# What happens when students get to choose indicators on customisable dashboards?

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# Overview of today's presentation

Part 1: LAK Best Paper Award

# Quantum of Choice: How learners' feedback monitoring decisions, goals and self-regulated learning skills are related.

Jivet, I., Wong, J., Scheffel, M., Valle Torre, M., Specht, M., & Drachsler, H.



The 11th International Learning Analytics and Knowledge Conference

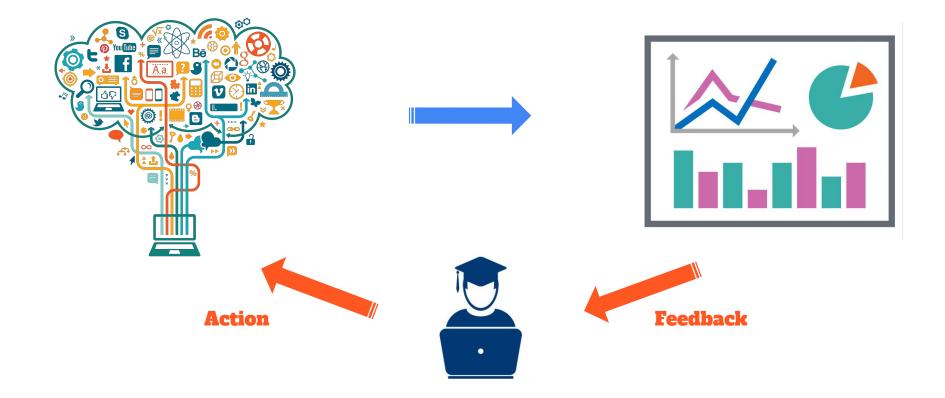
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Part 2: Ongoing research

# Learning analytics dashboards



## Are dashboards effective?

# For whom are dashboards effective, why and in what context?

# Dashboard design shortcomings

1. Task-level feedback (Matcha et al., 2019)

2. Limited student involvement (Dollinger & Lodge, 2018; West et al. 2020)

3. "One-size-fits-all" designs (Teasley, 2017; Gašević et al., 2016)

# Dashboard design shortcomings & our approach

1. Task-level feedback (Matcha et al., 2019)

Include process-level feedback

- 2. Limited student involvement (Dollinger & Lodge, 2018; West et al. 2020) Large scale field study with a customisable dashboard:
  - goal setting
  - indicator selection
- 3. "One-size-fits-all" designs (Teasley, 2017; Gašević et al., 2016)

Effects of learner goals (Schunk, 2012) & SRL skills (Zimmerman, 1990) on indicators selection



If learners have the choice to configure the data on their own dashboard...

- RQ1: What data do they first **choose** to monitor?
- RQ2: Is there a relationship between **the way learners formulate their goals** and the **indicators** they choose to monitor?
- RQ3: Is there a relationship between **the way learners formulate their goals,** their **SRL skills** and the **indicators** they choose to monitor?

# The widget

#### My learning dashboard

Learning with a MOOC can be challenging. This tool supports you to achieve your goals. Here you can (1) actively set your goal for this course and (2) select indicators to monitor your progress towards your goal.

#### What do you want to achieve by the end of this course?

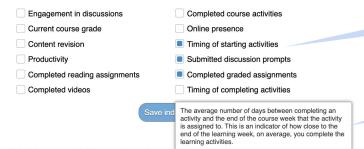
Some examples for a goal are learning specific topics covered by the course, completing the course and getting a certificate, completing all activities in the course in a certain timeframe, dedicating 3 hours weekly to this course, etc.

Enter your goal here	
	4
(Save goal)	

Goal input

#### How would you like to monitor progress towards this goal?

You can choose between three and six indicators. You can change them at the beginning of every week. Hover over each indicator to show its description.



