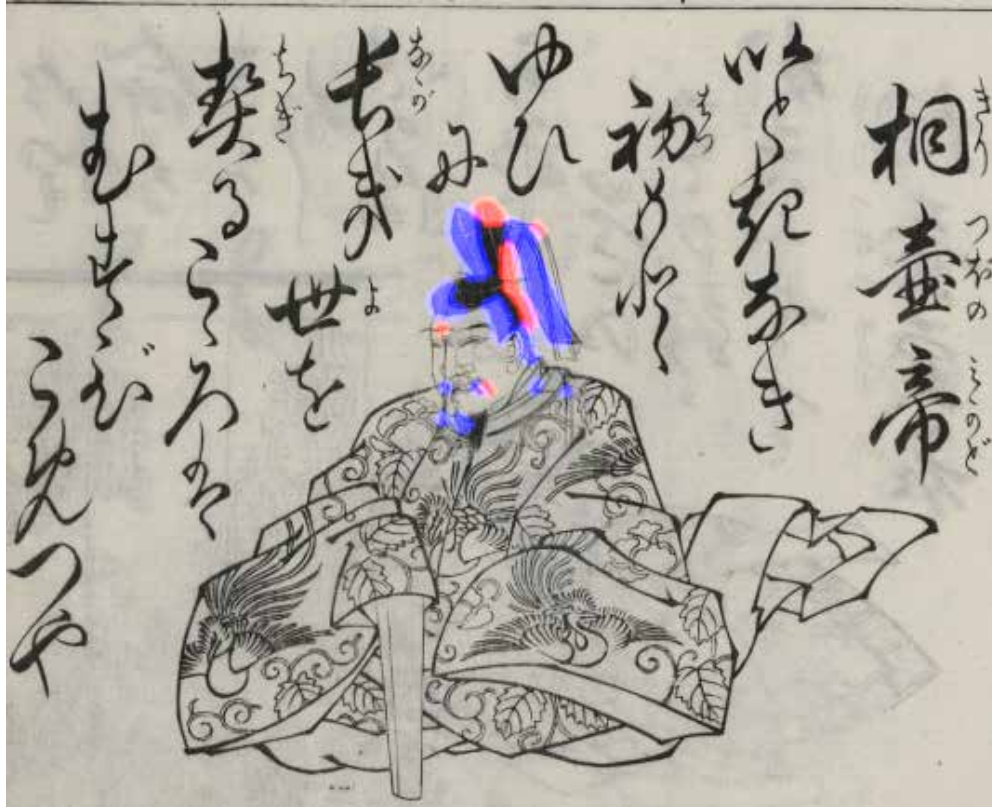


Image-based Collation = **No standard tools**

Mainstream is "**side-by-side comparison**" by visual inspection

Image Collation for Differential Reading

<http://codh.rois.ac.jp/differential-reading/>



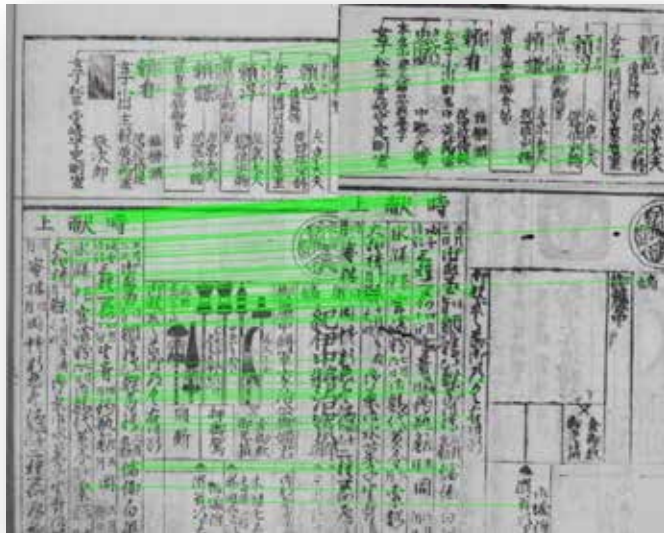
Genji Hyakunin Isshu Comparison,
University of Tokyo Library.

1. A JavaScript-based tool "vdiff.js" for comparing images.
2. Anyone can upload two images (or specify URLs).
3. The system can automatically match two images and emphasize the difference.
4. When the system fails, you can manually improve the matching.

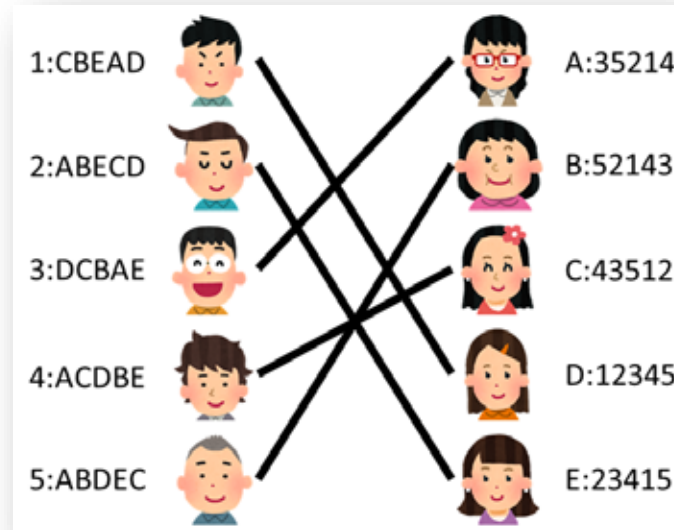
Differential Reading

1. **For humans:** visual comparison requires an **effort comparable to playing games**.
2. **For machines:** visual comparison is an easy game using a **computer vision-based image matching** algorithm.
3. **Let's turn a difficult task (reading difference) into an easy one** with the help of machines.
4. **Differential reading:** A new mode of reading books focusing on difference between editions (versions).

