



## Learning and Evidence Analytics Framework (LEAF) Design and Large -scale Implementation of LA driven infrastructure

Prof. Hiroaki Ogata

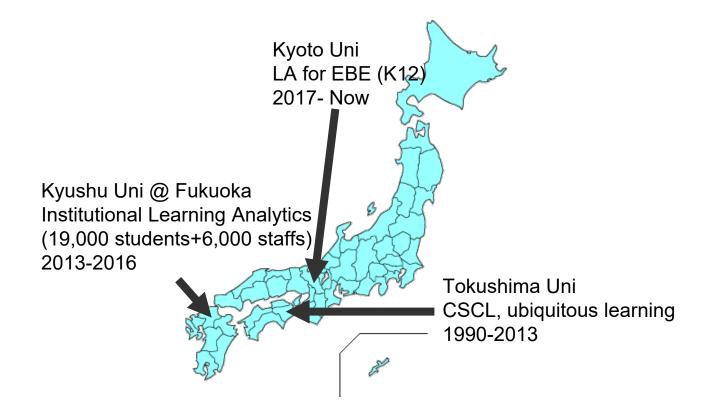


Kyoto University, Japan 24-25 August, 2021



Learning and Educational Technologies Research Unit

### My mobile learning journey in Japan

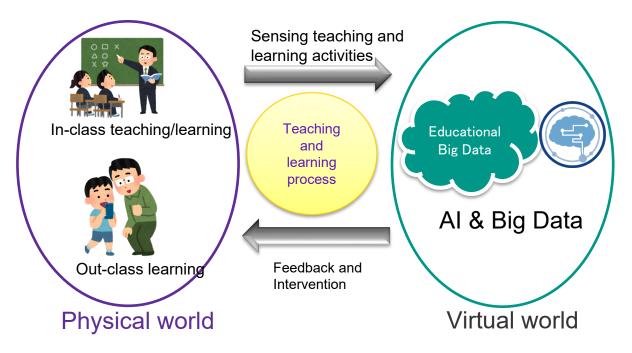


# Question: How do you know how the students are learning during the classroom?

Question: How do you know how the students are learning outside the classroom? Learning analytics can provide a tool to enable you to know how the students are learning inside and outside classroom.

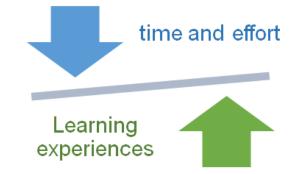
## What is learning analytics?

To improve teaching and learning processes through insights from the data collected in ubiquitous (both physical and virtual) learning environments.

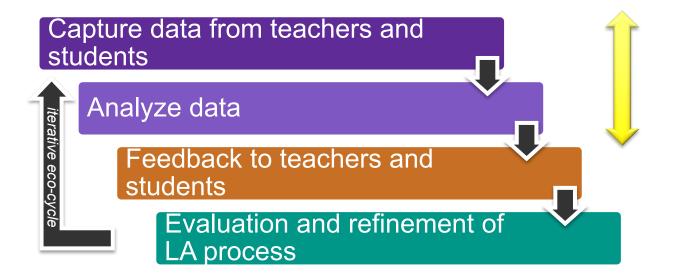


# **Objective of our learning analytics project**

- 1. Maximize learner's learning performances
- 2. Minimize teacher's time and efforts



## **Steps of Learning Analytics**



# Question: What kind of educational data do you have for your classroom?

# How do you use the educational data for your classroom?

## **Types of Educational Data (Edu-data)**

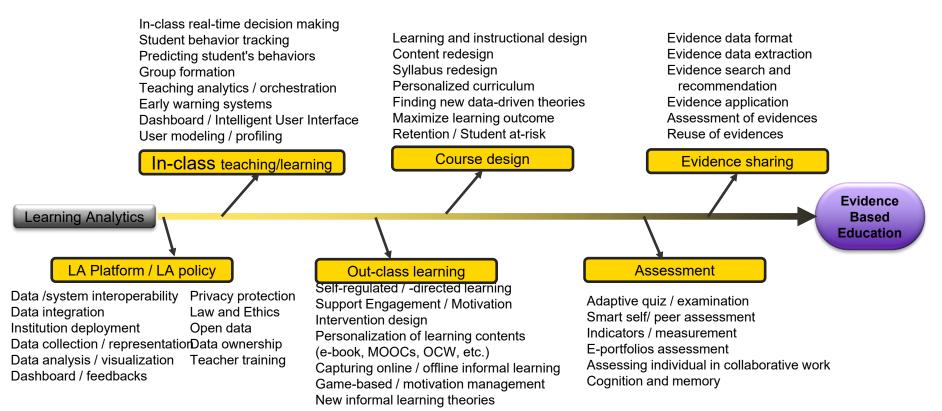
Types of Edu-data	Examples
Course data	Course name, syllabus, student enrollment
Textbook data	Textbook, slides, workbooks, web pages
Person data	Teacher, students, teaching assistance
Score data	Final score, quiz results, assignment score
Process data	LMS, e-book, video lecture, e-portfolio, CBT
Environmental data	Classroom video, temperature, humidity
Physiological data	Pulse, steps, gaze, electroencephalograph

Recording the learning and teaching process is important!

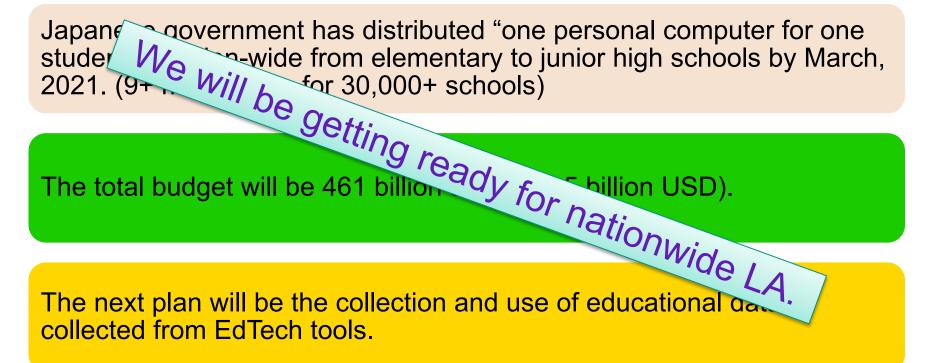
### How to use educational data?

Level	For whom	Examples					
Individual	Student	<ul> <li>Provide Personalized learning materials and quizzes</li> <li>Promote students success</li> </ul>					
	Teacher	<ul> <li>Support improving a course design and learning materials</li> <li>Reduce teacher's workload, e.g., automatic feedback to students</li> </ul>					
	Parents	Increase awareness of their children's learning progress					
Institution	Management	Optimize the curriculums to enhance the quality of education programs • Increase the accountability of stakeholders					
Country and region	Policy- makers	Create and evaluate the policy based on evidence					
	Researchers	<ul> <li>Find new evidences by using educational big data</li> </ul>					
	Citizens	$\cdot$ Share the issue and solutions based on educational big data					

#### From Learning Analytics to Evidence-based Education



## GIGA school project in Japan (2020-21)



## **Educational institutions in Japan**

	Total	National	Public	Private
Elementary	19,892	70	19,591	231
Junior high	10,270	71	9,452	778
High	4,897	15	3,559	1,323
University	782	86	93	603
Total	35,841	242	32,695	2,935

MEXT (May, 2018)

## Japanese education system

#### K-12:

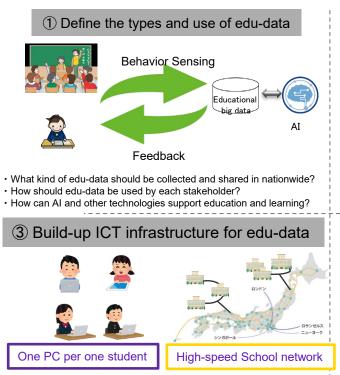
Common curriculum designed by MEXT (Ministry of Education, Culture, Sports, Science and Technology) Textbooks provided by MEXT free of charge Teacher-centered classroom

#### **University (Higher education):**

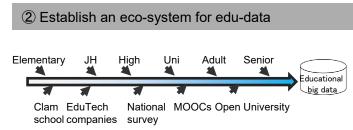
The entrance exam is very difficult, but the graduation is not. The tuition is \$5,000/yr for public university and \$10,000/yr for private university and is paid by the parents in most cases.