#### Select 3-6 indicators

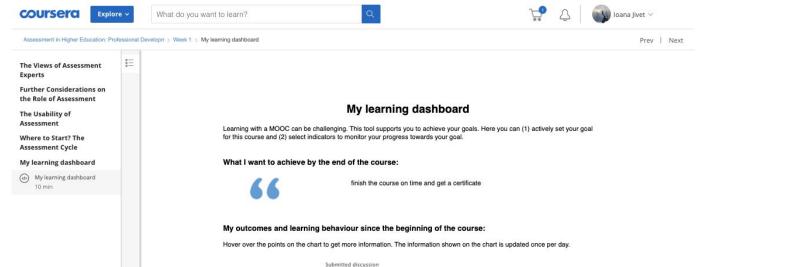
#### Indicator descriptions

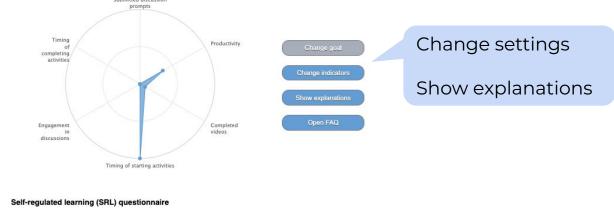
#### Self-regulated learning (SRL) questionnaire

Help our research and fill out the SRL questionnaire. The questionnaire assesses four self-regulated learning skills in relation to this course: time management, help-seeking, goal setting and self-evaluation and will not take more than 10 minutes.



Embedded SRL questionnaire + demographics





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Fill out the SRL survey

## Task-level: Content progress indicators

- Completed course activities
- Submitted discussion prompts
- Completed graded assignments
- Completed reading assignments
- Completed videos
- Current course grade

## **Process-level:** Learning behaviour indicators

- Content revision
- Engagement in discussions
- Productivity
- Online presence\*
- Timing of starting activities
- Timing of completing activities

# Methods

# Coursera MOOCs

Teachers 39 (±10) years old Highly educated

- 30% PhD, 45% Masters

Data collection: 19 weeks

Students, consultants, managers 32 (±11) years old Educated

- 3% PhD, 38% Masters

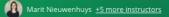
#### Data collection: 14 weeks



Free Access all lectures, readings, and assignments for free

#### Assessment in Higher Education: Professional Development for Teachers

\*\*\* \* \* 4.8 94 ratings



Go To Course

Already enrolled Financial aid available

5,359 already enrolled

## Indicator selection data:

- 12 binary variables
- Ordinal: Number of indicators selected (3-6)

## Goal data - Schunk (2012):

- Learning component: knowledge, understanding, skills, transfer
- Performance component: complete the course, certificate
- Time frame

## SRL data - SOL-Q-R (Jansen et al., 2018)

- Metacogn. Before learning
- Metacogn. after learning
- Time management
- Help seeking

### **RQ1 Indicator selection**

Frequencies

Compare the two courses (Chi-square, Mann-Whitney)

## RQ2 Goals \_\_\_\_\_\_ indicator selection

Regressions: course, 3 binary goal variables (goal components)

## RQ3 Goals + SRL ------- indicator selection

Regressions: course, 3 binary goal variables, 4 SRL subscale scores

	Total	Cou	irse	Used for
		AHE	SDG	-
Accessed the widget	1711	845	866	
Accepted consent	584	295	289	
Set indicators	401	200	201	RQ1
Set indicators, goal and SRL survey	216	121	95	RQ2, RQ3

# Results

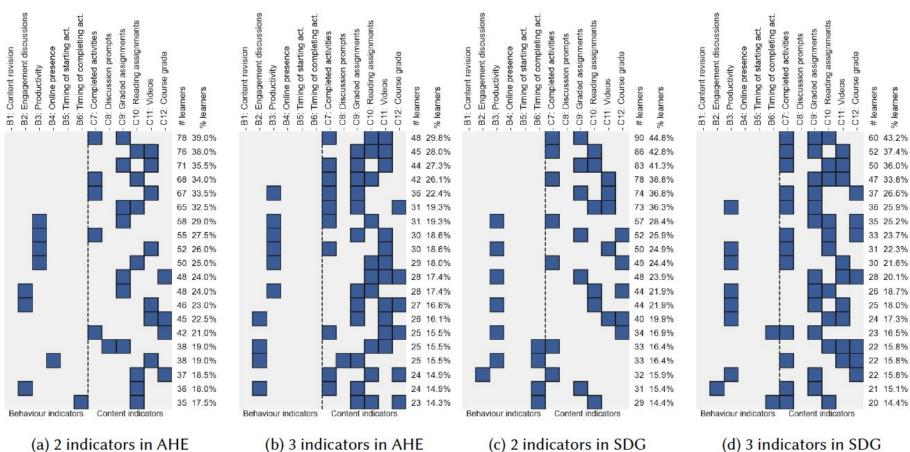
# **RQ1 Indicator selection**

Table 2: The number (#L) and percentage (%L) of learners that selected 3, 4, 5 or 6 indicators in each course.