Large-Scale Book Collation



1. Page collation:
image matching
using keypoints.

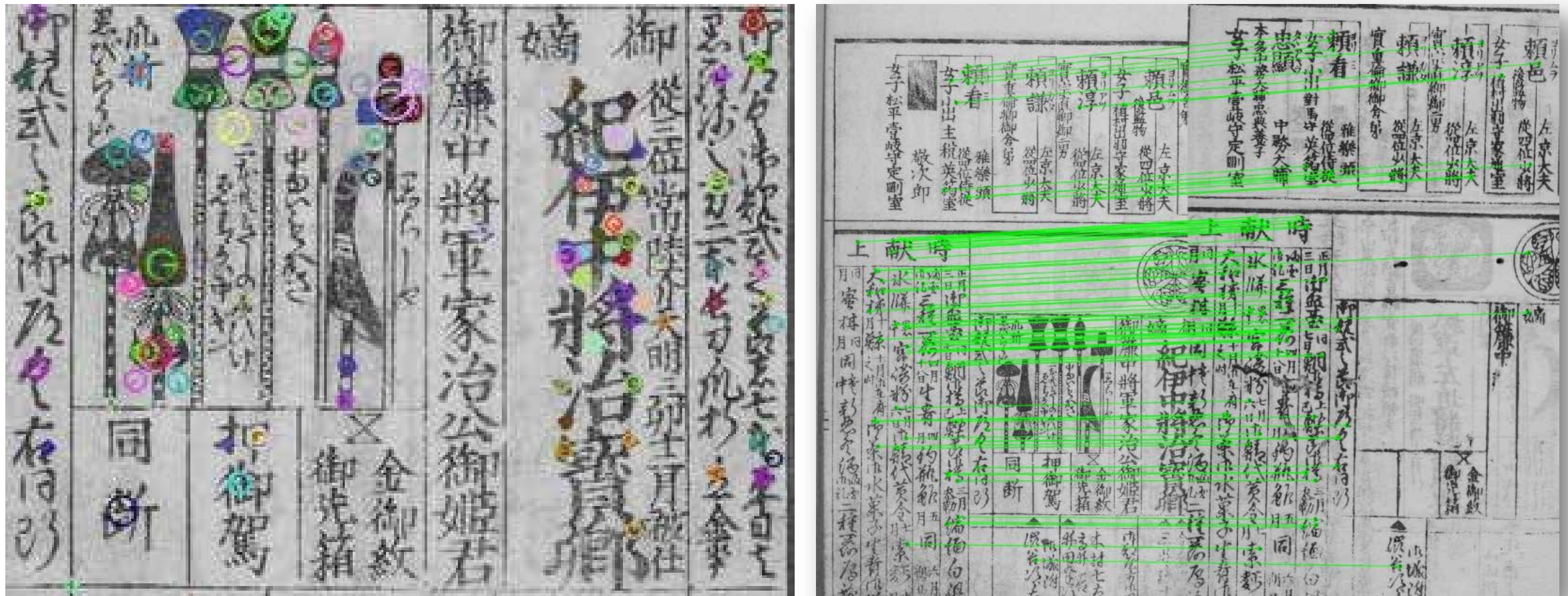


2. Book collation:
stable marriage
algorithm based on
page collation.



3. Woodblock tracking:
The same woodblock is
estimated and
connected across books.

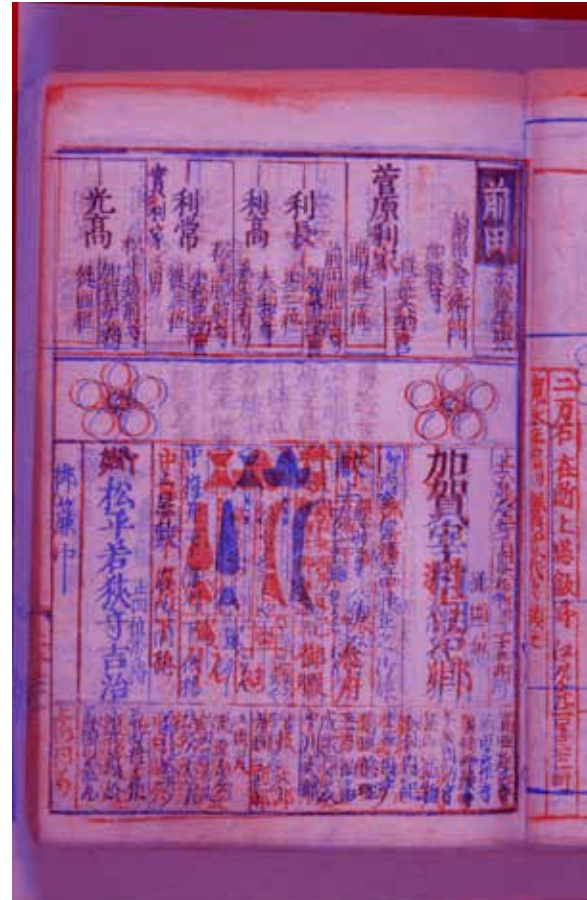
Page Collation – Keypoint Matching



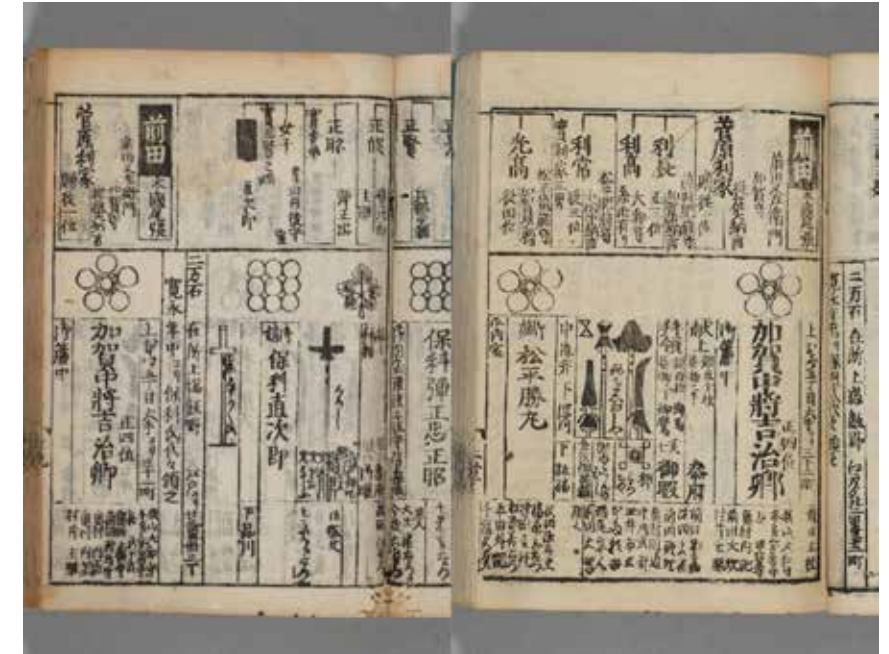
Examples of Image Collation



Collation for minor changes



Collation for large changes



Collation is not possible due to the change of woodblocks

Book Collation – Stable Marriage Algorithm

Book A	Book B	Score
1	1	0
2	2	5
3	3	10
4	4	4
5	5	6
6	6	50
7	7	8

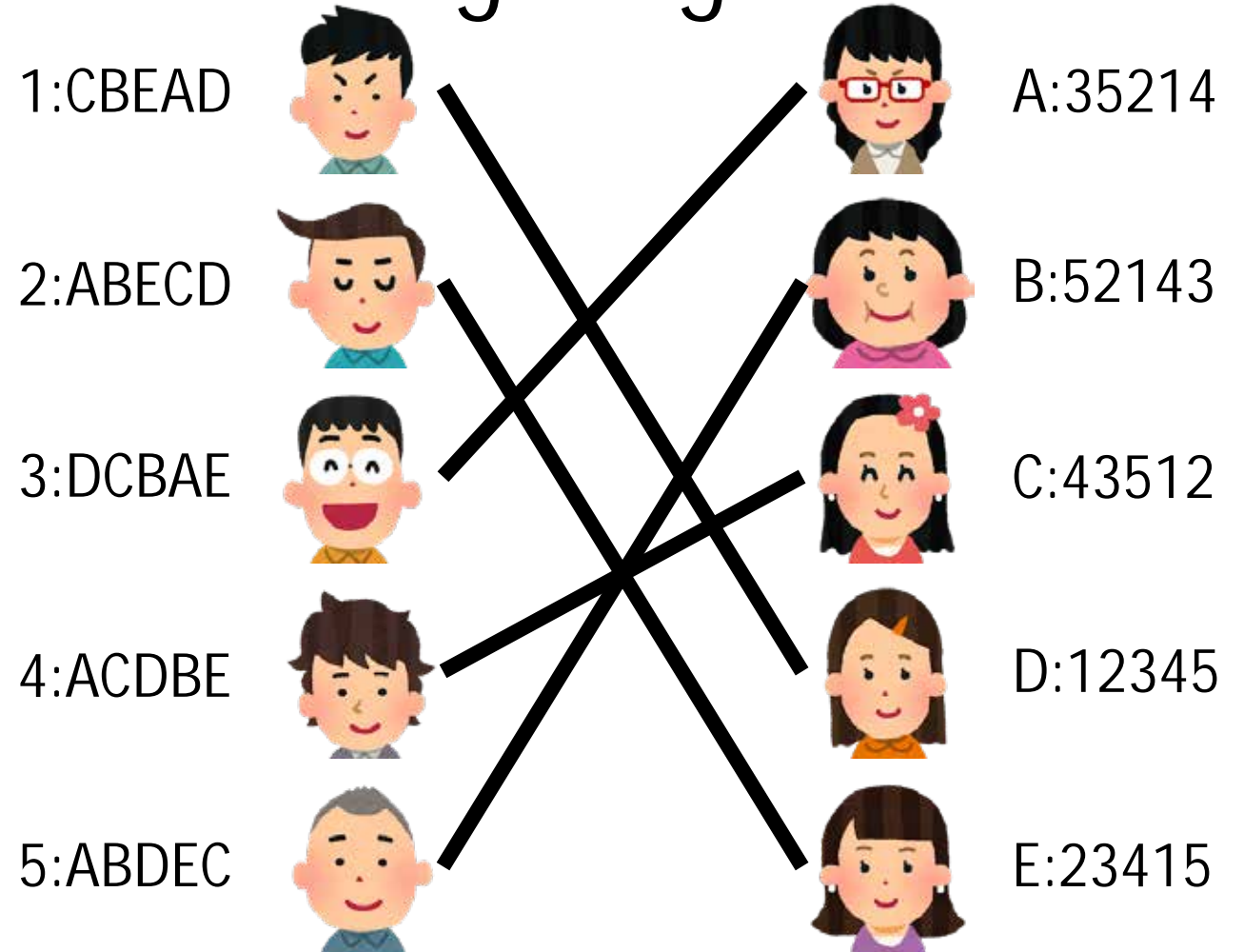
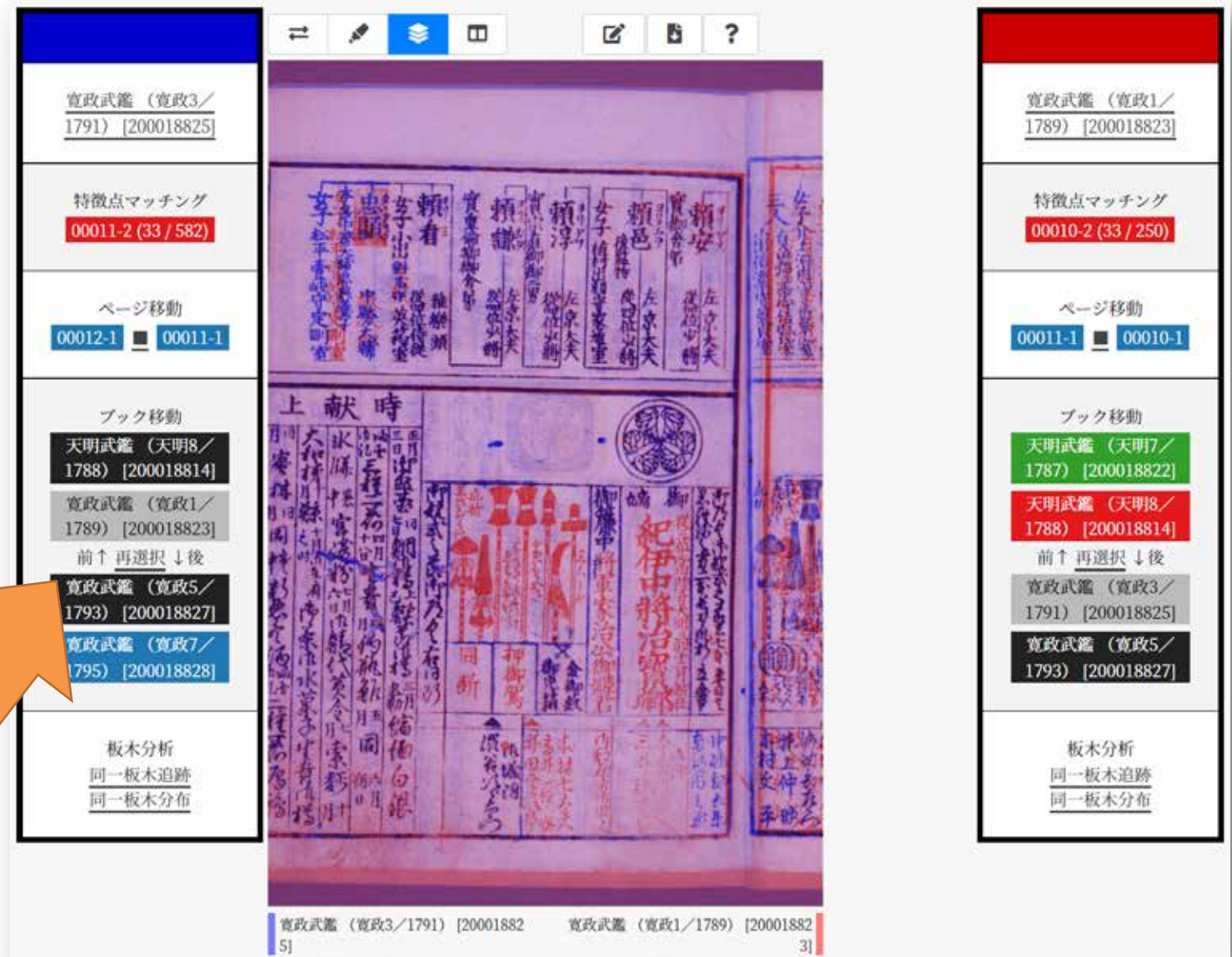