Educational data (edu-data) subcommittee for nation-wide data collection and use



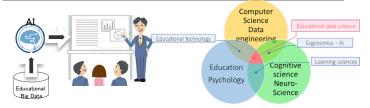
- · How should one PC per one student be implemented nation-wide?
- · How should the school network be keep secured and useful?



· What kind of the guidelines are necessary for edu-data management? · What kind of information systems should be implemented to collect personal learning and teaching data?

- The standard of data format and semantic meanings of edu-data is necessary.
- · What kind of organizations should be involved for this?

#### (4) Nurture stakeholders: teachers, students, parents and researchers...

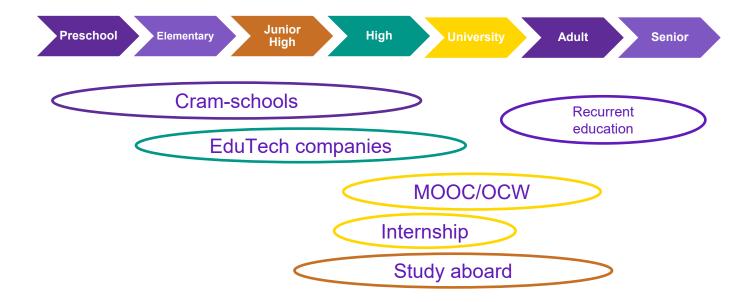


• What kind of ICT environment is necessary to collect and use edu-data? • How to nurture teachers and ICT-support staffs to improve teaching by using edu-data.

- + How to teach data-literacy for teachers, students, parents, etc.
- + How to nurture researchers to do research by using edu-data.

## **Our Research focus**

To record all the learning and teaching processes throughout lifetime and nationwide and to use the data for improving education.



# Technology -enhanced and Evidence -based Education and Learning (TEEL) platform

LMS (Moodle, Sakai) BookRoll (e-book reader) LAViEW (LA Dashboard)



Kyoto University's Learning and Educational Technology Research Unit

35 research members from 10 different countries.

We working on multiple projects related to large scale implementation and evaluation of learning analytics and AI enhanced learning systems.

Please check our projects in the following links https://www.let.media.kyoto-u.ac.jp/en/project/ https://eds.let.media.kyoto-u.ac.jp/?page\_id=1228&lang=en

In this presentation we shall discuss the following

- Learning and its analytics in Japanese context.
- Learning and Evidence Analytics Framework (LEAF) components and its usage.
- Open discussion.

## **Our current research projects**



①JSPS Research Grant (S),

Development of Infrastructure for learning analytics and educational big data, (2016.5 - 2021.3) 2,000,000 USD



②Special Innovation Program (SIP) on AI & Big Data from the Cabinet Office of Japan, Evidence-based Tailor-made Education, (2018.11 - 2023.3), 10,000,000 USD

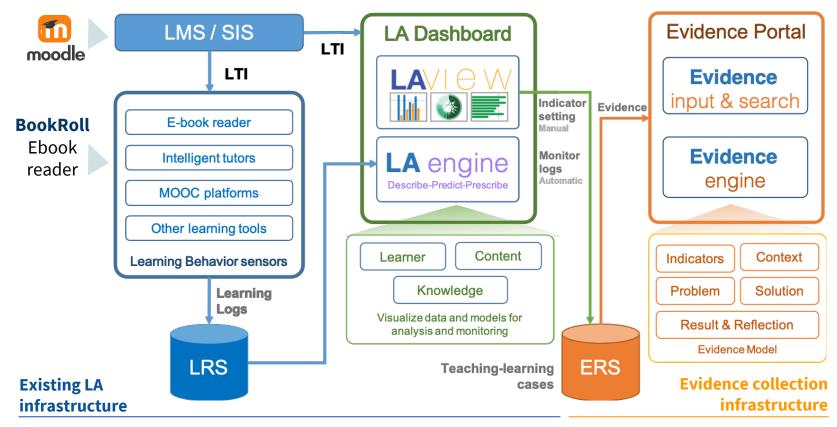


③ Innovative Education Pilot Studies from Ministry of Education
 Group Learning Analytics in Kyoto City
 (2019.9 – 2022.3) 300,000 USD



(4)NEDO, EXAIT: Research and development of Educational Explainable AI Tools by co-evolution of learner's self-explanation and AI generated explanation (2020.7-2025.3) 5,000,000 USD

#### Learning Evidence Analytics framework



Ogata H., et al., Beyond Learning Analytics: Framework for Technology-Enhanced Evidence-Based Education and Learning, ICCE2018, pp.486-489, 2018.

## **User-Centric LA platform**

#### Easy to start LA

• Teachers and students can use the current LMS to start LA.

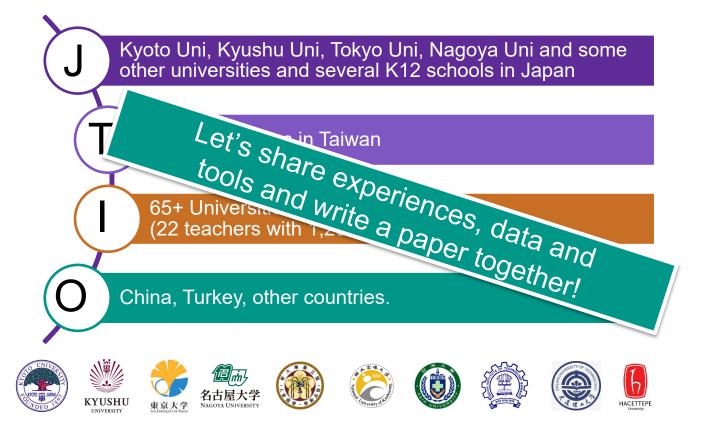
#### Easy to use data for LA

• Researchers can easily use anonymized data for research.

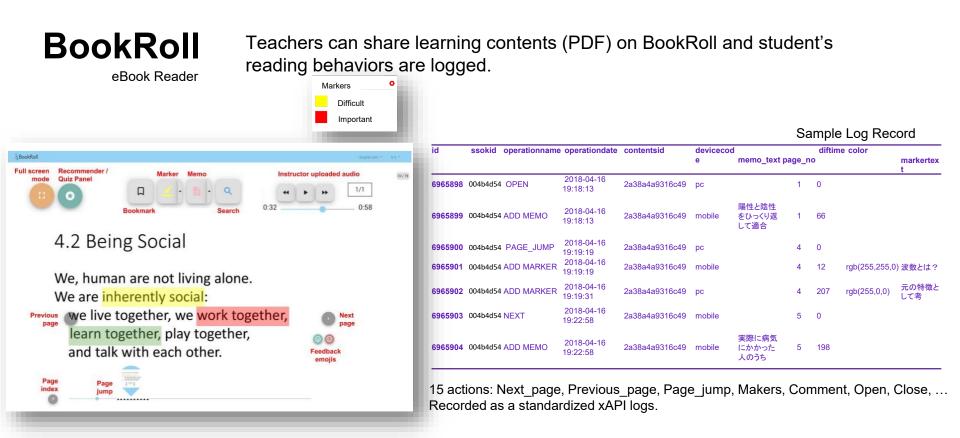
#### Easy to plug in tools for LA

• Teachers and researchers can add more learning behavior sensors into the current LMS and add more data-analysis tools into the dashboard.