	Tota	l (N=401)	AHE	(N=200)	SDG	(N=201)
	#L	%L	#L	%L	#L	%L
3 indicators	101	25.2%	39	19.5%	62	30.8%
4 indicators	54	13.5%	22	11.0%	32	15.9%
5 indicators	69	17.2%	28	14.0%	41	20.4%
6 indicators	177	44.1%	111	55.5%	66	32.8%

# **RQ1 Indicator selection**

		Total (	N=401)	AHE (	N=200)	SDG (I	N=201)	2	$c^2$
		# learners	% learners	# learners	% learners	# learners	% learners	Value	р
Learnin	g behaviour indicators								
B1	Content revision	102	25.4%	63	31.5%	39	19.4%	7.73	.005**
B2	Engagement in discussions	122	30.4%	74	37.0%	48	23.9%	8.15	.004**
B3	Productivity	189	47.1%	99	49.5%	90	44.8%	0.90	.343
<b>B</b> 4	Online presence	109	27.2%	63	31.5%	46	22.9%	3.76	.055
B5	Timing of starting activities	69	17.2%	46	23.0%	23	11.4%	9.40	.002**
B6	Timing of completing activities	117	29.2%	62	31.0%	55	27.4%	0.64	.423
Content	progress indicators								
C7	Completed course activities	251	62.6%	114	57.0%	137	68.2%	5.33	.021*
C8	Submitted discussion prompts	95	23.7%	59	29.5%	36	17.9%	7.45	.006**
C9	Completed graded assignments	248	61.8%	123	61.5%	125	62.2%	0.02	.887
C10	Completed reading assignments	231	57.6%	111	55.5%	120	59.7%	0.73	.395
C11	Completed videos	241	60.1%	122	61.0%	119	59.2%	0.14	.713
C12	Current course grade	152	37.9%	75	37.5%	77	38.3%	0.03	.867



(a) 2 indicators in AHE

#### (b) 3 indicators in AHE

#### (c) 2 indicators in SDG

	Total (	N=215)	AHE (	N=120)	SDG (	(N=95)	$\chi^2$	(df = 1)
	# learners	% learners	# learners	% learners	# learners	% learners	Value	р
Learning component	192	89.3%	102	85.0%	90	94.7%	5.26	.022*
Knowledge	88	40.9%	38	31.7%	50	52.6%	9.64	.002**
Understanding	38	17.7%	12	10.0%	26	27.4%	11.0	<.001***
Skills	70	32.6%	50	41.7%	20	21.1%	10.3	.001**
Transfer	81	37.7%	38	31.7%	43	45.3%	4.17	.041*
Strategy	14	6.5%	8	6.7%	6	6.3%	0.01	.918
Performance component	72	33.5%	43	35.8%	29	30.5%	0.39	.413
Certificate	50	23.3%	32	26.7%	18	18.9%	1.77	.183
Complete course	54	25.1%	31	25.8%	23	24.2%	0.07	.785
Time frame	21	9.8%	10	8.3%	11	11.6%	0.634	.426
Only learning comp.	142	66.0%	77	64.2%	65	68.4%		
Only performance comp.	23	10.7%	18	15.0%	5	5.3%		
Both types of comp.	50	23.3%	25	20.8%	25	26.3%		

	Learning	g behaviour	indica	tors			
2					Overa	ll m	odel test
Res	ponse variables	Deviance	AIC	R <sup>2</sup> McF	X2	df	р
B1	Content revision	235	245	0.020	4.71	4	.318
B2	Engagement in discussions	260	270	0.560	15.40	4	.004*
B3	Productivity	296	306	0.003	0.94	4	.919
B4	Online presence	246	256	0.419	10.70	4	.030*
B5	Timing of starting activities	196	206	0.050	10.30	4	.036*
B6	Timing of completing activities	257	267	0.029	7.70	4	.103