Image source: Irasutoya

Page Collation

1. Read images from two books for comparison using **vdiff.js**
2. You can move forward or backward within a book.
3. You can move to the next or previous book by keeping the same woodblock



	A	D	E	F	G	I	J	K	L	M
1		武鑑基礎情報				翻刻				
2	番号	武鑑名	DOI	出版年（和暦）	出版年（西暦）	記載ページ	当主名	参府年月	御暇年月	居城地
65	63	正徳武鑑	200018763	正徳4		2-2	加賀宰相綱紀卿	なし		
66	64	正徳武鑑	200018764	正徳5		3-2	加賀宰相綱紀卿	なし		
67	65	享保武鑑	200018765	享保2	1717	00022-2	加賀宰相綱紀卿	なし		
68	66	享保武鑑	200018766	[享保4]	1719	00022-2	加賀中将吉治卿（吉徳）			
69	67	享保武鑑	200018768	享保6	1721	00023-2	加賀宰相綱紀卿	なし		
70	68	享保武鑑	200018769	享保11	1726	00024-2	加賀中将吉治卿（吉徳）	午9		
71	69	享保武鑑	200018770	享保14	1729	00024-2	加賀中将吉治卿（吉徳）	午9	巳3	加州金沢
72	70	享保武鑑	200018771	享保17	1732	00022-2	加賀中将吉治卿（吉徳）	なし	亥7	加州金沢
73	71	元文武鑑	200018772	元文1	1736	00020-2	加賀中将吉治卿（吉徳）	辰7	巳7	加州金沢
74	72	元文武鑑	200018773	元文5	1740	00021-2	加賀中将吉治卿（吉徳）	申7	未7	加州金沢
75	73	寛保武鑑	200018774	寛保1	1741	00021-2	加賀宰相吉徳卿	申7	未7	加州金沢

Metadata is wrong

Change the order of the books for the consistency of the data

Impact on the Humanities Research

1. **Keypoint-based image matching** helps humans to easily compare different versions and detect changes.
2. **Differential reading** helps humans to collect diachronic data with higher accuracy and less effort.
3. Comparison of many versions, either in text or in image, is **the central research challenge in the bibliography study**.
4. Machines and humans can collaborate for **taking advantage of their strengths**, not their weaknesses.

KaoKore and IIF Curation Platform

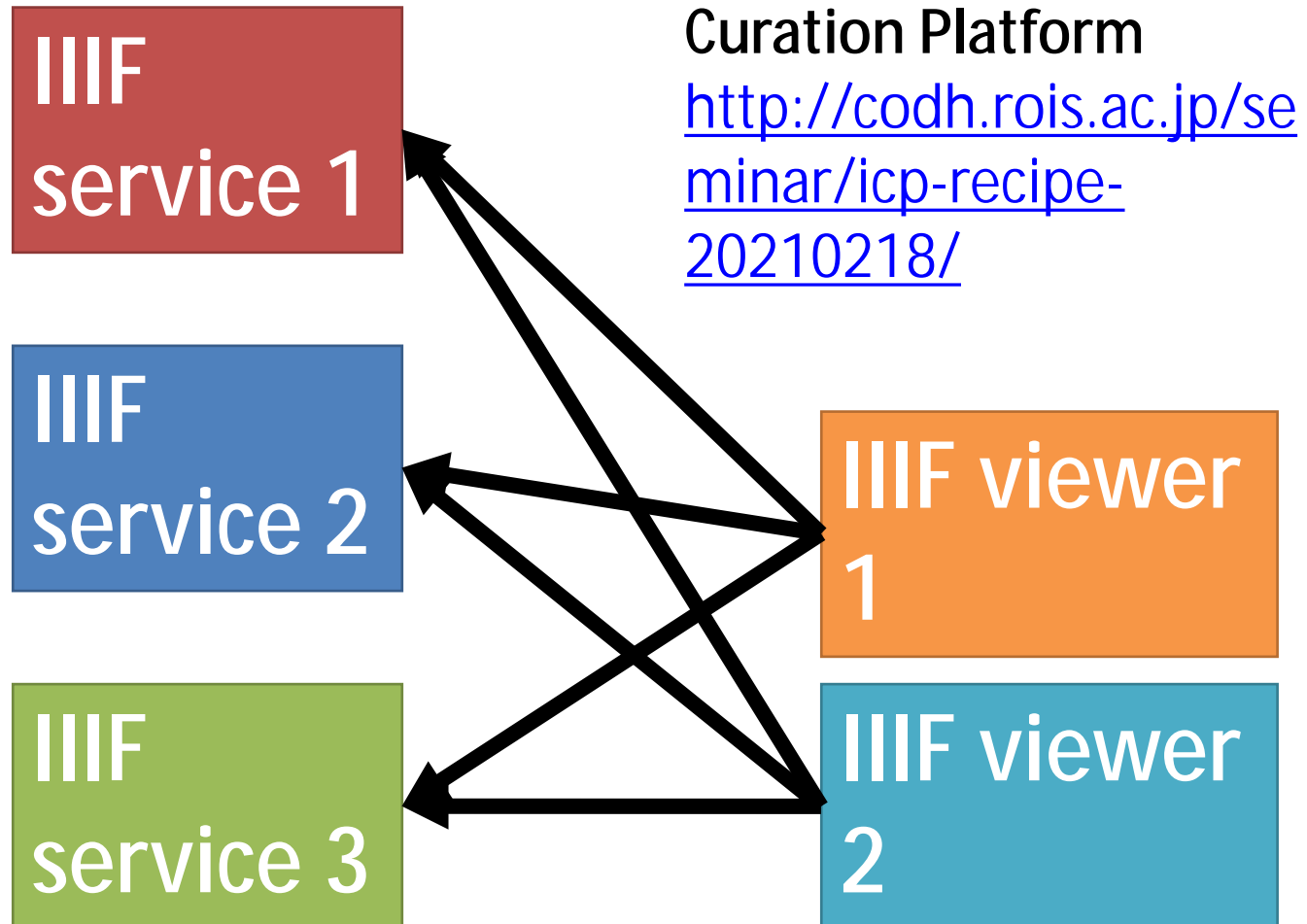
Collaborator: Chikahiko Suzuki (Gunma Prefectural Women's University, Formerly CODH), Jun Homma (FLX Style), Yingtao Tian (Google Brain)

What is IIIF ("triple-I F")?

IIIF = International Image
Interoperability
Framework



Web: HTML
Images: IIIF



14th CODH Seminar -
100 Recipes for IIIF
Curation Platform
<http://codh.rois.ac.jp/seminar/icp-recipe-20210218/>

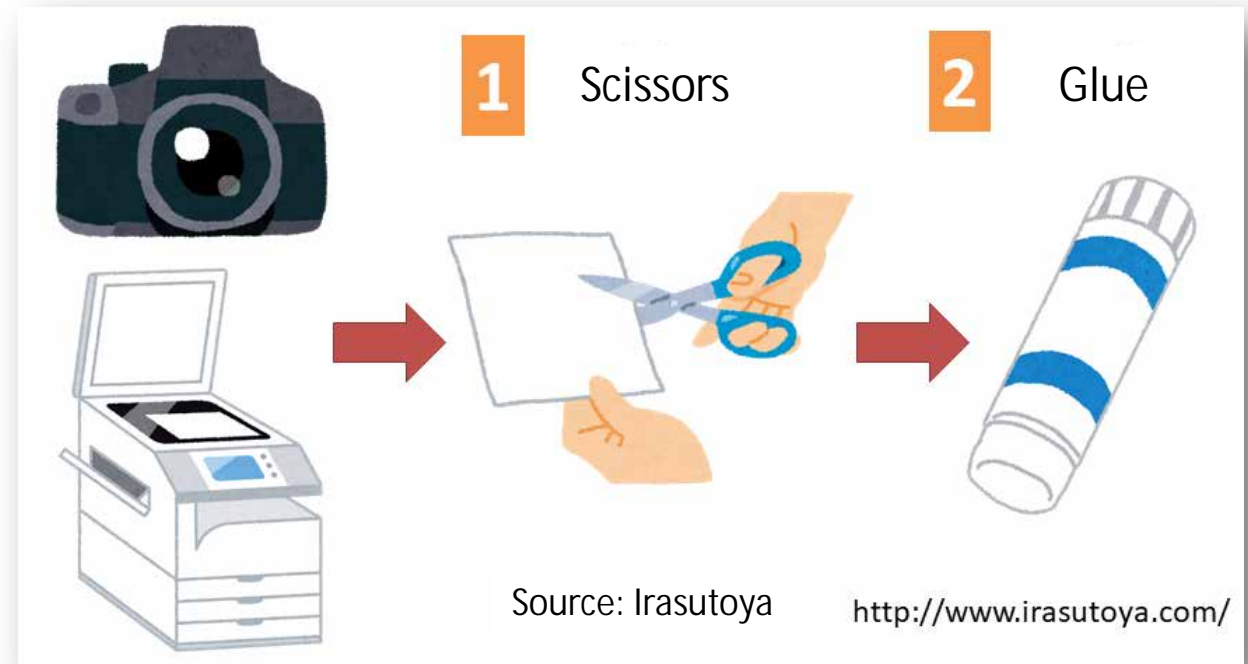
What is Curation?

<http://codh.rois.ac.jp/icp/>

"Curation" is a word that originally means activities at museums such as collecting materials and exhibiting artworks.



1. **Collect materials** under a certain theme.
2. Arrange them in an **appropriate order (layout)**.
3. Present or share the result **as a new material**.