## LEAF framework is used in



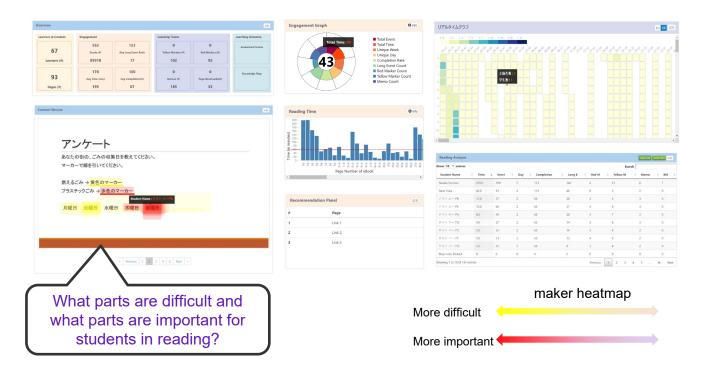
Rwitajit MAJUMDAR, Jayakrishnan WARRIEM, Hiroyuki KUROMIYA, Gökhan AKÇAPINAR, Brendan FLANAGAN & Hiroaki OGATA, Learning Evidence Analytics Framework (LEAF) in Practice: A2l2 based Teacher Adoption Approach, 27th International Conference on Computers in Education, Taiwan: Asia-Pacific Society for Computers in Education (ICCE2019), pp. 351-353, Kenting, Taiwan, 2019.12.2-6.



Hiroaki Ogata, Chengjiu Yin, Misato Oi, Fumiya Okubo, Atsushi Shimada, Kentaro Kojima and Masanori Yamada, E - Book - based Learning Analytics in University Education, Proc. of ICCE 2015, pp.401-406, 2015.

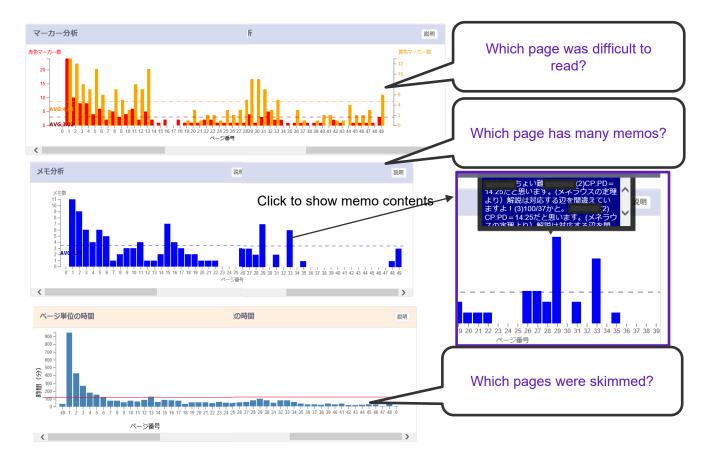


# Teaching and learning dashboard to trace learning activities



Rwitajit Majumdar, Arzu Akçapınar, Gökhan Akçapınar, Brendan Flanagan and Hiroaki Ogata, LAView: Learning Analytics Dashboard Towards Evidence-based Education, Companion Proceedings of the 9<sup>th</sup> International Conference on Learning Analytics and Knowledge, 2019

### Page-wise annotations and reading behaviors

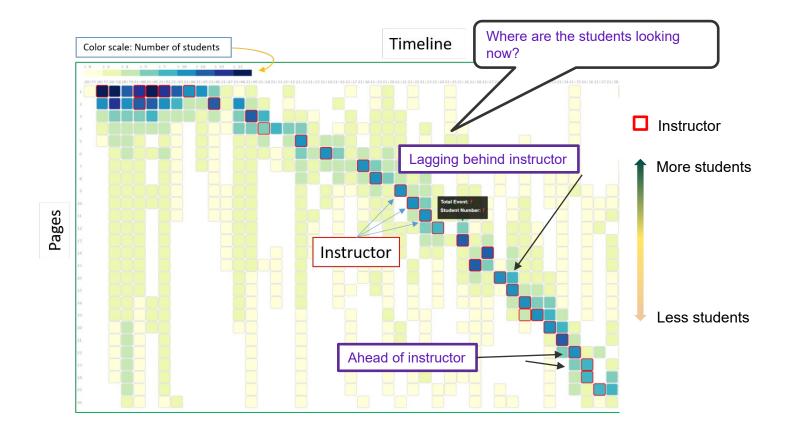


# Interventions can be sent by email

Reading Analysis				Did the	ney read all the pages you assigned? Deselect All Send Mail info			
how 10 🔻 entries					New Message			
Student Name	Time	<ul> <li>Event</li> </ul>	Day	Completion	Select Message Type			
	205.0	299	5	113	Reading Completion - Reading Time - Attendance - Reading Reminders -			
	40.0	93	4	113	Title			
	11.0	37	2	63				
	10.0	66	2	63	Message			
	6.0	40	2	63	Dear student The course has picked up pace and covered 'x' weeks of content 'y'			
	4.0	27	2	63	But I can see you are still lagging behind and you have not finished reading the content until the end.			
	3.0	33	2	63	Read the content before the next class such that it helps you to follow the class better. Please access BookRoll and read through all pages of the content. You			
	3.0	31	2	63	can use the yellow and red markers, memo, and bookmark features.			
テストユーザD	2.0	25	2	63	Wish you all the best			
Majumdar Rwitajit	0	0	0	0				
showing 1 to 10 of 131 e	ntries				Signature			

Close

### In-class real-time page transition



#### Prediction of the student's final score at the beginning of the course by using BR logs



Akçapınar, G., Hasnine, M. N., Majumdar, R., Flanagan, B., & Ogata, H. (2019). Developing an Early-Warning System for Spotting At-Risk Students by using eBook Interaction Logs. *Smart Learning Environments*, 6(4), 1-15. doi:doi.org/10.1186/s40561-019-0083-4

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# BOLL system – BlockChain for education

- 1. Connect educational data of learners across different systems.
- Decentralized, identity management, transfer, trace, anonymize, secure and verify records.
- 2. Enable access to learning resources and usage information across different systems.
- Access, transfer, and share learning materials with usage visualization.
- 3. Evaluate the usefulness and impact of connected lifelong learning on teaching in different systems.
- How students and teachers improve learning and teaching respectively using knowledge of lifelong learning.









Certificates

Scores & Grades

**Group Activities** 

Interactive usage

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#### **Connect learning logs across different systems**

- Manage different user ID's.
- Link the data in different systems to the same user.
- Ensure secure communication between these systems.
- Enable interpretability of connected data.

#### Verification and tamper-proof

- Enable verification of learning logs.
- Prevent falsification of certificates and learning logs.
- Ensure secure access to learning logs.

#### Access management and availability

- Provide a secure access to learning logs.
- Enable access grant and revocation at any time.
- Ensure learning logs and associated permissions are always available.

#### Analytics and research

- Enable tracking of access to learning logs and usage of learning resources.
- Anonymize data for research across different systems.

Decentralized
Transferability
Traceability
High security
Verification
Full access control
P2P access
Fault-tolerant
Anonymize
31

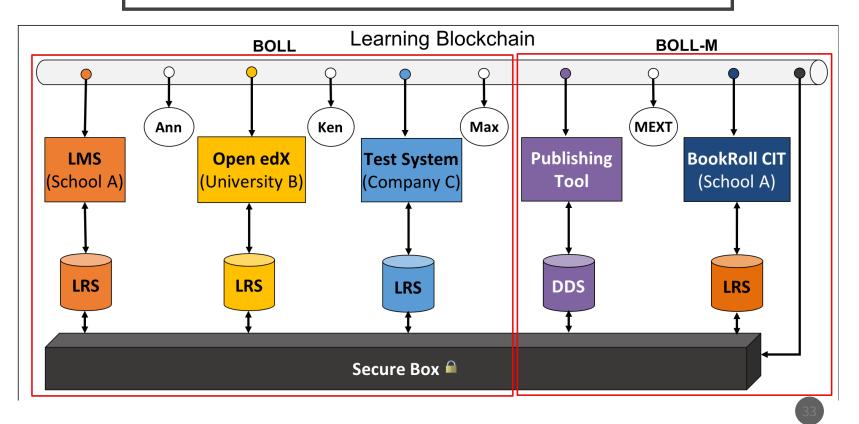
# **Our Originality**

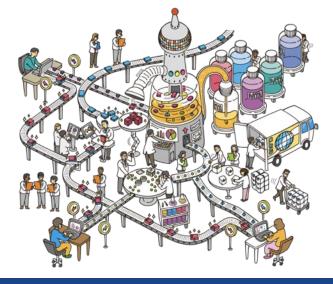
Aspect	Blockcert s	EduCT X	QualiChai n	IMS CLR	Proposed System
Share certificates or credits without alteration	0	0	0	0	Ο
Verification of academic credentials	X	0	0	0	Ο
Connect lifelong learning log across different systems	X	X	Х	Δ	Ο
Access learning resources in different systems	Х	Х	Х	Х	Ο
Anonymized lifelong learning logs for research	X	X	Х	Х	0