#### **Content progress indicators**

					Over	all n	nodel test
Resp	onse variables	Deviance	AIC	R <sup>2</sup> McF	X2	df	р
C7	Completed course activities	268	278	0.011	3.05	4	.549
C8	Submitted discussion prompts	243	253	0.029	7.36	4	.118
C9	Completed graded assignments	282	292	0.012	3.43	4	.489
C10	Completed reading assignments	293	303	0.009	2.63	4	.621
C11	Completed videos	286	296	0.008	2.33	4	.676
C12	Current course grade	285	295	0.014	3.92	4	.417
Num	ber of indicators selected	511	525	0.024	12.50	4	.014*

	in		ber of s selecte	d		B2: Engagement in discussions				B4: O pres	nline ence	B5: Timing of starting activities				
Predictor	В	Ζ	р	OR	В	Z	р	OR	В	Z	р	OR	В	Z	р	OR
Intercept					0.10	0.18	.859	1.10	-0.79	-1.33	.184	0.45	-1.81	-2.77	.006	0.16
Course (ref. AHE)	-0.88	-3.25	.001**	0.42	-0.94	-2.98	.003**	0.39	-0.77	-2.36	.018*	0.46	-1.01	-2.53	<b>.011</b> *	0.37
Goal components																
Learning	0.16	0.34	.735	1.17	-0.32	-0.61	.545	0.72	0.28	0.48	.629	1.32	0.59	0.95	.340	1.81
Performance	0.09	0.27	.785	0.11	-0.01	-0.03	.979	0.99	0.06	0.16	.871	1.06	0.14	0.29	.769	1.14
Time frame	0.61	1.11	.265	1.83	-1.30	-1.84	.066	0.27	-1.34	-1.65	.099	0.26	1.12	1.81	.071	3.05

					Over	all m	odel test	Comp	arise	on to RQ2 model
		Deviance	AIC	R <sup>2</sup> McF	<u>X</u> 2	df	р	χ2	df	р
Learnin	g behaviour indicators									
B1	Content revision	228	246	0.050	11.98	8	.152	7.27	4	.122
B2	Engagement in discussions	236	254	0.143	39.30	8	<.001***	23.9	4	<.001***
B3	Productivity	290	308	0.024	7.17	8	.519	6.23	4	.183
B4	Online presence	240	258	0.064	16.50	8	.036*	5.79	4	.216
B5	Timing of starting activities	195	213	0.058	11.90	8	.155	1.65	4	.799
B6	Timing of completing activities	243	261	0.084	22.15	8	.005**	14.4	4	.006**
Content	progress indicators									
C7	Completed course activities	266	284	0.019	5.07	8	.750	2.02	4	.732
C8	Submitted discussion prompts	237	255	0.054	13.54	8	.095	6.18	4	.186
C9	Completed graded assignments	282	300	0.014	4.13	8	.845	0.70	4	.951
C10	Completed reading assignments	292	310	0.014	4.04	8	.853	1.41	4	.843
C11	Completed videos	279	297	0.032	9.13	8	.331	6.81	4	.147
C12	Current course grade	283	301	0.024	6.82	8	.557	2.90	4	.575
Number	of indicators selected	496	518	0.052	27.30	8	<.001***	14.90	4	.005**

