



MACQUARIE
University

Learners' confusion and cognitive load while learning from interactive videos

Amaël Arguel, Mariya Pachman, Lori Lockyer



Australian Government
Australian Research Council



Understanding confusion in digital learning environments



MACQUARIE
University



SCIENCE OF LEARNING
RESEARCH CENTRE

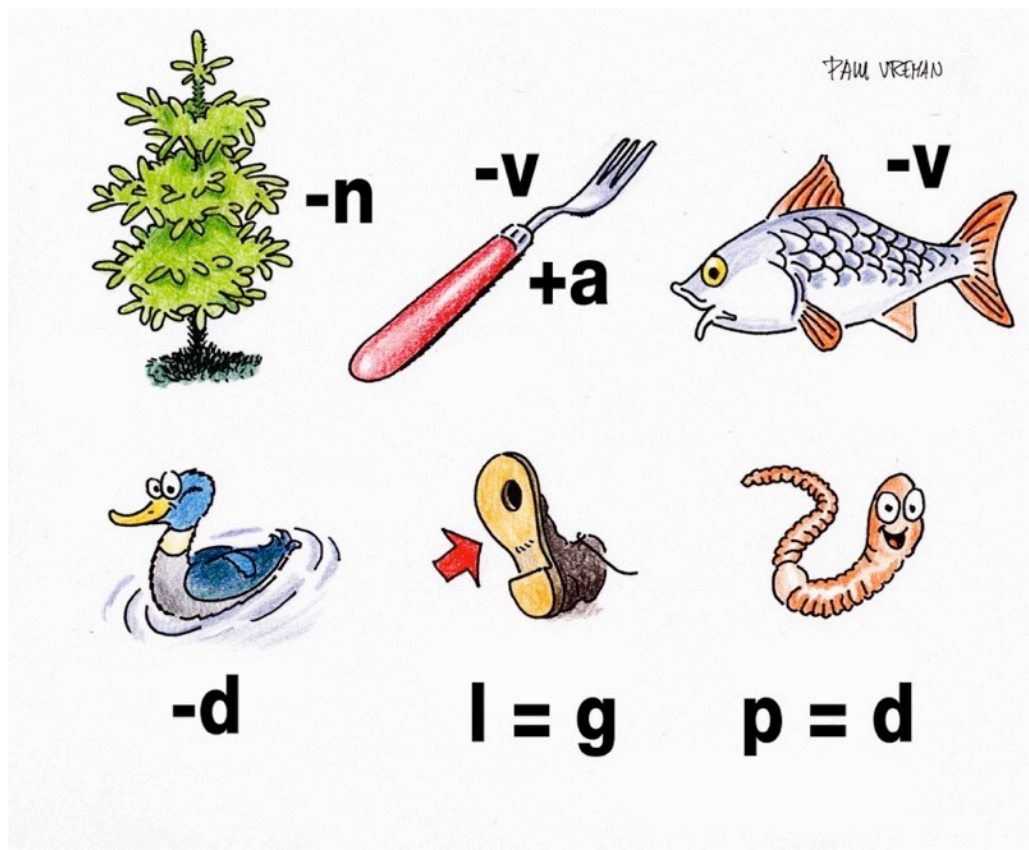


Making Sense from Information

Can you solve it?



MACQUARIE
University



Confusion

What is it?



MACQUARIE
University

- **Epistemic** emotion
(Pekrun & Stephens, 2012)
- Caused by a **cognitive disequilibrium** (impasses, discrepancies, contradictions, ...)
(Graesser, Lu, Olde, Cooper-Pye, & Whitten, 2005)
- **Unpleasant** emotion
(Russell, 2003)
- Have different **effects on learning**:
 - Negative
 - Positive
(D'Mello, Lehman, Pekrun, & Graesser, 2014)