IIIF Curation Viewer

Developed by CODH
since 2016

<http://codh.rois.ac.jp/software/iiif-curation-viewer/>

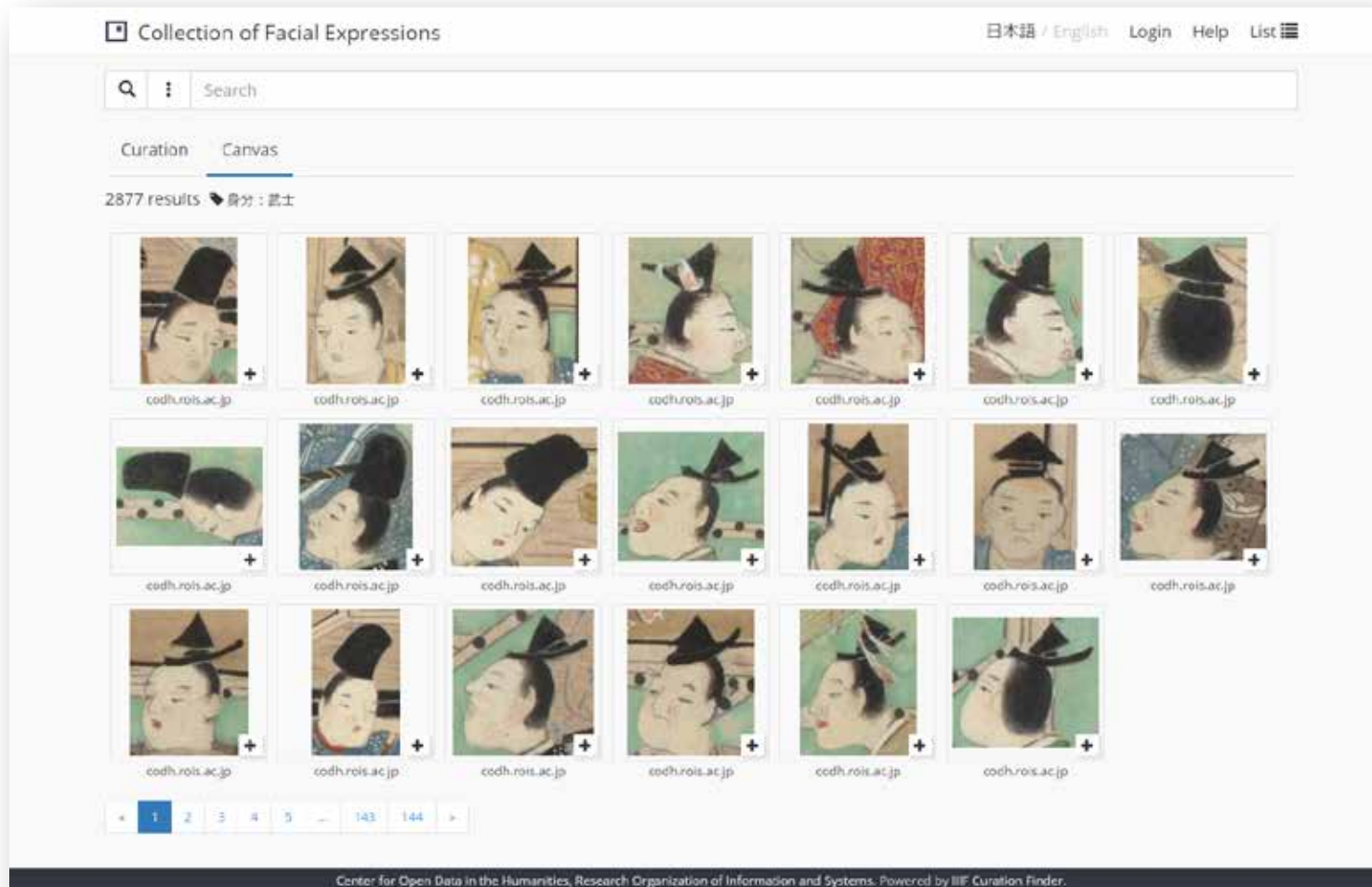


1. is the "crop" button → Selects a rectangular region
2. is the "favorite" button → Collects regions you need



Collection of Facial Expressions (KaoKore)

<http://codh.rois.ac.jp/face/>

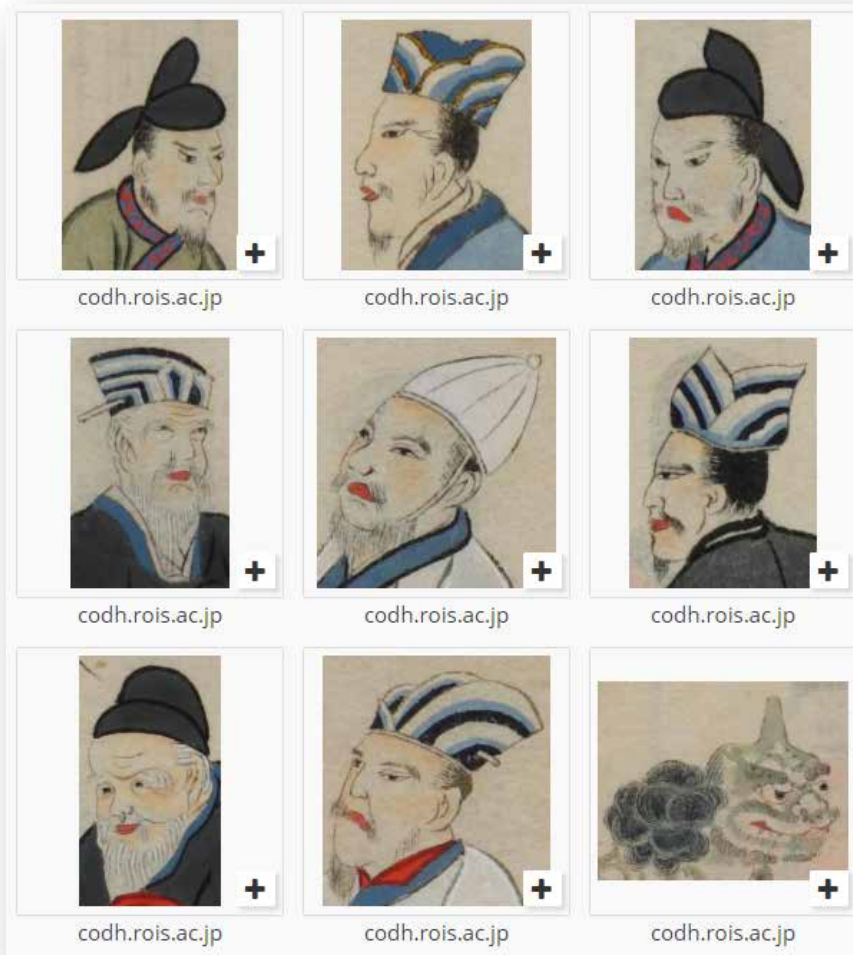


1. **IIIF Curation Viewer** for cropping and collecting a part of images.
2. **IIIF Curation Finder** for searching the collection by metadata.
3. **IIIF Curation Board** for analyzing the collection for art history research (digital humanities).