	in		ber of rs selecte	ed	B2: Engagement in discussions					B4: O pres	nline ence		B6: Timing of completing activities				
Predictor	В	Z	р	OR	В	Z	р	OR	В	Ζ	р	OR	В	Z	р	OR	
Intercept					-2.77	-2.17	.030	0.06	-1.47	-1.19	.236	0.23	-1.79	-1.46	.145	0.17	
Course (ref. AHE)	-0.83	-2.94	.003**	0.44	-1.10	-3.08	.002**	0.33	-0.71	-2.03	.042*	0.49	-0.34	-1.01	.312	0.71	
Goal components																	
Learning	0.12	0.24	.809	1.13	-0.40	-0.68	.496	0.67	0.34	0.57	.570	1.40	0.11	0.20	.839	1.12	
Performance	0.06	0.18	.859	1.06	0.01	0.03	.975	1.01	0.06	0.15	.881	1.06	-0.06	-0.14	.889	0.95	
Time frame	0.76	1.35	.178	1.14	-1.22	-1.64	.102	0.30	-1.36	-1.65	.099	0.26	1.30	2.25	.025*	3.68	
SRL skills																	
Meta before	0.19	0.99	.323	1.21	-0.43	-1.71	.088	0.65	0.41	1.55	.122	1.50	0.36	1.48	.140	1.44	
Meta after	0.01	0.03	.975	1.01	0.53	1.94	.052	1.70	-0.41	-1.50	.134	0.66	-0.64	-2.32	.020*	0.53	
Time management	0.19	1.28	.201	1.21	0.02	0.10	.919	1.02	0.13	0.74	.459	1.14	0.52	2.73	.006**	1.68	
Help seeking	0.17	1.67	.095	1.19	0.54	4.04	<.001***	1.72	0.05	0.40	.691	1.05	0.02	0.13	.896	1.02	

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Intercept					- <mark>2.77</mark>	-2.17	.030	0.06	-1.47	-1.19	.236	0.23	- <mark>1</mark> .79	-1.46	.145	0.17	
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# Findings

- Learners focus on content progress indicators.
  - Easy to understand & immediately actionable
  - Paradox of choice (Schwarz, 2004)
  - Feedback literacy (Carless, 2018)

- The way learners formulate goals does not predict their monitoring choices.
  - Same choices, but different motivations, insights and interpretation

# Findings

- Time management predicts use of procrastination indicators.
  - TM is weakly positively associated with academic online achievement (Broadbent, 2017).
  - What about learners with lower time management skills?
- Help seeking predicts monitoring engagement in discussion.
  - What about learners who don't know where to seek help?
- Course is a significant predictor for multiple indicators.
  - Demographics
  - Course design (peer assignments)

# Engaging Students in the Design of Learning Analytics Tools

An Exploratory Sequential Mixed Method Study\*

Jacqueline Wong Ioana Jivet Manuel Valle Torre

\*Manuscript in preparation

Leiden • Delft • Erasmus Centre for Education and Learning Gabrielle Martins van Jaarsveld Martine Baars Marcus Specht