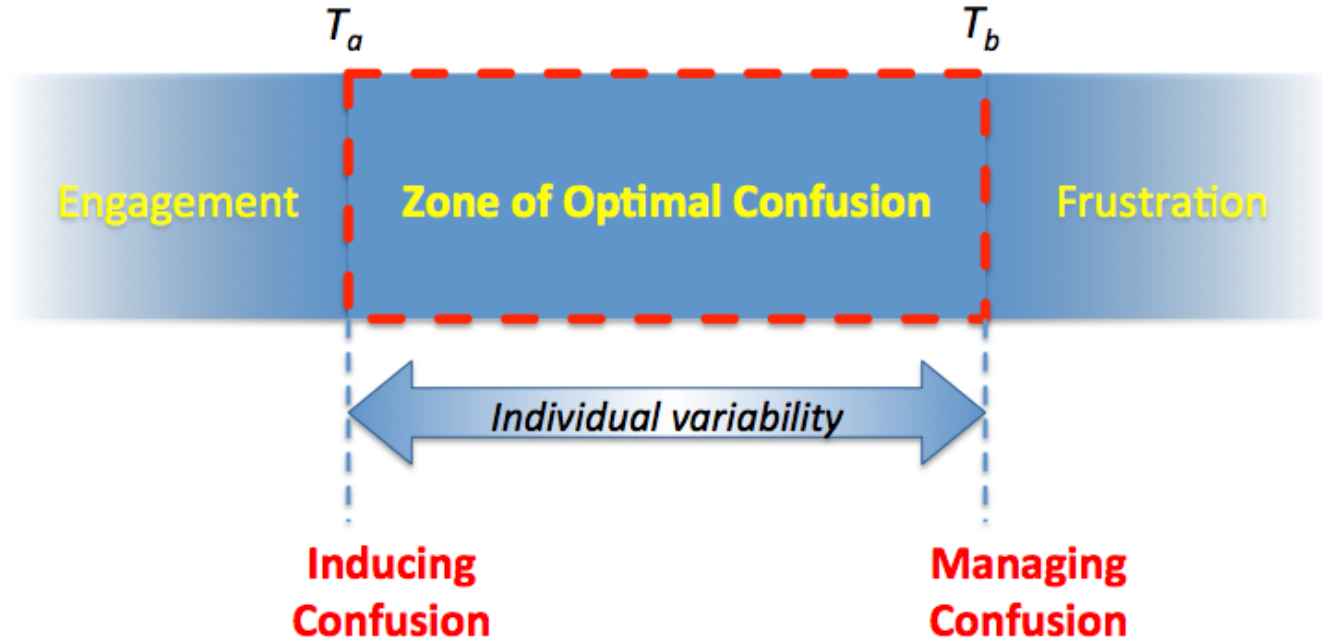


Zone of Optimal Confusion

(Arguel & Lane, 2015; adapted from D'Mello, Lehman, Pekrun, and Graesser, 2014)



MACQUARIE
University

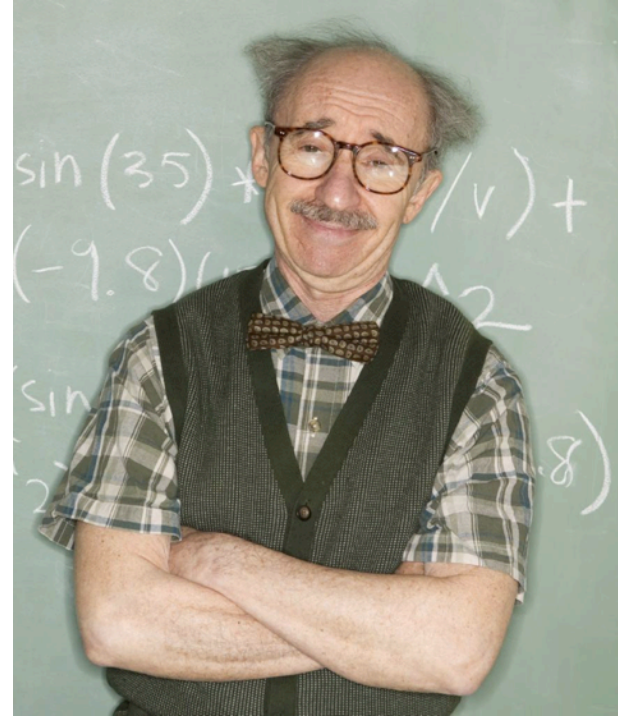


Confusion in the Classroom



MACQUARIE
University

TEACHERS CAN PERCEIVE STUDENTS' EMOTIONS



In Digital Learning Environments



MACQUARIE
University

THE OCCURRENCE OF CONFUSION

When learning from computers, learners are actually quite **isolated**,

Their emotions **cannot be easily detected** by a teacher,

How to **detect learner's confusion** in digital learning environments?