Patrick Ocheja, Brendan Flanagan, Hiroshi Ueda, Hiroaki Ogata, Managing Lifelong Learning Records Through Blockchain, Research and Practice in Technology Enhanced Learning, 2019. Transferability

P2P

Proposed Solution to Problem #1 + #2 + #3







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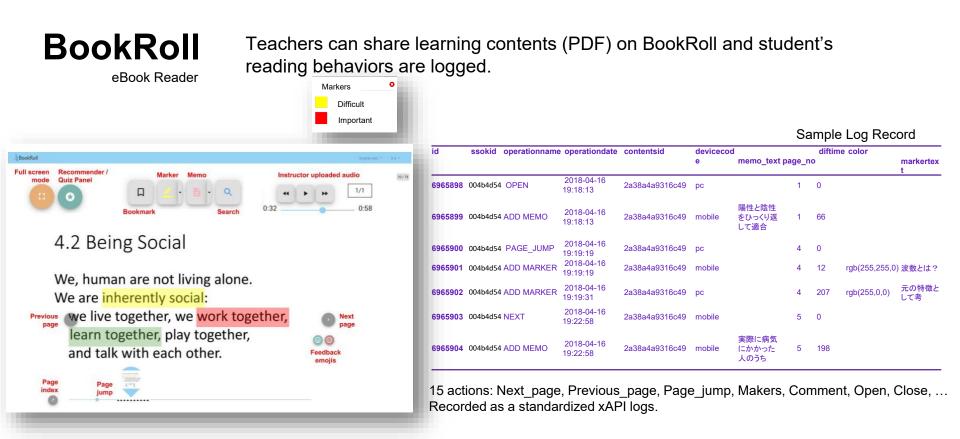
Prof. Hiroaki Ogata



Kyoto University, Japan 24-25 August, 2021



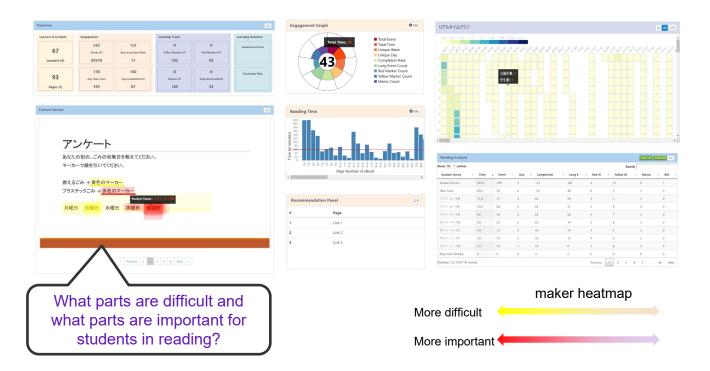
Learning and Educational Technologies Research Unit



Hiroaki Ogata, Chengjiu Yin, Misato Oi, Fumiya Okubo, Atsushi Shimada, Kentaro Kojima and Masanori Yamada, E - Book - based Learning Analytics in University Education, Proc. of ICCE 2015, pp.401-406, 2015.



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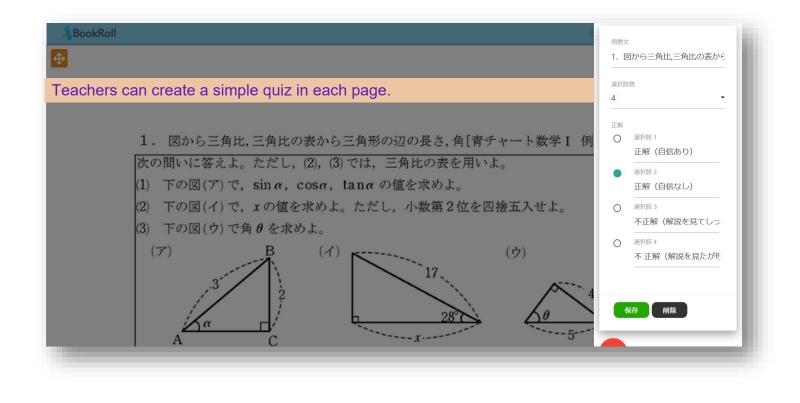


# How is BookRoll used in classroom?

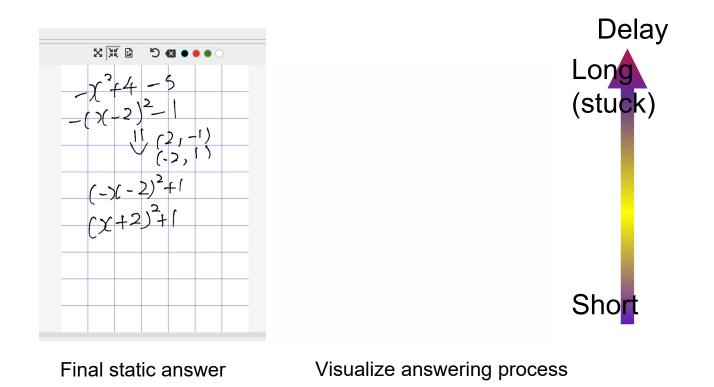
### • Learning Maths

- Finding stuck points from handwritten answer during problem solving
- Recommend quizzes from knowledge model
- Language learning (English)
  - Apply active reading strategies with e-book affordances
- Group learning activities
- Supporting self-directed learning
- Extracting evidences through the data and share them

## **Quiz in BookRoll**

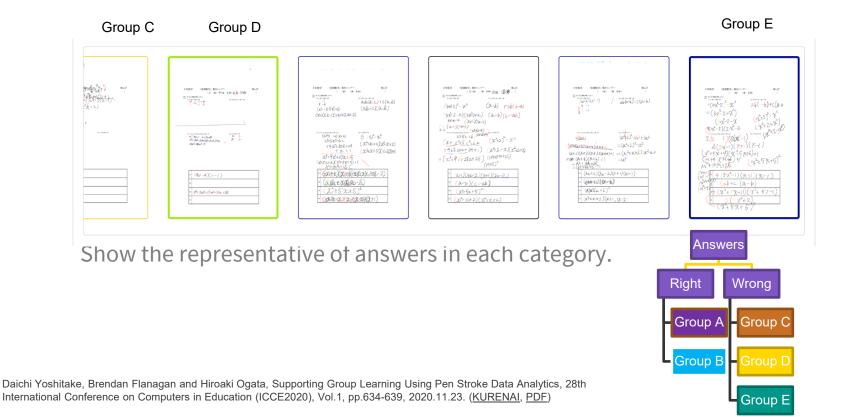


#### Stuck point analysis of hand written answers

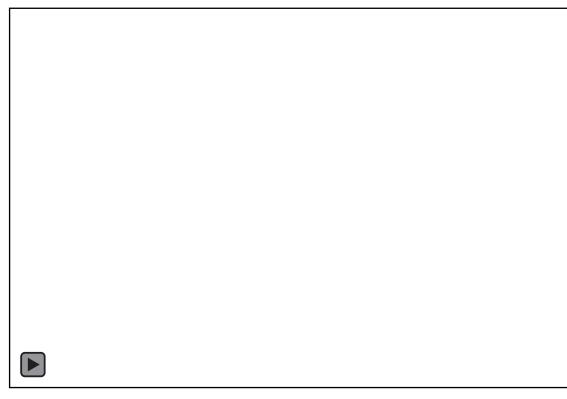


Daichi Yoshitake, Brendan Flanagan, Hiroaki Ogata, Educational Support Using Pen Stroke Data Analytics, 第30回教育学習支援情報システム(CLE)研究発表会, 神戸大学, 2020.3.8-10.