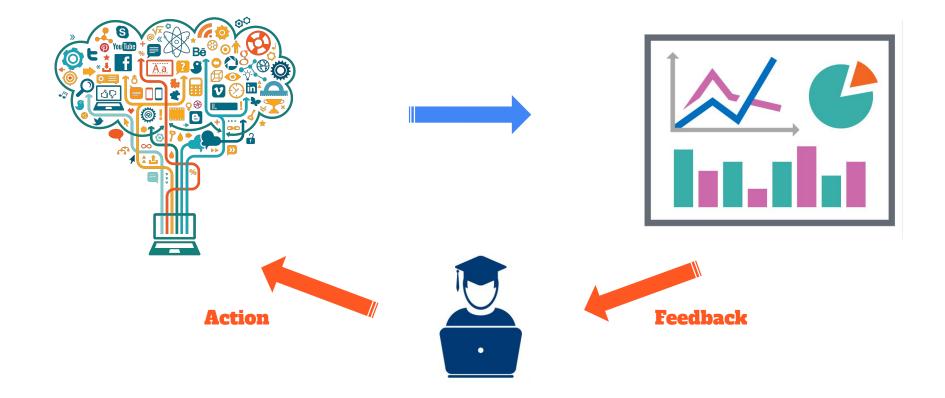




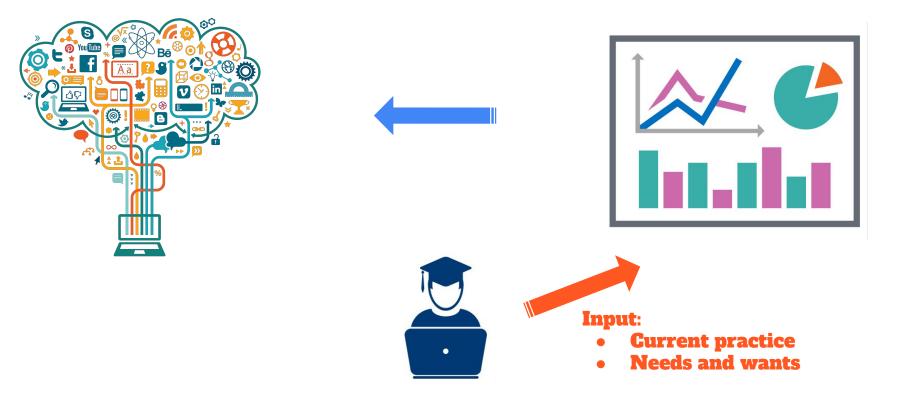
Erasmus University Rotterdam

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# Crafting dashboard indicators



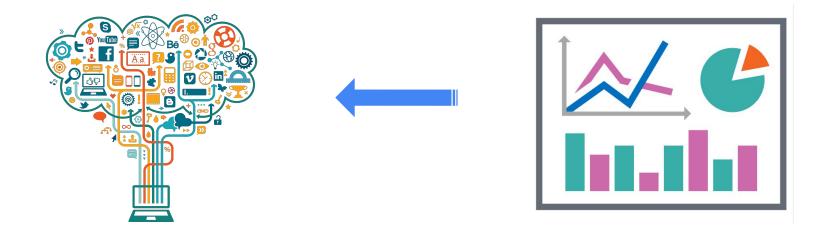
# Our approach for crafting dashboard indicators

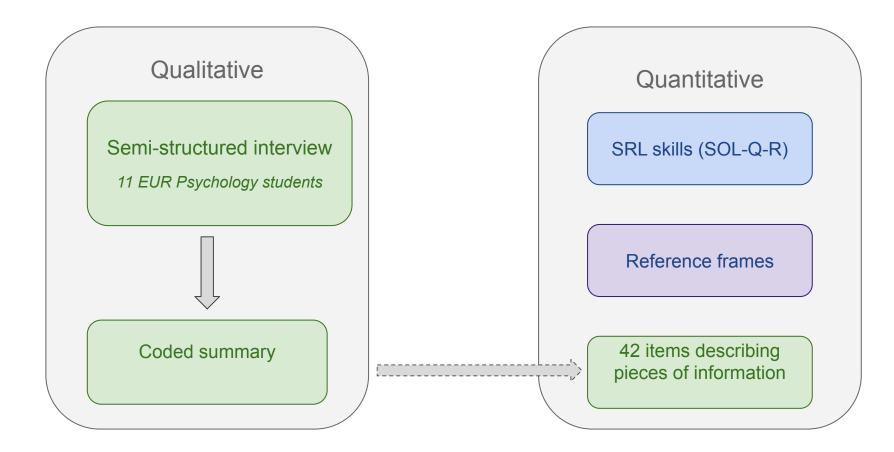


# What information and tools do students use when studying?



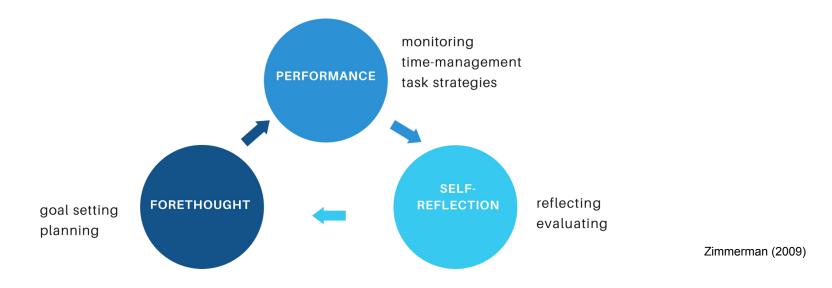
## How can we address these needs with learning analytics?





# **Qualitative Study**

# Semi-structured interview



Main Question: Could you describe how you approach learning?

**Sub Question :** Do you set goals or plan for what you are going to study? Could you give an example of your goal / plan? (Would you specify a time frame? If so, what time-frame would you use?)