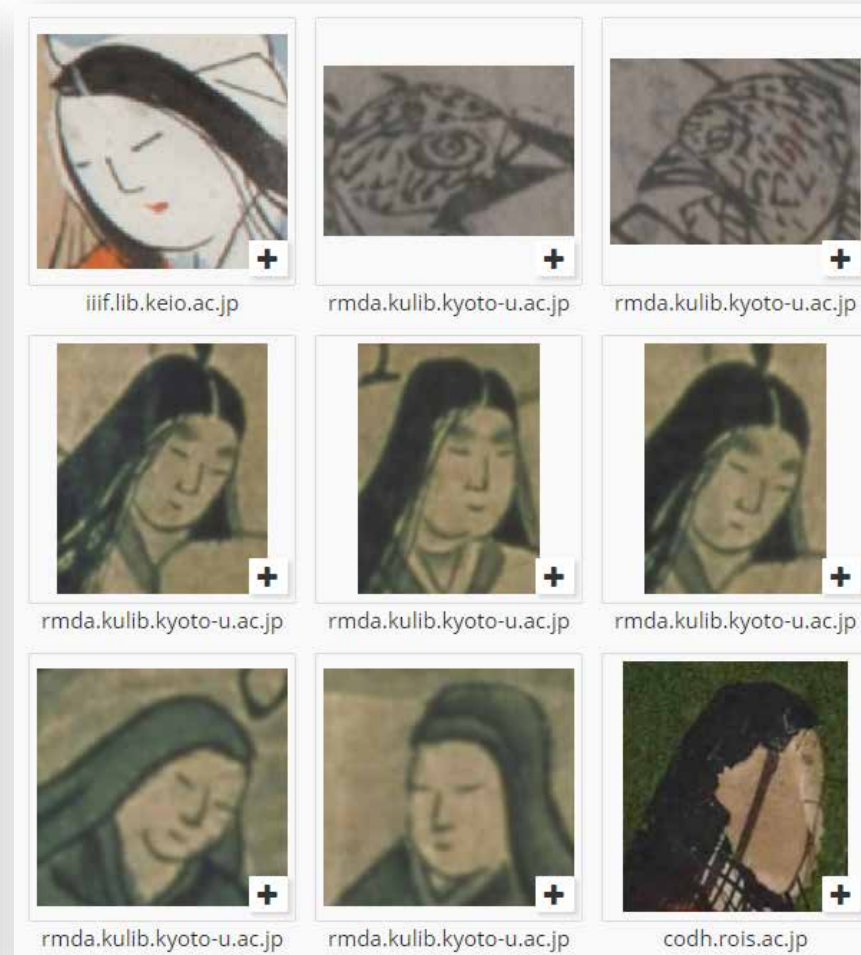
Comparison of Faces by Metadata

<http://codh.rois.ac.jp/software/iiif-curation-finder/>

Men

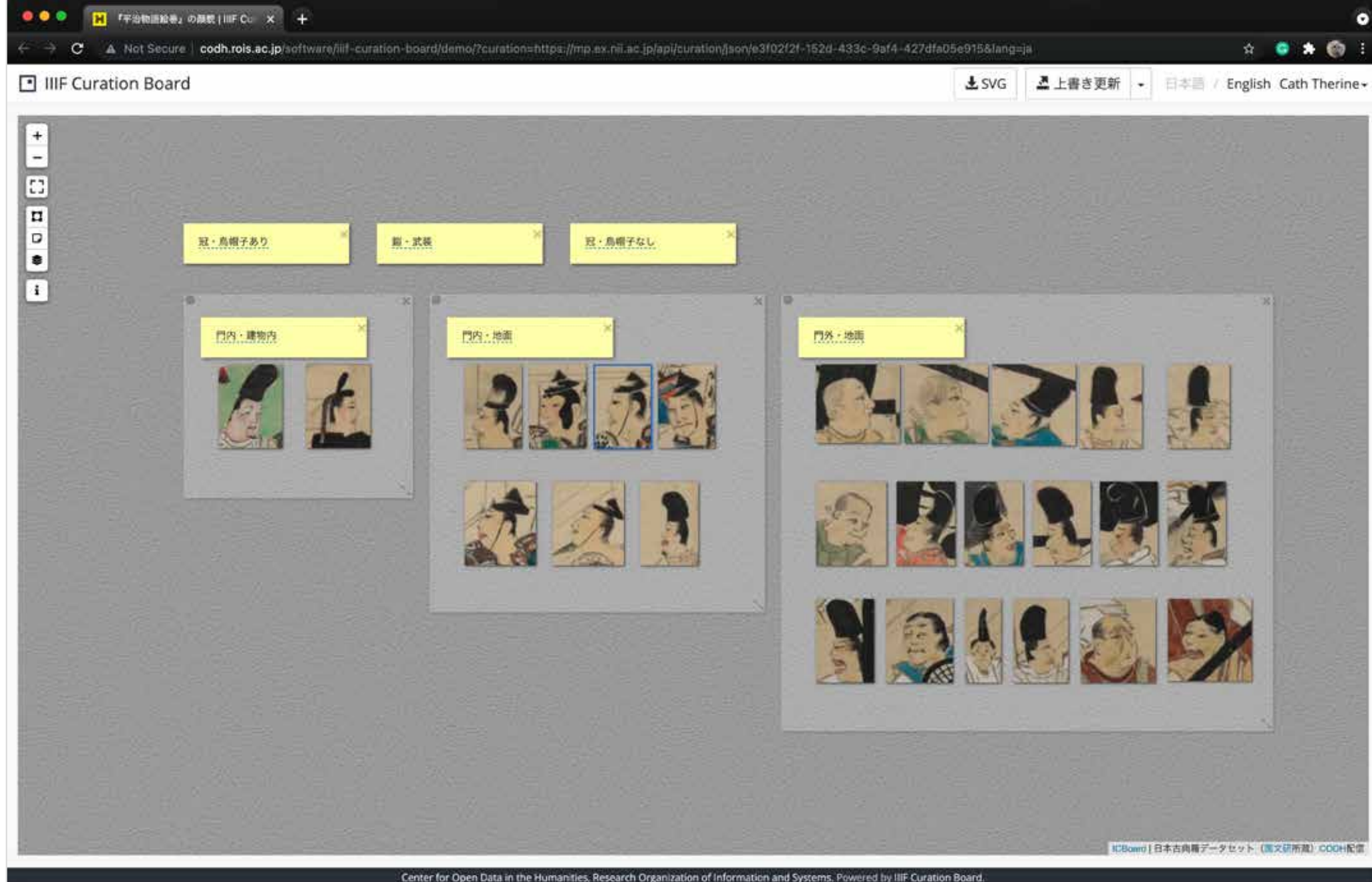


Women



IIIF Curation Board

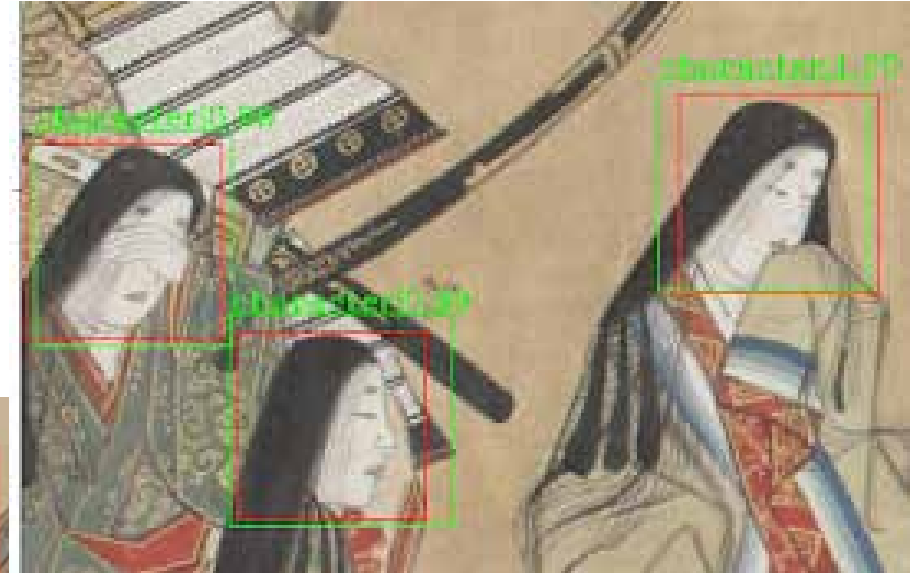
<http://codh.rois.ac.jp/software/iiif-curation-board/>



Face Detection by Machine Learning



Alexis Mermet, Asanobu KITAMOTO, Chikahiko SUZUKI, Akira TAKAGISHI, "Face Detection on Pre-modern Japanese Artworks using R-CNN and Image Patching for Semi-Automatic Annotation", Proceedings of the 2nd Workshop on Structuring and Understanding of Multimedia heritAge Contents (SUMAC'20), pp. 23-31, doi:10.1145/3423323.3423412, 2020.












Source: Kaokore dataset

ML-assisted Annotation

1. Learning from the KaoKore Dataset, **about 80%** of the faces were automatically detected.
2. **About 70%** of the faces were automatically detected when applied to artworks from different time periods.
3. If **two thirds** can be detected by machines, the amount of work by humans is reduced to **one thirds**.
4. Art historians can analyze more data, and more data leads to richer evidence and higher reliability of the results.

Ukiyo-e Faces Dataset

<http://codh.rois.ac.jp/ukiyo-e/face-dataset/>

Painter	Examples
Hirosada (広貞)	
Kogyo (耕漁)	
Kunichika (国周)	
Kunisada (1st gen) (国貞 初代)	
Kunisada (2nd gen) (国貞 二代目)	
Kunisada (3rd gen) (国貞 三代目)	
Kuniyoshi (国芳)	
Toyokuni (1st gen) (豊国 初代)	
Toyokuni (3rd gen) (豊国 三代目)	
Yoshitaki (芳滝)	

"ARC Ukiyo-e Faces Dataset" (Created by Yingtao Tian, ROIS-DS CODH;
Collected from ARC) , <https://doi.org/10.20676/00000394>

1. Art Research Center of Ritsumeikan University has Ukiyo-e Dataset.
2. ML researcher from Google Brain found that existing API can crop the faces.
3. A new dataset was released for visual Ukiyo-e research.

Impact on the Humanities Research

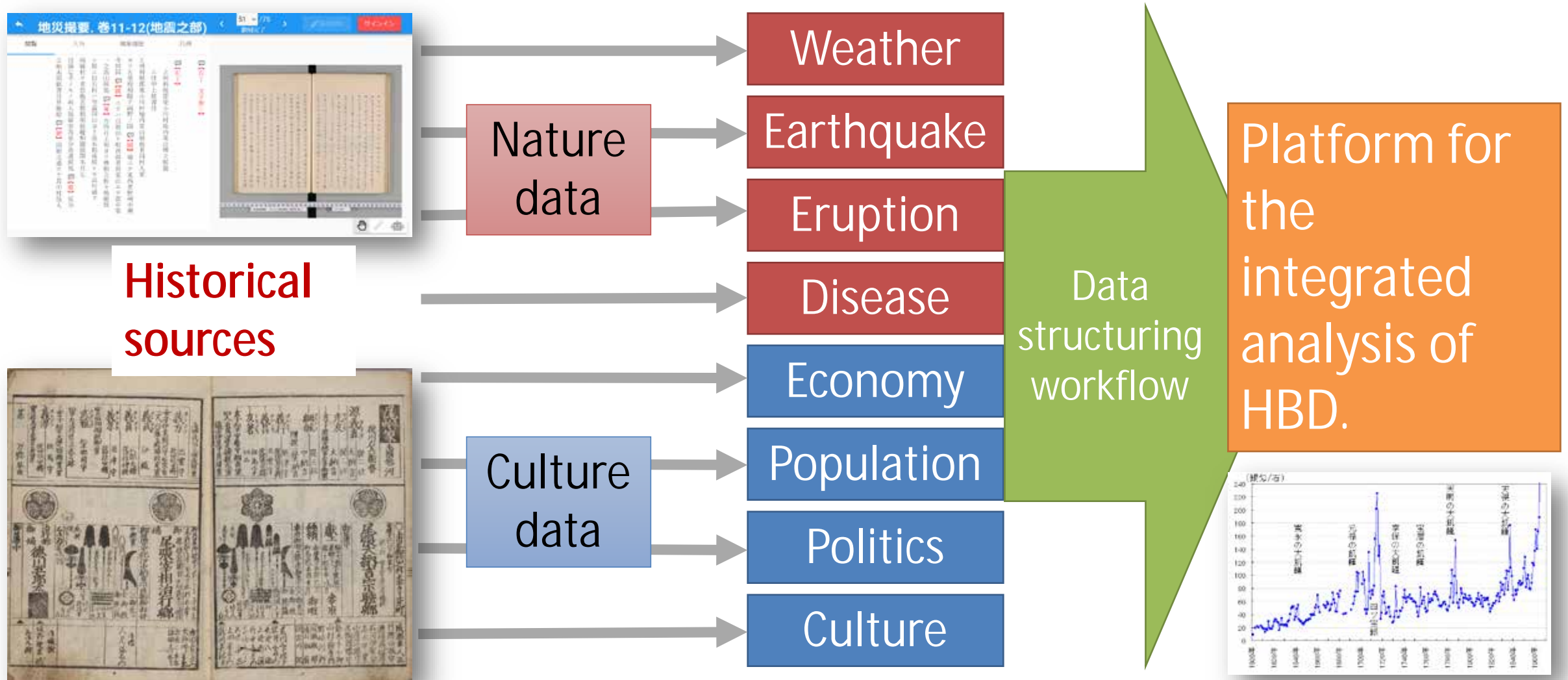
1. IIF will be **the standard of image delivery** from **memory institutions**, such as libraries, museums, and archives.
2. **IIF Curation Platform** helps domain experts to **analyze the data in a larger scale for reproducible knowledge**.
3. Machine learning helps **accelerate annotation tasks**, but **semantic annotation requires domain knowledge**.
4. IIF has emerged in less than 10 years, so the ecosystem around IIF still has **many opportunities for research**.