## **Clustering of stuck points from answers**

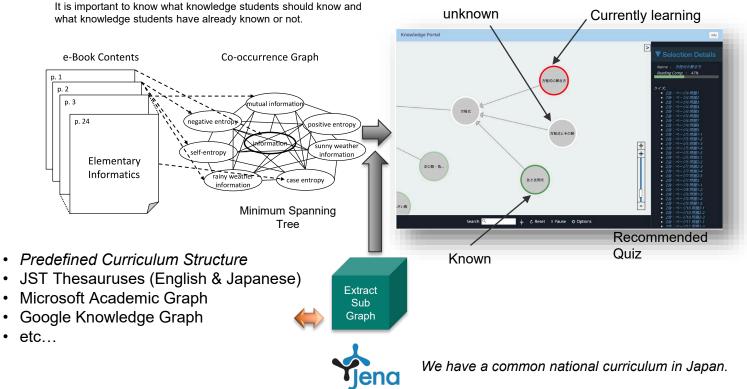


## Self explain Video

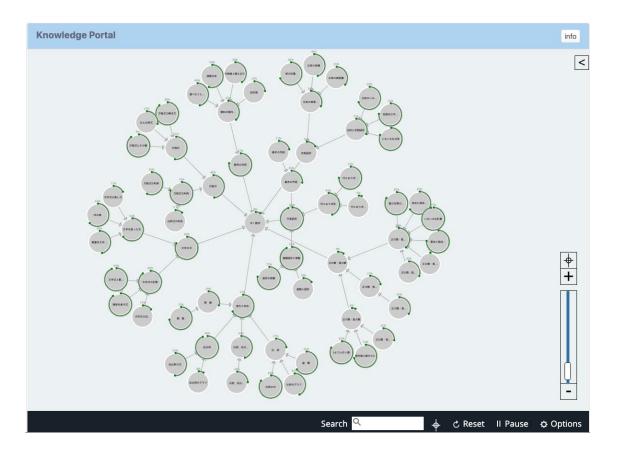


Daichi Yoshitake, Brendan Flanagan and Hiroaki Ogata, Supporting Group Learning Using Pen Stroke Data Analytics, 28th International Conference on Computers in Education (ICCE2020), Vol.1, pp.634-639, 2020.11.23. (KURENAI, PDF)

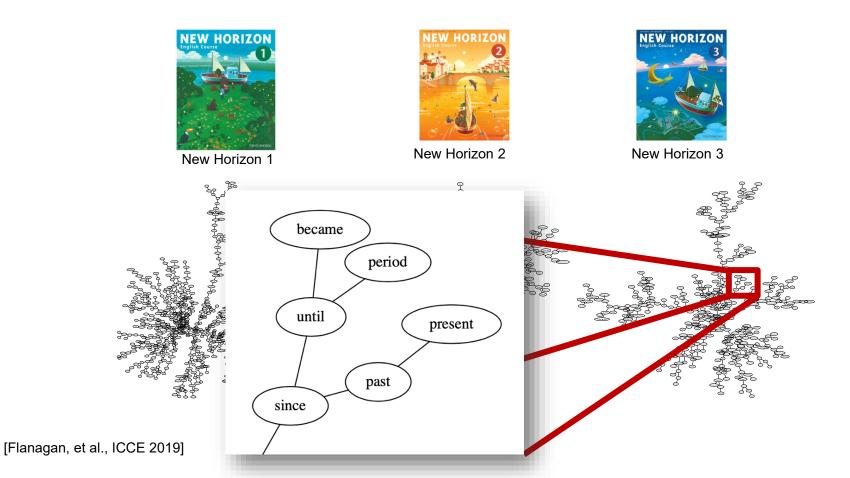
# Knowledge and student model for recommendation of text and quiz



### Student's comprehension level in Math course

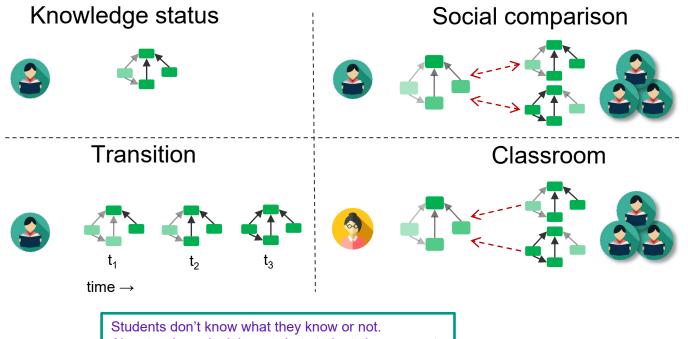


### Student's knowledge model in JH 1-3 English courses

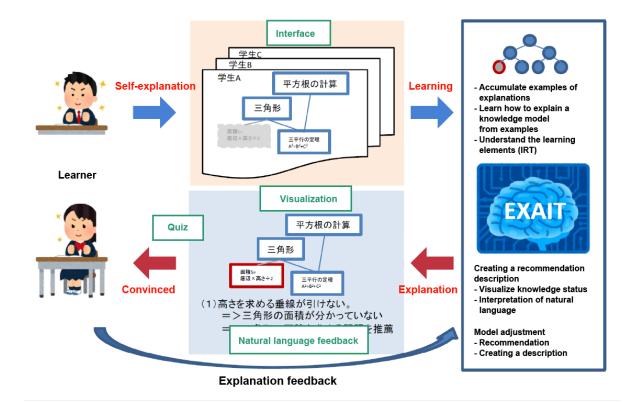


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## Use of knowledge and student model



# **Explanation of recommendation**

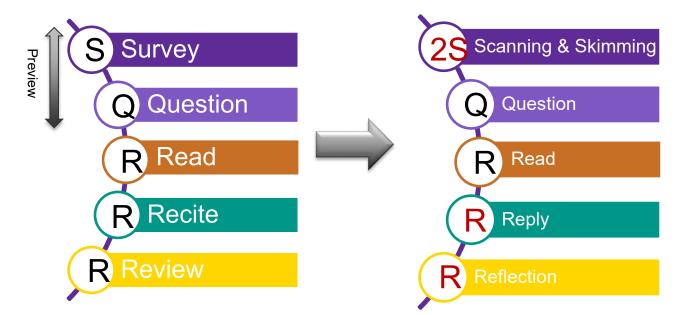


# How is BookRoll used in classroom?

- Learning Maths
  - Finding stuck points from handwritten answer during problem solving
  - Recommend quizzes from knowledge model
- Language learning (English)
  - Apply active reading strategies with e-book affordances
- Group learning activities
- Supporting self-directed learning

## Active reading strategy for e-Book

SQ3R active reading strategy for paper-book [Robinson, 1946] 2SQ3R active reading strategy for e-book [Chen&Ogata, ICCE2019]



Mei-Rong Alice CHEN, Hiroaki OGATA, Gwo-Jen HWANG, Gökhan AKÇAPINAR, Brendan FLANAGAN, Yi-hsuan LIN & Hsiao-Ling HSU, Impacts of a knowledge sharing-based e-book system on students' language learning performance and behaviors, 27th International Conference on Computers in Education, Taiwan: Asia-Pacific Society for Computers in Education (ICCE2019), pp.320-325, Kenting, Taiwan, 2019.12.2-6. (PDF)





Scan Red Z		look over for important topics such as name, date, and place, and highlight the keywords.	
Skim	Yellow 🖉	browse through, get an overview, and mark the keywords if don't understand.	
Question memo 🗒		raise questions, and bring attention to the main ideas and questions: who, what, where, when, why, or how.	
Read	BookRoll	read the contents and find the answer	
Reply	memo 🔳	answer to the questions	
Reflection memo		think deeply and carefully about the reading, and learn from the topics and the thoughts on the subject.	