**Tooling Question**: What information do you use or what information do you think you might need for setting goals or planning? (e.g., deadlines or course schedule)

# Coding

#### Self-reflection: Information and Tooling

"Yeah, it would maybe be nice to to sort of keep *a record of what you study yourself*, or *how long you study*. So you can look back at that, and you can see how much time you spent studying each topic. So you know, what took you more time, what took you less time. And that also shows some kind of growth, or what some topics you struggled with, or what you found easy, or maybe what you didn't spend enough time on."

# **Resulting Categories of Information**

course requirements

The criteria for passing the course

deadlines

The due date of assignments

content of the course

A detailed list of topics in the course.

#### course characteristics

An indication of the time needed to complete a module (e.g., "Module 1 takes approximately 2 hours.")

#### performance

Information about how well you are progressing in the course assignments

#### study behaviours

Information about how close to the deadline you submit your assignments

interpretative (complex information)

Information about how effective your study behaviours are (e.g., how procrastination affects your learning)

#### study behaviours

- The total amount of time you spent studying.
- The amount of time you spent on each topic, week, or study session to find your study pattern.
- Information about how late you start an activity after it has been assigned to you
- Information about how close to the deadline you submit your assignments
- Information about how focused you are when studying
- Information about how productive you are at different moments of the day (e.g., morning, afternoon, evening)
- Information about how productive you are when experiencing different moods (e.g.,boredom, enjoyment, anxiety)
- Information about how productive you are when studying in different environment (e.g.,location, noise).
- A list of the strategies you use when studying (e.g., highlighting, summarizing, creating mindmaps)
- An overview of how often you use certain study strategies
- Information about how often you try different study strategies to get better grades
- Information about the quality of your study products (e.g., summaries or notes) and how it compares to peers

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- Information about the quality of your study products (e.g., summaries or notes) and how it compares to peers

Interpretative (complex information)

- Information about how effective your study behaviours are (e.g., how procrastination affects your learning)
- Information about how effective your study strategies are (e.g., how notetaking or making summaries affect your learning)
- Information about how well you follow your planning
- Information about how often you change your planning
- Information about how accurate the course estimation is for you (e.g., You spent 20% more time on this topic than estimated by the course instructor.)
- Information about how accurate you are in estimating the time you need for studying (e.g., You spent 10% less time on this activity than what you planned for it.)

# **Quantitative Study**

## Survey Part I: 42 Information Items

Please rate how important you consider the following information when studying.

	Not important at all	Slightly important	Important	Highly important	Extremely important	l don't know
The learning objectives of the course	$\bigcirc$	$\bigcirc$	$\bigcirc$	$\bigcirc$	$\bigcirc$	$\bigcirc$
The due date of assignments	$\bigcirc$	$\bigcirc$	$\bigcirc$	$\bigcirc$	$\bigcirc$	$\bigcirc$
The content that other students find important.	0	0	$\bigcirc$	$\bigcirc$	$\bigcirc$	$\bigcirc$
Information about how well you follow your planning	$\bigcirc$	$\bigcirc$	$\bigcirc$	0	$\bigcirc$	$\bigcirc$
Information about how confident you are that you have mastered a topic	$\bigcirc$	0	0	0	$\bigcirc$	$\bigcirc$
	$\bigcirc$	$\bigcirc$	$\bigcirc$	$\bigcirc$	$\bigcirc$	$\bigcirc$

# Survey Part II: Reference frames

Social Current peers

Current peers with high performance

Current peers with similar goals

Past students who completed the course

Goal Goals set by the teacher Your goals for this course Work in progress

Self Your own past performance

Wise et al. (2014), Lim et al. (2019), Jivet et al. (2020)

# Implications and the future

- Explore customisable dashboards Kitto et al. (2020), Ochoa & Wise (2020)
- Effect of student agency
- Assist the development of feedback literacy and data literacy
  - Preconfigured dashboards
  - Nudges (Thaler & Sustain, 2008)
- Crafting learning behaviour indicators
  - Meaningful feedback → Relevant data sources

# Work in progress

- Widget & Coursera log processing code available on
- on **GitHub**
- Expand data collection on survey What information do students want?

# Thank you!

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