Historical Big Data

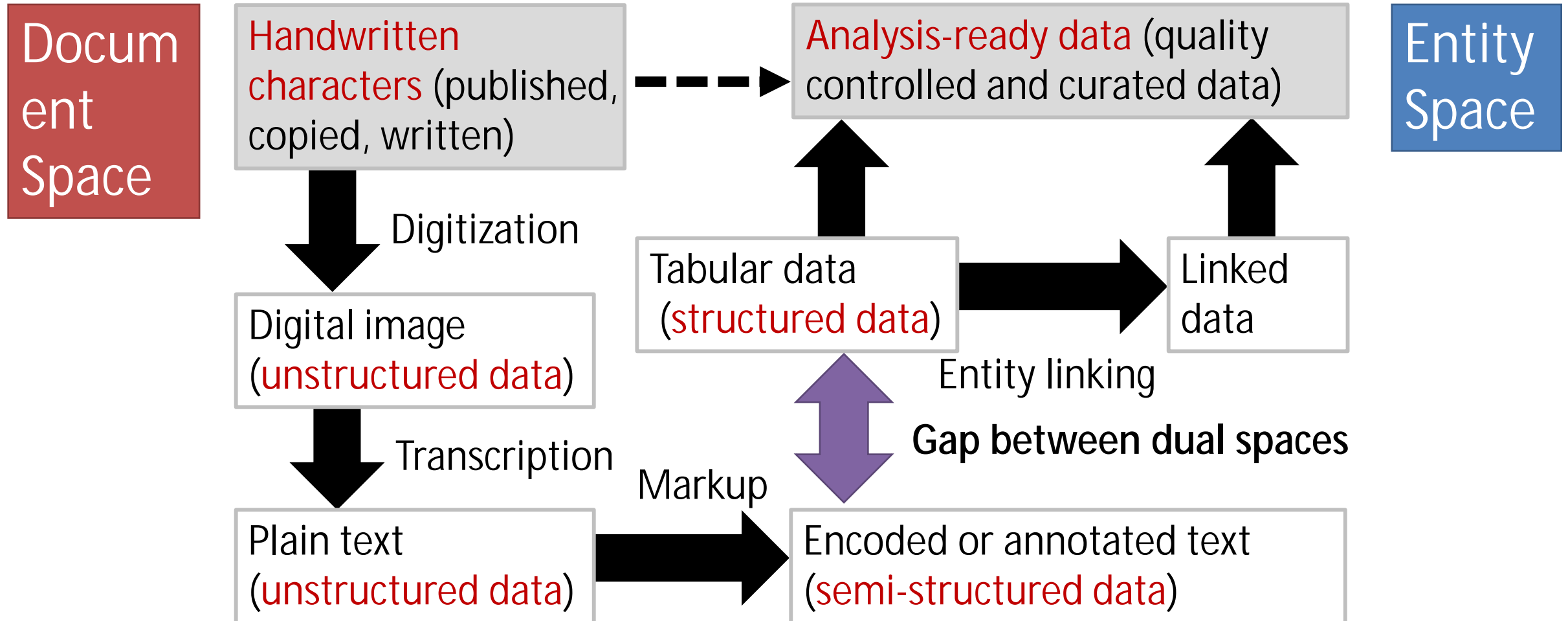
Collaborator: Chikahiko Suzuki, Mika Ichino (CODH)

Historical Big Data (HBD)

<http://codh.rois.ac.jp/historical-big-data/>



Data Structuring Workflow



Edo Maps Beta

<http://codh.rois.ac.jp/edo-maps/>

番号	分類	現代語訳	翻刻	地図
2-001	施設	幸橋御門	幸橋御門	拡大図
2-002	施設	山下御門	山下御門	拡大図
2-003	施設	数寄屋橋御門	数寄屋橋御門	拡大図
2-004	施設	鍛冶橋御門	鍛冶橋御門	拡大図
2-005	施設	呉服橋御門	呉服橋御門	拡大図
2-006	地名	一石橋	一石橋	拡大図
2-007	地名	出橋	出橋	拡大図
2-008	町名	丸屋町	丸屋丁	拡大図

[2-296]
地名：磯辺大神宮（イソベ大神宮）
分類：寺社仏閣

From **29** sheets,
8719 place
names were
extracted.



千代田区

© 2020 ZENRIN

ACM Multimedia Asia 2022

Google Earth

2022/12/15

1997

35° 40'52.26" N 139° 45'26.42" E 標高 200 m

GeoLOD

<https://geolod.ex.nii.ac.jp/>



1. **GeoLOD ID** is an identifier designed for toponyms.
2. Each identifier has **metadata** to describe relevant information.
3. **Georeferencing** converts IIF canvas coordinate to (lat, lng) metadata.



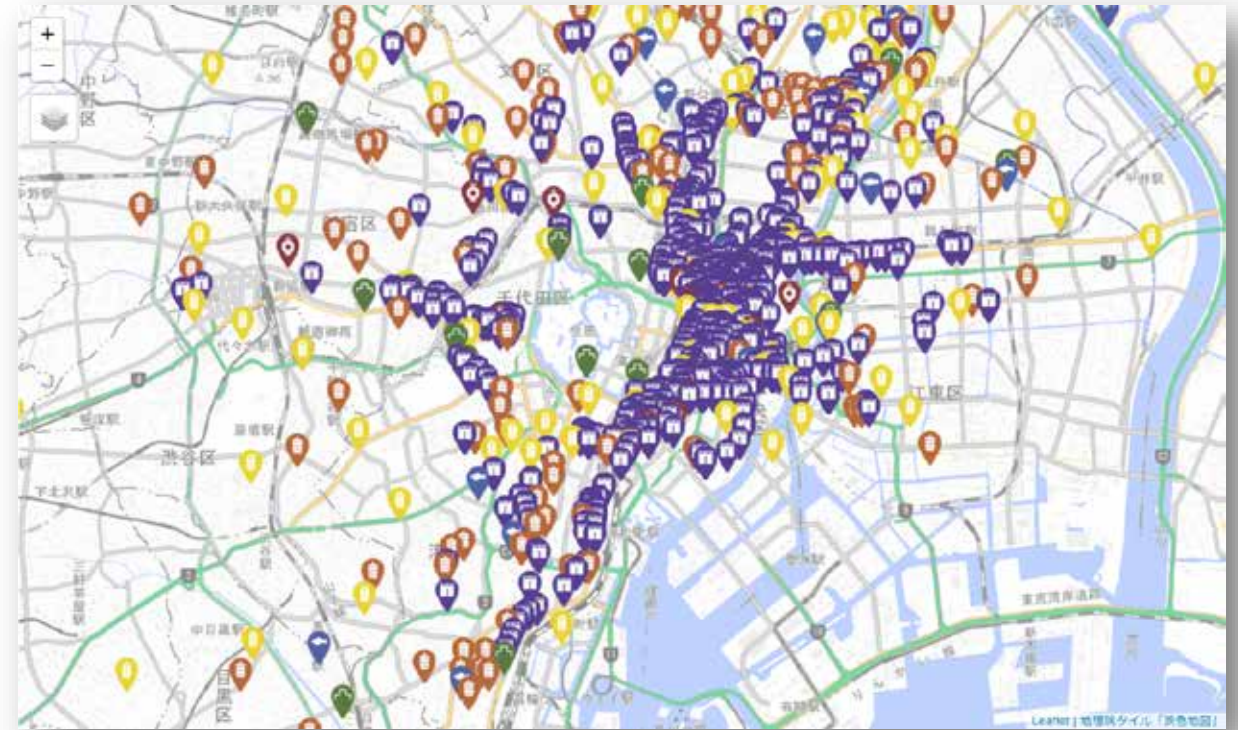
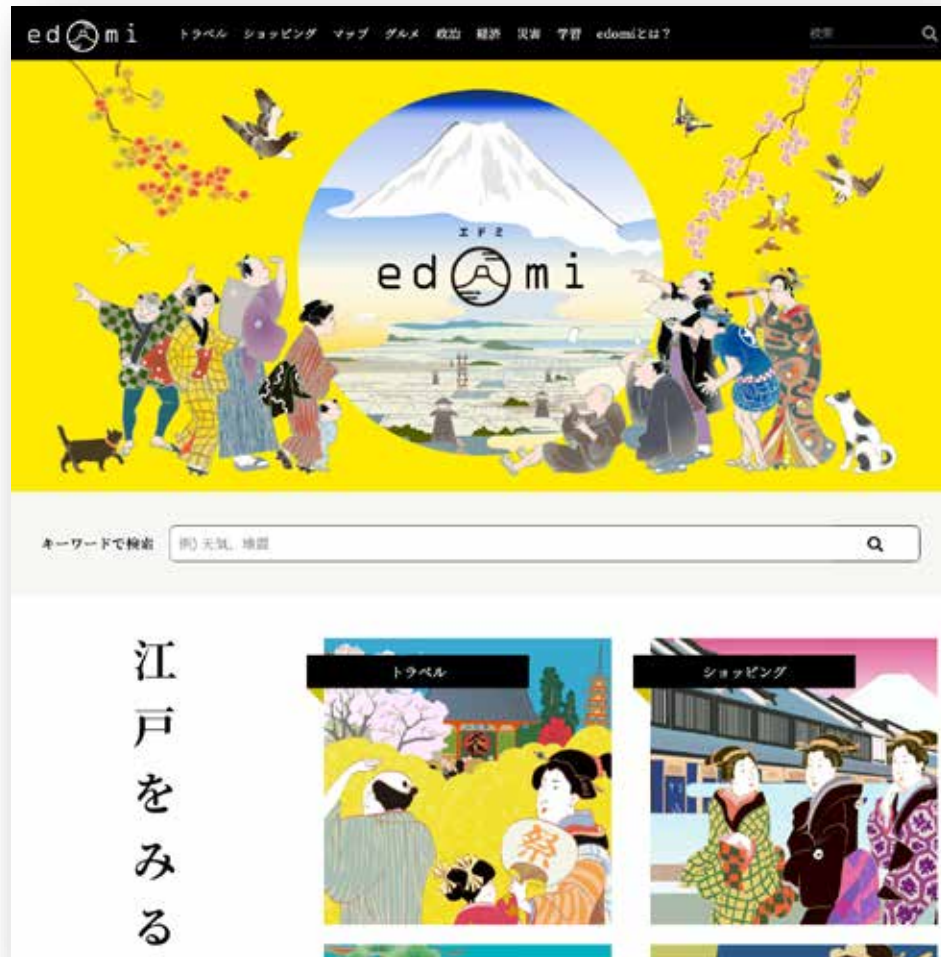
Curations are converted to the gazetteer format for GeoLOD.