### 2SQ3R in English course in High School

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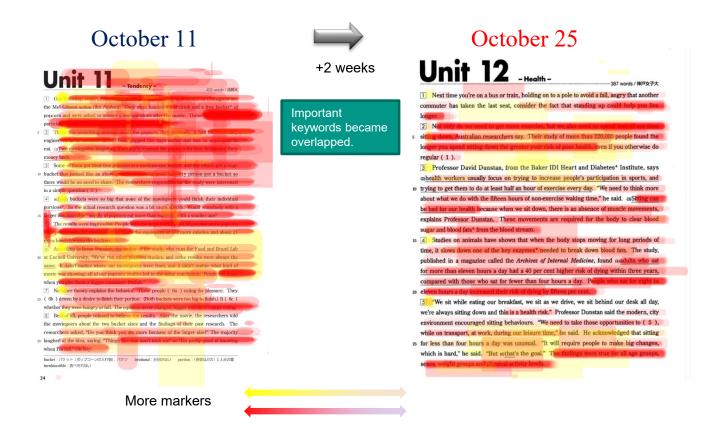




Mei-Rong Alice Chen, Rwitajit Majumdar, Gwo-Jen Hwang, Yihsuan Diana Lin, Hiroaki Ogata, Gökhan Akcapçnar and Brendan Flanagan, Improving EFL students' learning achievements and behaviors using a learning analytics-based e-book system, 28th International Conference on Computers in Education (ICCE2020), Vol.1, pp.474-483, 2020.11.23.

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### Markers in Scan + Skim process



## Questions from students

### October 11



+2 weeks

What does it mean?	What are the findings?		
	Who found the study?		
What does it mean?	Who has the highest risk of dying?		
何も知らない映画ファン	What is the findings?		
	What study is the reason for this?		
who	How many hours does sitting down affect our health?		
who	What does this mean?		
	What for example?		
	What is ;:::dbquotation:::;big change;:::dbquotation:::;?		
	Why does this happen?		
increased the number & quality of	Why standing could help you live longer?		
questions	What do we have to live longer?		
	What is able to be bad for our health?		
	What is caused increasing our health of dying?		



#### 2SQ3Rの効果

### ARSを活発に行った学生は、成績が高かった

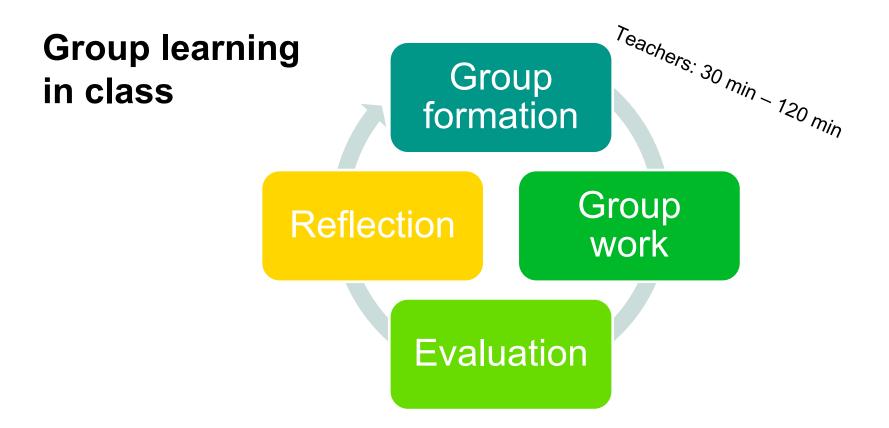
Learning achievement	Ν	М	S.D.	F	Post hoc tests
High-engagement (a)	10	90.70	2.50	39.58**	a > b
Moderate-engagement (b)	20	75.95	8.91		b > c
Low-engagement (c)	10	65.10	6.88		a > c

Note. \**p*<.001

Chen, A. et al., Improving EFL students' learning achievements and behaviors using a learning analytics-based e-book s, ICCE 2020, pp.1: 474

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## **Group formation**

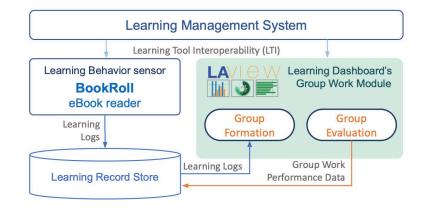
### Create the best group according to

- 1. Learner's current user model
- 2. Learner's engagement level of e-book
- 3. Learner's performance
- 4. Friendship among students



- 1. Has knowledge C
- 2. Active
- 3. Standard performance
- 1. Has knowledge A
- 2. Not active
- 3. Low performance
- 1. Has knowledge B
- 2. Very active
- 3. High performance

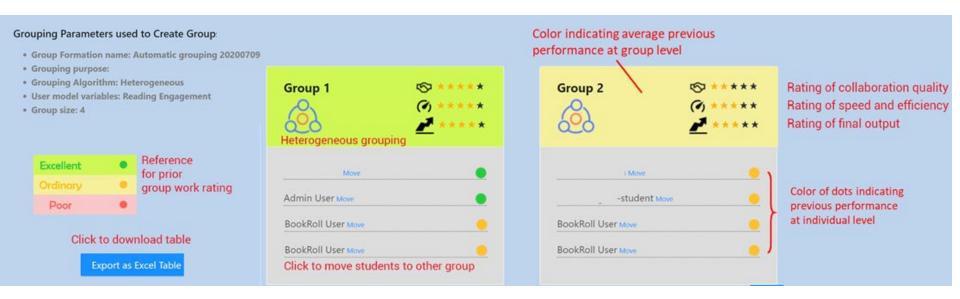
# Group formation utilizing learning logs



* Group Formation name:	Please input group formation name	Grouping purport	se: Brain Storming			V
* Grouping Algorithm:	Homogeneous Heterogeneous Jigsaw Random Select algorithm	Use active students or	lly: Off On	Filter inactive stu	dents	
* User model variables:	Reading Engagement × BookRoll quiz ×	Use data of all cour	se: Off On	Using parameters	s of other courses	
Course score:	Please select course score for jigsaw group formation.	Student ID	Name	Active	Prior group work	Action
		121	ユーザA テスト	Yes	N/A	Delete
Moodle quiz:	Please select Moodle quiz for jigsaw group formation.	404	student names	Yes	N/A data availability for prior group work	Delete
BookRoll quiz:	筆者の科学的なものの見方や考え方が読み取れた? × 皐月の暗誦はできているか? ×	405		Yes	N/A	Delete
		406		Yes	N/A delete students from	1 Delete
Group size:	3 students per group	407		Yes	N/A the list for grouping	Delete

Liang C., Majumdar R., & Ogata H. (2021) Learning Log-based Automatic Group Formation: System Design and Classroom Implementation Study, Research and Practice in Technology 58 Enhanced Learning. (in press)

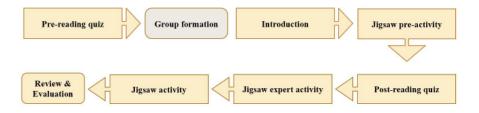
# Resulted groups formed by system and group work evaluation interface



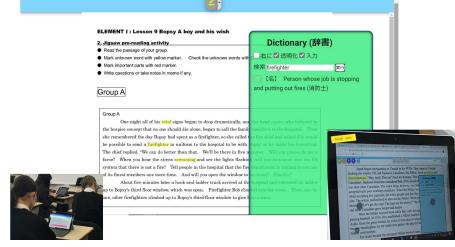
Changhao Liang, Ivica Botički & Hiroaki Ogata, Supporting Teachers in Group Work Formation and Analytics for In-class Group Activities, 27th International Conference on Computers in Education, Taiwan: Asia-Pacific Society for Computers in Education (ICCE2019), pp.744-749, Kenting, Taiwan, 2019.12.2-6

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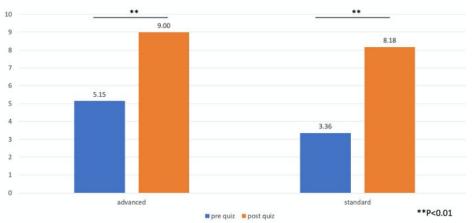
# In class jigsaw activity



Jigsaw+ Phase	Platform	SQ4R task
1. Content prediction	BookRoll using memo	Survey / (Question)
2. Jigsaw pre-activity	BookRoll using markers, DicoDico and memo	Read/Record
3. Jigsaw expert activity	BookRoll using memo	Read/Recite/Record
4. Jigsaw activity	BookRoll using memo	Read/Recite/Review
5. Review and Evaluation	In class listening activity	Review



Based on their previous academic records 62 participants were divided in two levels for their English class: standard (n=26) and advanced (n=36).