It's Not Only Confusion

LEARNERS CAN EXPERIENCE A WIDE RANGE OF EPISTEMIC EMOTIONS



MACQUARIE
University



Measuring Confusion

And other epistemic emotions



MACQUARIE
University

Different experimental methods to measure learners' confusion:

(Arguel, Lockyer, Lipp, Lodge, & Kennedy, 2017)

- Facial expressions
- Self-report
- Physiological changes
- Behavioural indicators
- In digital learning environments: **activity analytics**





MACQUARIE
University



SCIENCE OF LEARNING
RESEARCH CENTRE

Learning from videos

Interactive digital learning environment

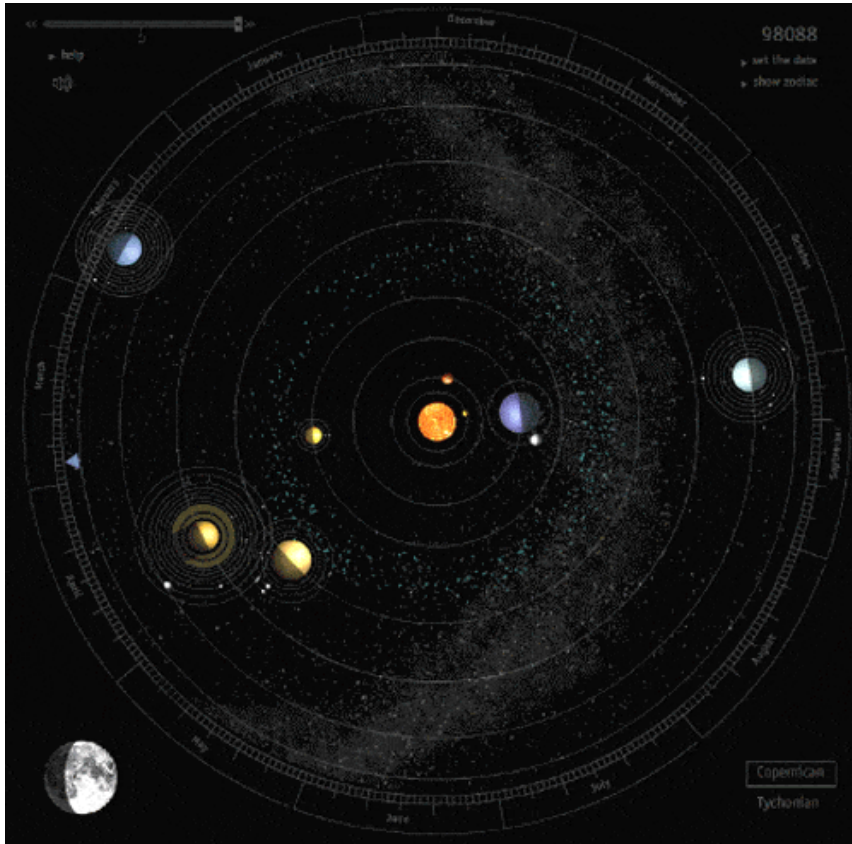


Advantages of videos

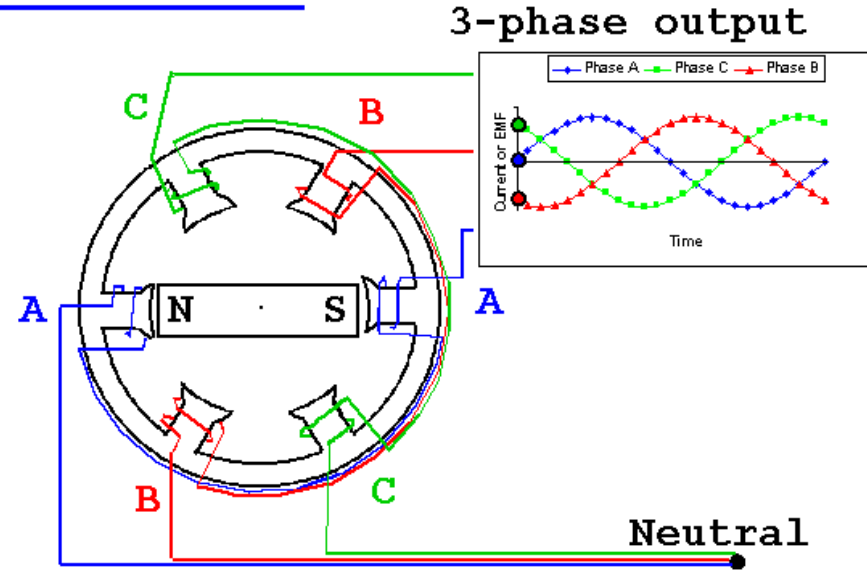
Congruence principle (Tversky, Morrison, & Bétrancourt, 2002)



MACQUARIE
University



The Generator



T. Davies 2002

Problem with videos

The Transience of Information



MACQUARIE
University