Name: Isobe Shrine
GeoLOD ID: G8AYsq
Lat: 35.676326
Lng: 139.774755

<https://geolod.ex.nii.ac.jp/resource/G8AYsq>

edomi – Data Portal for the Historical Edo

<http://codh.rois.ac.jp/edomi/>



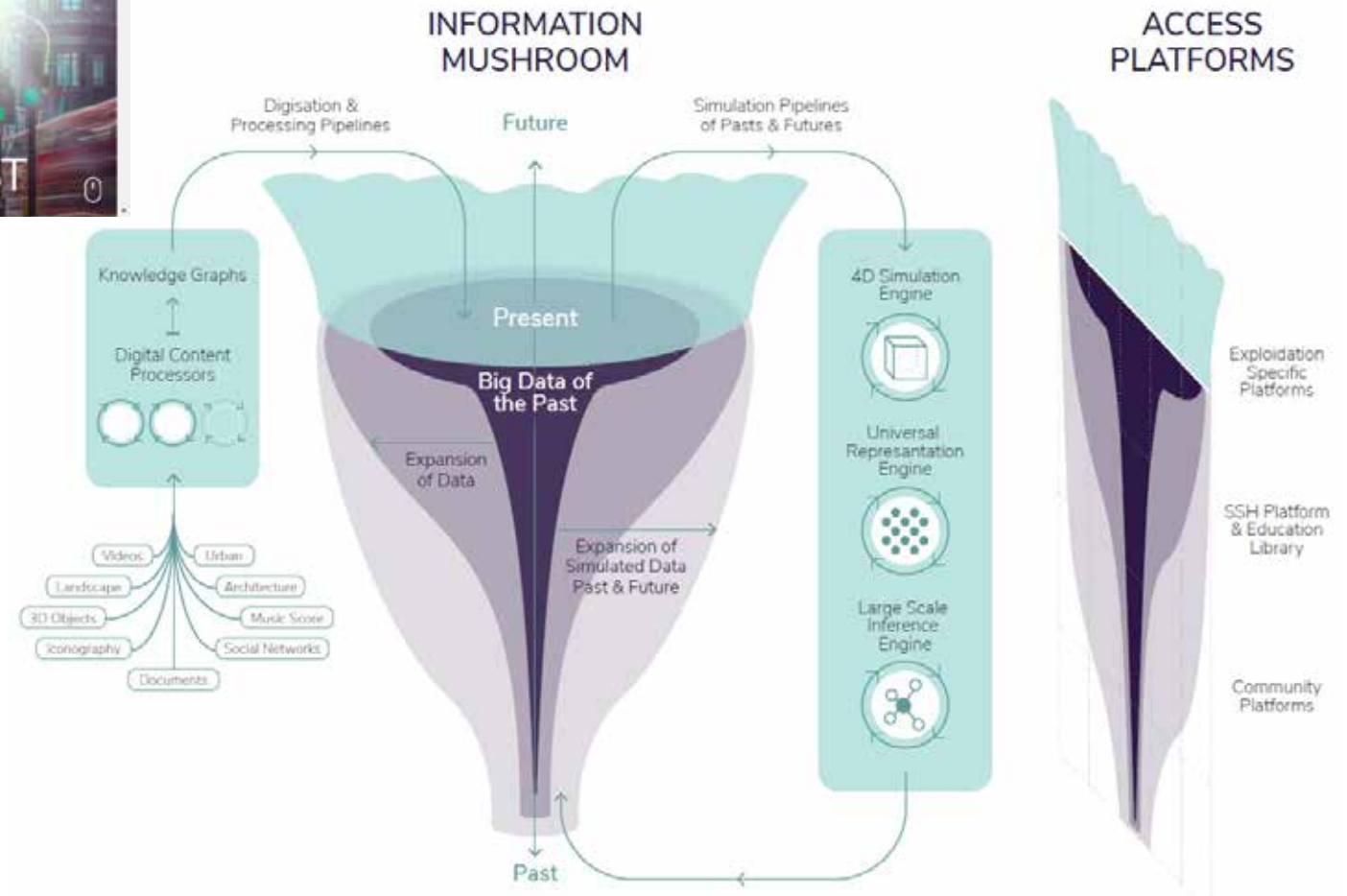
The distribution of geographic features (e.g. sightseeing spots and commercial stores) in the city of Edo.



Time Machine Europe

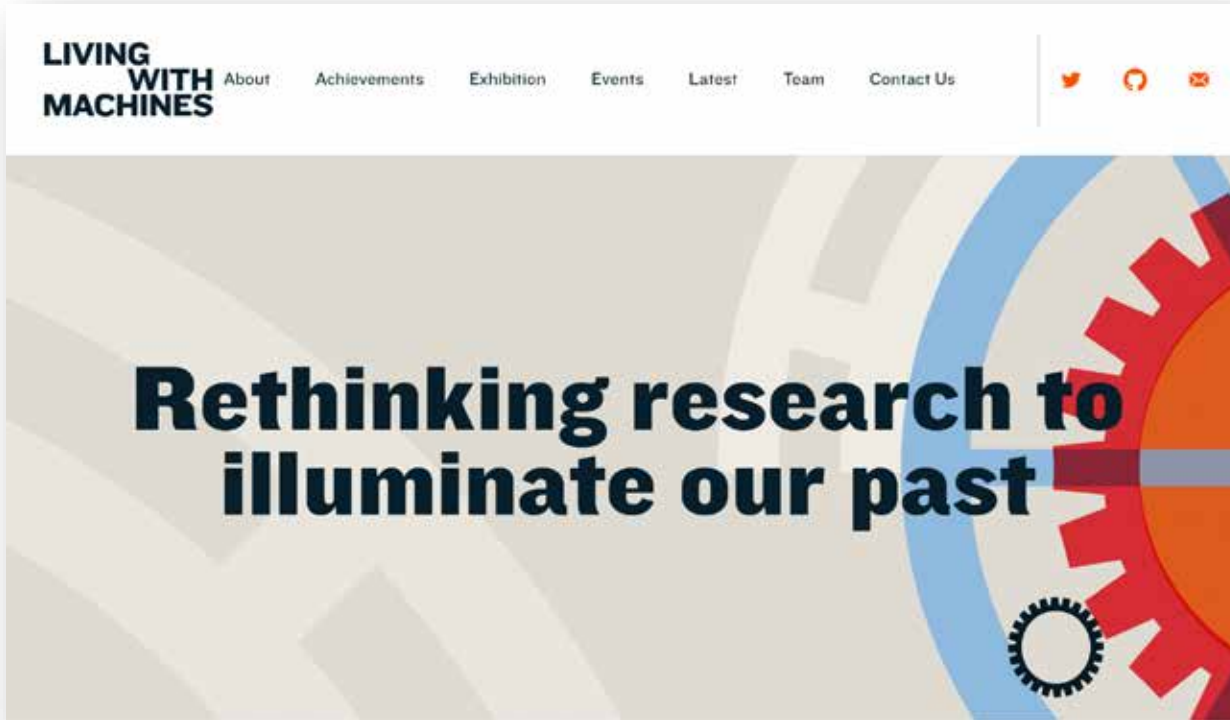
<https://timemachine.eu/>

1. **Big Data of the Past:** create machine-readable data of the past using **AI and simulation**.
2. Developing new critical reflections on **the past and future**.



Living with Machines

<https://livingwithmachines.ac.uk/>



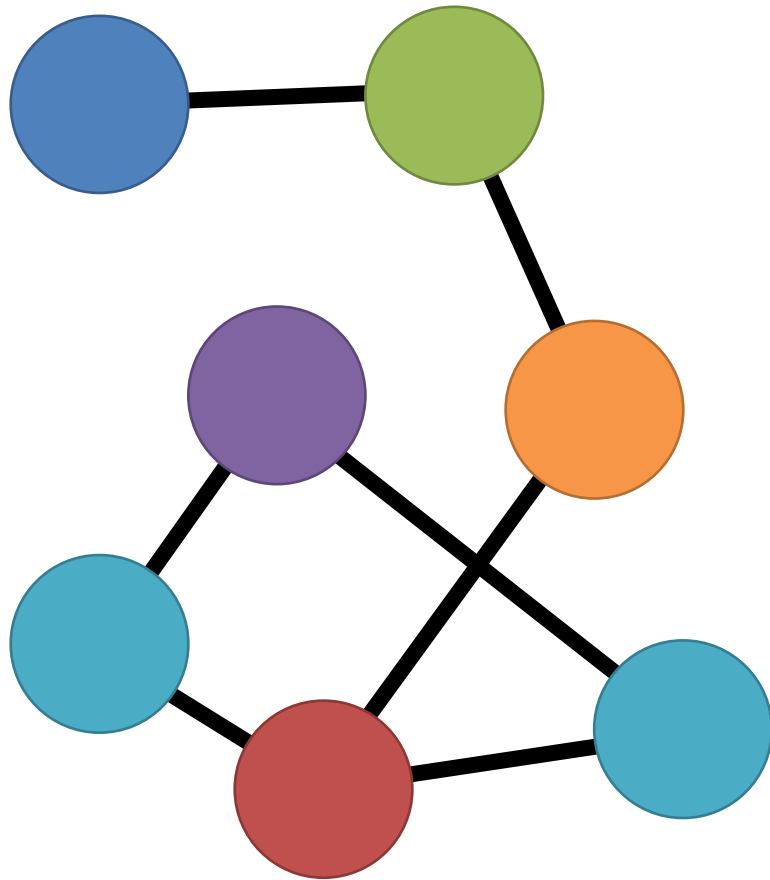
1. A research project that rethinks **the impact of technology** on the lives of ordinary people during the **Industrial Revolution**.
2. Using AI, a vast amount of digitized materials is **analyzed at scale**.
3. Researchers from different disciplines **work together**.