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Yuko Toyokawa, Rwitajit Majumdar, Hiroaki Ogata, Louis Lecailliez, Liang Changhao (2021) Technology Enhanced Jigsaw Activity Design for Active Reading in English, in ICALT 2021

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- Group learning activities
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# supERpowER

read more, read fast & understand better with GOAL oriented Extensive Reading!

ER + GOAL

Easy to practice + Easy to monitor = Easy to Aquire!

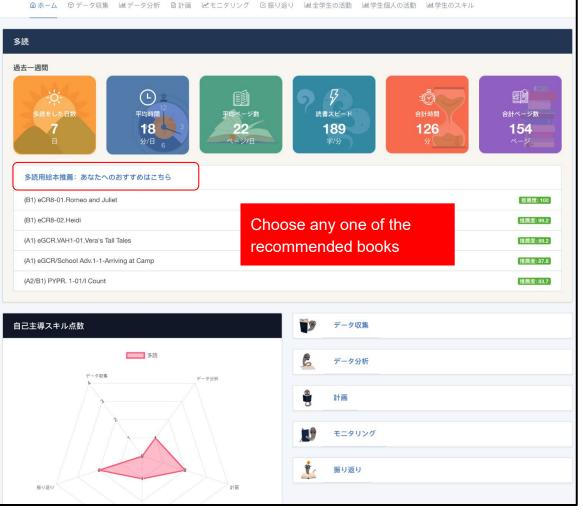
# Students have more than 500 books to choose from in BookRoll!

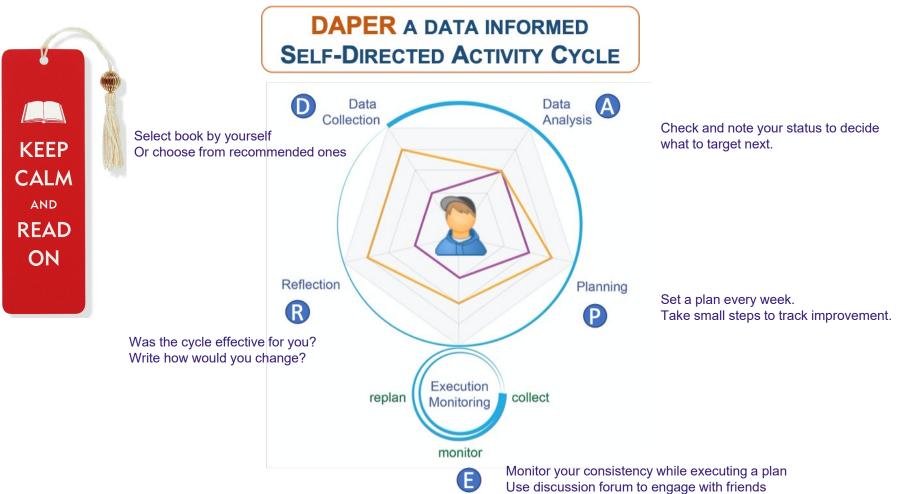
### Extensive Reading (ER) is to have fun while choosing and reading many stories while practicing English by your own!

□ 2020年度	
■ 2020年度IEC1[高1]	
□ 絵本	
Reading Level 1 Catalog - Start here!	
■ メニューAlienSeries!	
pre-A1	
pre-A1 (Aesop's Fables)	
A1-Lv1① (Start fun here!)	
□ A1-Lv1②	<ul> <li>Each folder has different levels of Books</li> </ul>
■ (A1) eGCR.VAH1-01.Vera's Tall Tales	
III (A1) eGCR.VAH1-02.Meet Luca	
III (A1) eGCR.VAH1-03.A Real Alien	
III (A1) eGCR.VAH1-04.Luca's Mission	
(A1) eGCR.VAH1-05.Getting Ready for the Worst	
(A1) eGCR.VAH1-06.All Is Safe	
■ A1-L/13	E
A1-Lv14	<ul> <li>Each book title also shows which level it is</li> </ul>
A1-Lv1(5)	
■ A1-Lv1⑥	
■ A1-Lv2①	
■ A1-Lv2②	
■ A1-Lv2③	
■ A1-Lv2④	
■ A1-Lv2⑤	
■ A1-Lv3①	
■ A1-Lv3②	
■ A1-Lv3③	
■ A1-Lv3④	
A1-Lv4	
A1-Lv5	
■ A1-LvS	
■ A1/A2-Lv4	
A1/A2/A2+/B1/B1+(Non-Fiction)	
A1/A2/A2+/B1+(Non-Fiction)	
■ A1+/A2+	
■ A2	
A2-Lv2	
A2-Lv3	
■ A2-Lv5	
■ A2-Lv6	
■ A2/B1-Lv1	
A2/B1-Lv2	
A2/B1-Lv3	
■ A2/B1-Lv4	
■ A2/B1-Lv5	
A2/B1-Lv6	
A2/B1-Lv7	
A2/B1 Oxford①	
■ A2/B1 Oxford②	6
■ B1-Lv8	
■ B1 Oxford①	

To make it easier to choose books a system recommends you to to top 5 books that you can read next!







# Extensive reading of picture books

#### **Extensive Reading**

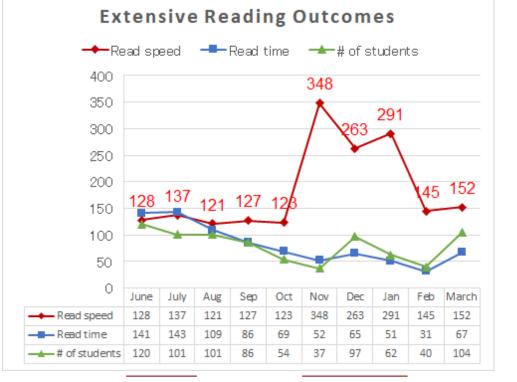
Duration: June 2020 - March 2021 Participants: 120 seven-graders

Total time read: 10.1 hours per student

Total books read: 38 books per student

Total words read: 60,730 per student

Read speed : 118 wpm per student 128 wpm → 152 wpm (18.75% UP)



GOAL study 1

GOAL study 2

Li H., Majumdar R., Chen M.R.A. and Ogata H, Goal-Oriented Active Learning (GOAL) System to Promote Reading Engagement, Self-Directed Learning Behavior, and Motivation in Extensive Reading, Computers and Education (impact factor 5.296), 2021.5.(in press)

	Contents lists available at ScienceDirect Computers
201	Computers & Education
ELSEVIER	journal homepage: www.elsevier.com/locate/compedu
Goal-oriented active	learning (GOAL) system to promote reading
engagement, self-dir	ected learning behavior, and motivation in
extensive reading	
Huiyong Li <sup>a</sup> , Rwitajit Maj	umdar <sup>b,*</sup> , Mei-Rong Alice Chen <sup>°</sup> , Hiroaki Ogata <sup>b</sup>
Graduate School of Informatics, Kyoto Univ	ercity Voshida-Honmachi Salva-ku Kvata Janan
Academic Center for Computing and Media Graduate Institute of Digital Learning and Ed	ong), comma treamain conformation (an Kyrono superator) Malifer, Kyron University, Yohida Mohamus, Sakyo-ku, Kyroto, Japan Lucation, National Taiwan University of Science and Technology, 43, Sec.A, Keelung Bd., Taipel, 106,
Academic Center for Computing and Media	Studies, Kyoto University, Yoshida-Nihonmatsu, Sakyo-ku, Kyoto, Japan

The rapid advancement of information and automation technologies not only changes how learners select knowledge resources but also increases their opportunities for learning in both formal and informal education (Fahnoe & Mishra, 2013). In such a rapidly changing landscape of learning technologies, self-directed learning (SDL) is becoming increasingly important in the 21st century and necessitates a shift in the educational models from a teacher-directed to a more student centered pedagogy (ToL & Kirschner, 2020). DDL (Brockett & Hiemstra, 2018; Runwles, 1975) is defined as a learning process including planning, setting zonla, selecting and

# **Collecting evidence**

- Learning Maths
  - Finding stuck points from handwritten answer during problem solving
  - Recommend quizzes from knowledge model
- Language learning (English)
  - Apply active reading strategies with e-book affordances
- Group learning activities
- Supporting self-directed learning
- Collecting Evidence

## Enabling an evidence based educational ecosystem

An evidence is a fact that is scientifically proved with data.