Animations can generate **higher cognitive load** due to the transience of information
(Ayres & Paas, 2007)

Possible solution:

To embed **control features** in videos:

- To improve **learning**,
(Berney & Bétrancourt, 2016)
- To reduce **cognitive load**,
(Hasler, Kersten, & Sweller, 2007; Tabbers & de Koeijers, 2010)
- Also, to manage **confusion**?



Internet Explorer 9



Opera



Safari



Chrome



Firefox



MACQUARIE
University



SCIENCE OF LEARNING
RESEARCH CENTRE

Experimental Study

Learning from instructional videos



Testing environment

Learning Research Lab



MACQUARIE
University



Participants

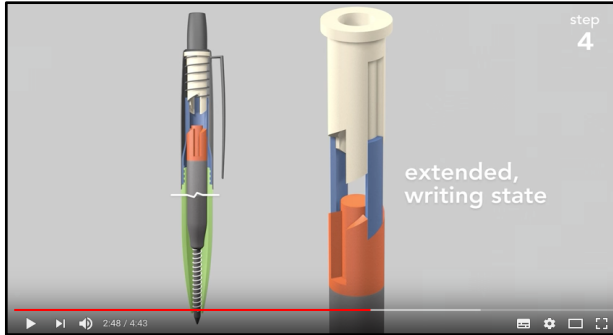
- **51 participants** recruited from Macquarie University
- Age range 18-53 ($M = 22.2$, $SD = 5.79$)
- No background in engineering, chemistry, mechanics, or electronics

Learning Material

Instructional Videos on “How Stuff Works”