Impact on the Humanities Research

1. Historical big data (or big data of the past) will be the major topic in digital humanities, along with the launch of several large scale projects for each area.
2. Data structuring from unstructured data to analysis-ready data with entity linking is a big challenge, but machine learning can help with some level of automation.
3. Big data has potential to uncover hidden facts of our culture, history and society of the past, based on a reconstructed model from fragmented data.

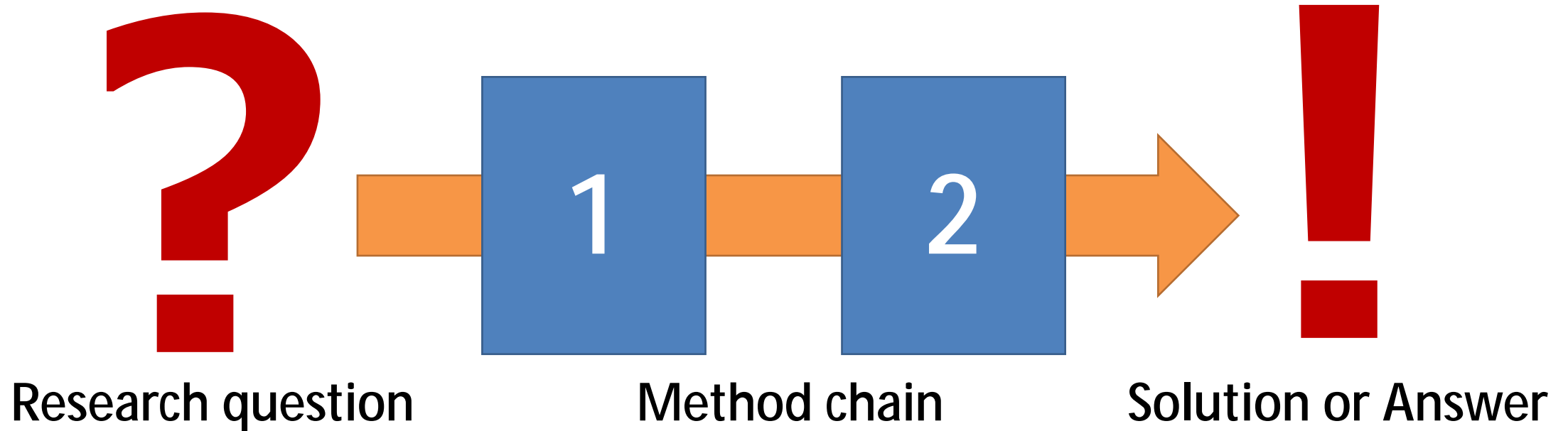
Connecting the Dots

Connecting the Dots



1. Digital humanities is about **reconstructing human's collective knowledge** from fragmented data.
2. A small discovery is a “dot,” but connecting them leads to a bigger picture of our culture.
3. For each connection, we need to represent various knowledge using different workflows.

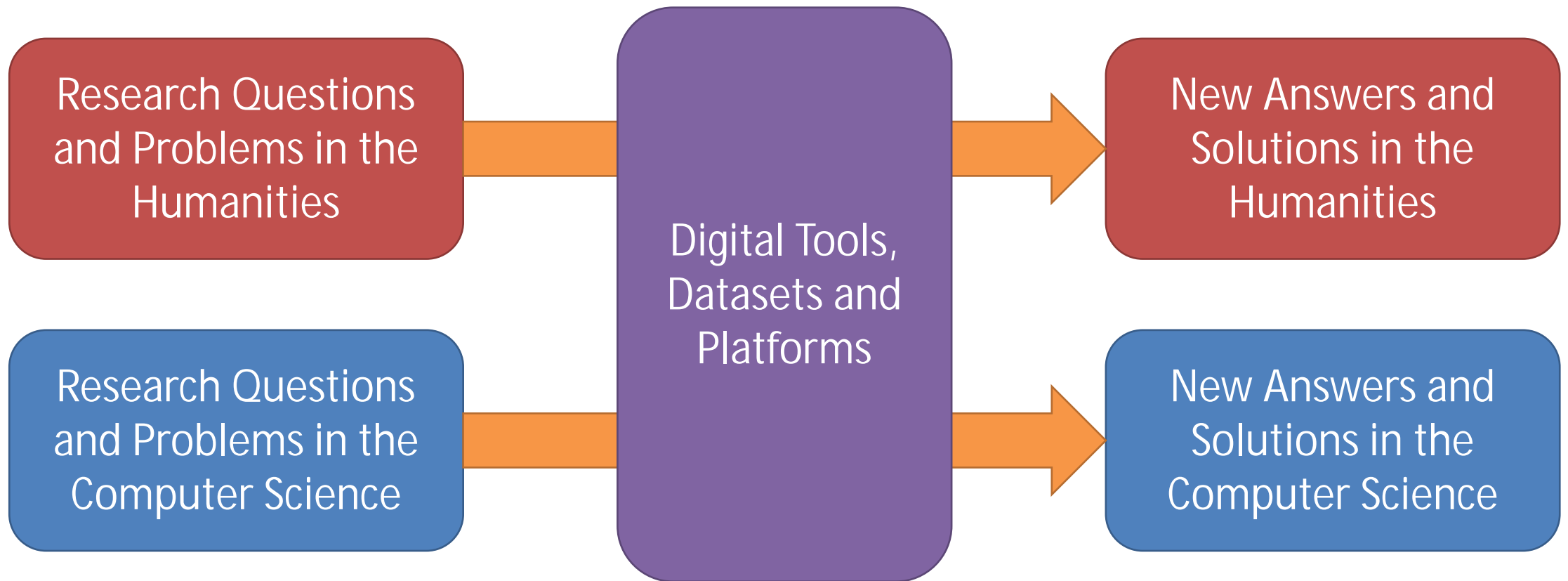
End-to-End Workflow



From a research question to a solution or an answer, we design an end-to-end workflow. **Scalable technology such as AI and collective intelligence** may accelerate some steps.

Research Questions and Answers

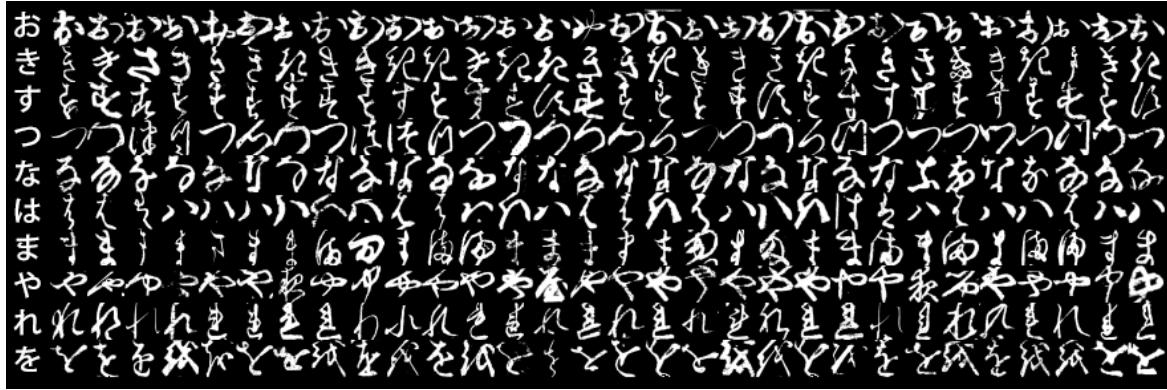
Questions and answers are different, but tools and datasets may be shared.



Solution in Search of a Problem

1. Typical claim: **I have an algorithm that could potentially solve hundreds of problems!** (but it's future work)
2. Reality: the problem may be imaginary, or the algorithm is not so useful to solve any real problems.
3. In digital humanities, we start from real problems, and need a workflow to solve it, or get things done.
4. The situation is similar in "**digital X**" or "**X-informatics**", where we work with domain experts having real problems.

Beyond the Gold Standard



Kuzushiji MNIST, <http://codh.rois.ac.jp/kmnist/>



KaoKore Dataset, <http://codh.rois.ac.jp/face/dataset/>

1. We want to work on **unseen data available to answer research questions.**
2. **Bias in dataset sampling** fluctuates the ranking, so minor improvement on the metric has little impact.
3. Focus on **what to know**, rather than **how to know**, and explore the culture!

Project Summary

1. **AI kuzushiji recognition** illustrates how a **machine learning project** can be started and developed into the real world.
2. **Bukan Complete Collection** shows how the idea of **differential reading** can reduce the burden of humans.
3. **Kaokore** demonstrates how **interoperability such as IIIF** plays a critical role in a digital humanities platform.
4. **Historical big data** explores new possibilities for **linking the past, present and future**.

Acknowledgments and More Information



I thank many collaborators of our projects, especially the present and former CODH researchers, Chikahiko Suzuki, Mika Ichino, and Tarin Clanuwat. I also thank National Institute of Japanese Literature for releasing a massive amount of precious pre-modern Japanese materials as open data.



Visit our Website

<http://codh.rois.ac.jp/>