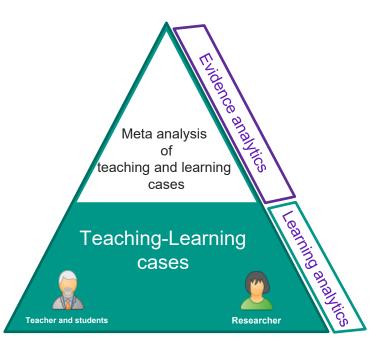
Possible evidence types

Micro (personal) level	Results of the feedback for individual student.
Meso (course, institutional) level	Results of changing a course design or a curriculum
Macro (regional, national) level	Results of changing a regional /national education policy

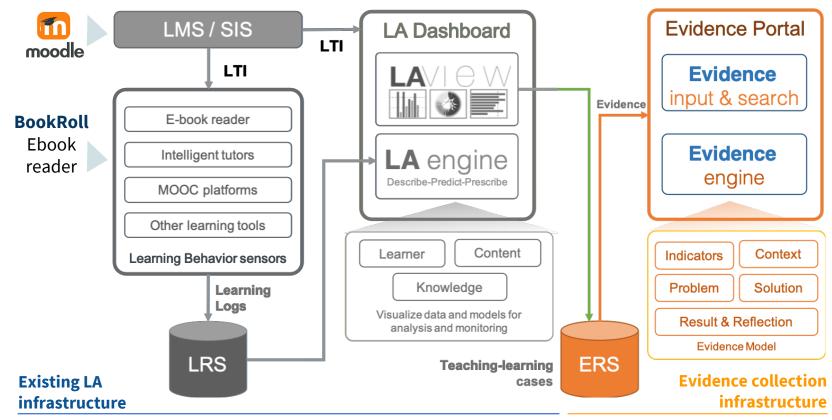
## Input of evidence data

	Manual	Automatic		
	Source of data	Stakeholders		
1	Teaching practice	Teachers		
2	Learning practice	Students		
3	Published research	Researchers		

Researchers input evidences manually for Evidence-based Medicine.

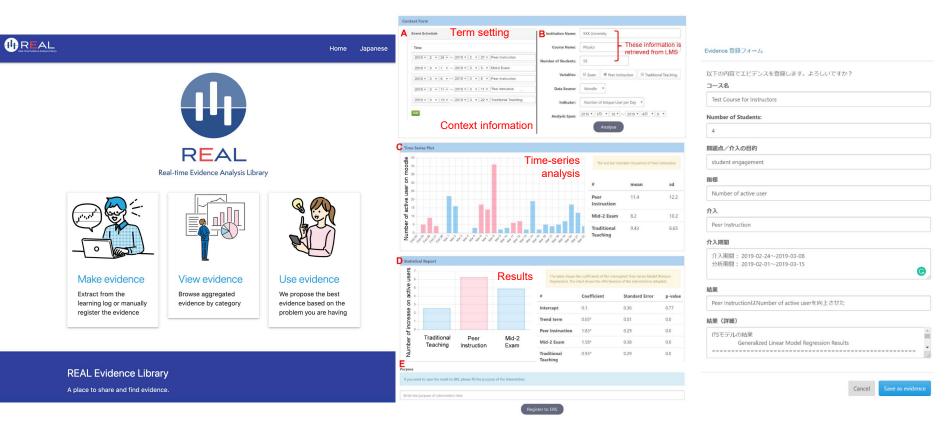


### Learning Evidence Analytics framework



Kuromiya, H., Majumdar, R., & Ogata, H.(2020). Fostering Evidence-Based Education with Learning Analytics: Capturing Teaching-Learning Cases from Log Data. Educational Technology & Society, 23(4), 14–29.

### Evidence extraction and search



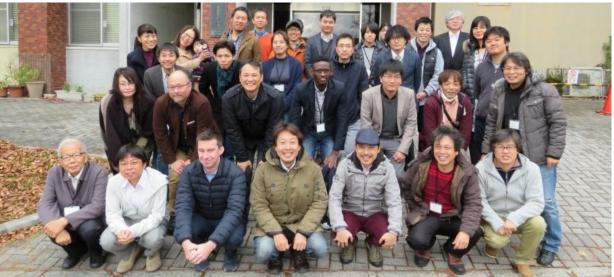
Hiroyuki KUROMIYA, Rwitajit MAJUMDAR, Jayakrishnan WARRIEM & Hiroaki OGATA, Data-driven Validation of Pedagogical Model - A Case of Blended LCM Model, 10th International Conference On Technology For Education (T4E) 2019, Goa, India, 2019.12.9-11

## Education is borderless.



7 major uni, Hiroshima Uni, Kumamoto Uni, Open Uni and NII

50+ professors joined.



### International BookRoll Workshop @ Kyoto University, March 2019

### 30+ researchers from Taiwan and Japan

 Professors used BookRoll in order to improve education.
 Analyze data with pre- and post-test
 Submit SSCI journal papers together

Two important points: You can improve your course, and You can publish Journal papers.



### Workshop on BookRoll Partnership @ Taiwan

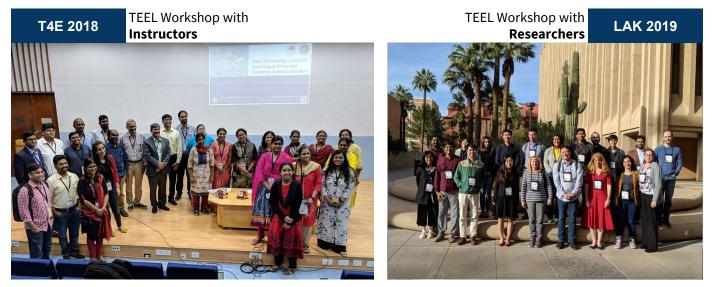
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### +30 young professors in 25 different universities



## **BookRoll Workshops**





Chennai, India, 2018

Arizona, USA, 2019

## http://eds.let.media.kyoto-u.ac.jp

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	🖬 Hiroaki Ogata 1 Google カレンダー 🚫 Go	ogle Keep 🛛 Google マップ 📑 Facebook 🔳 N	NAVITIME 🔄 京都 バス・鉄道 🛞 京都大学教職員用認	証 🦂 BookRoll 🛛 🙀 Learning and Educatio
	教育ビッグデータを用いた教育・学習支援のためのクラウド情報基盤	山一木	OVERVIEW PUBLICATION EVENTS	RESEARCH COMMUNITY SHARE 日本語 -
		デジタ Sakai		
LEAF Platform anonymized of are available!	data	Bb Blackboard など…	ing Analytics Tool	ラーニング コードストア
If interested, please me at hiroaki.ogata@g	contact LRS: htt	l: http://www.let.media.kyoto-u.ac.j ps://github.com/Apereo-Learning-A	jp/project/デジタル教材配信システム Analytics-Initiative/OpenLRW	『bookroll』 /
	我々が得	<b>ソフトウェア利用申請</b> 我々が開発したBookRollとダッシュボードシステムの利用を希望される方は下記より申請く ださい。		記より申請く

78

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Thank you!

Please contact me at hiroaki.ogata@gmail.com