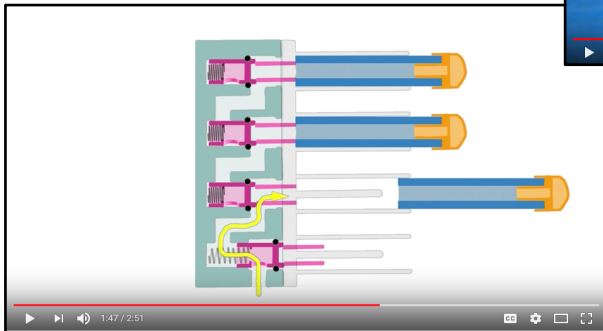
MACQUARIE
University



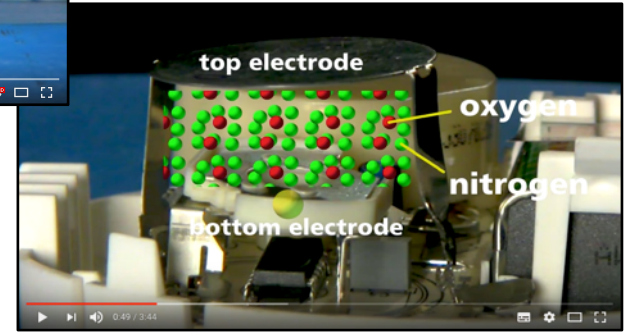
Video 1: Ballpoint pen



Video 2: Coffee machine



Video 3: Nerf blaster



Video 4: Smoke detector

Dependent Variables



MACQUARIE
University

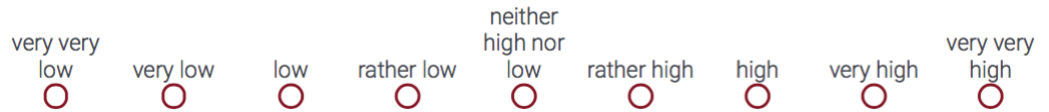
Self-reported confusion
(expected lower with video
controls)

Please rate the maximum amount of confusion you experienced whilst watching the video



Cognitive Load (Paas, 1992)
(expected lower with
controls)

Please rate the maximum amount of mental effort you experienced whilst watching the video



Learning performance:
(expected better with controls)

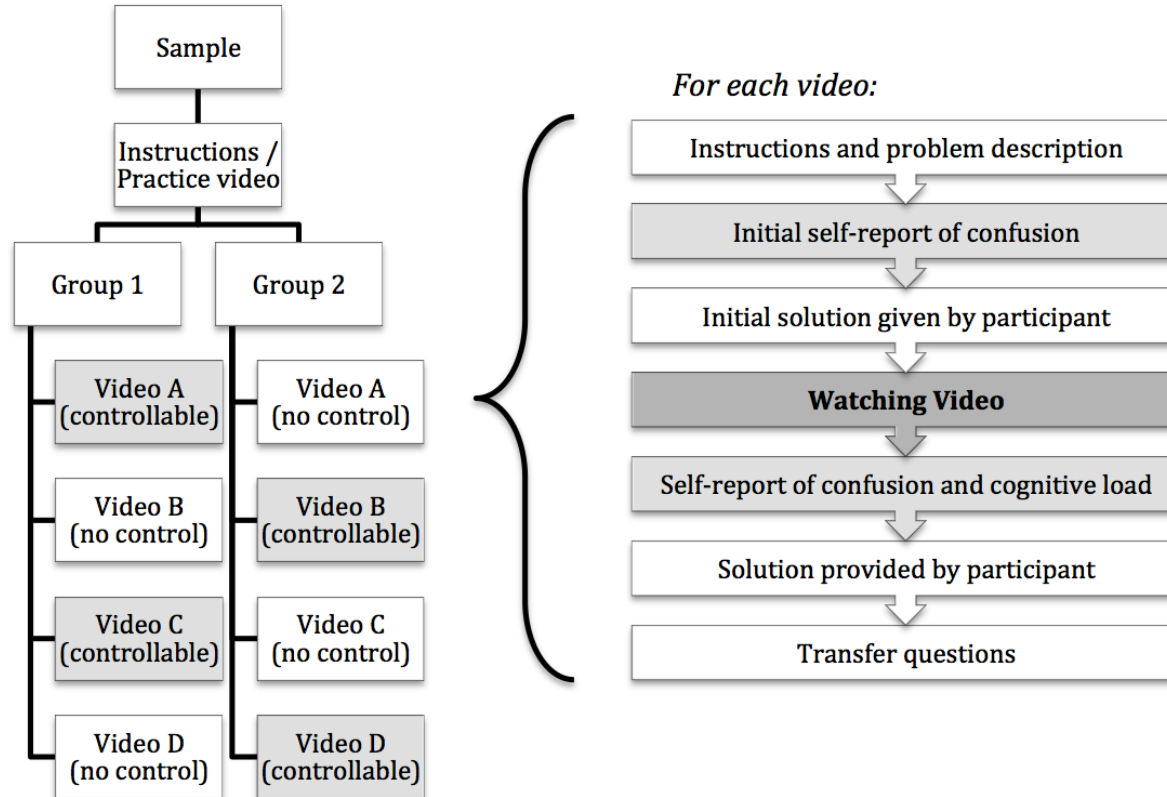
6 multiple choice questions for each video

Testing protocol

Experimental design



MACQUARIE
University



Results



MACQUARIE
University



SCIENCE OF LEARNING
RESEARCH CENTRE

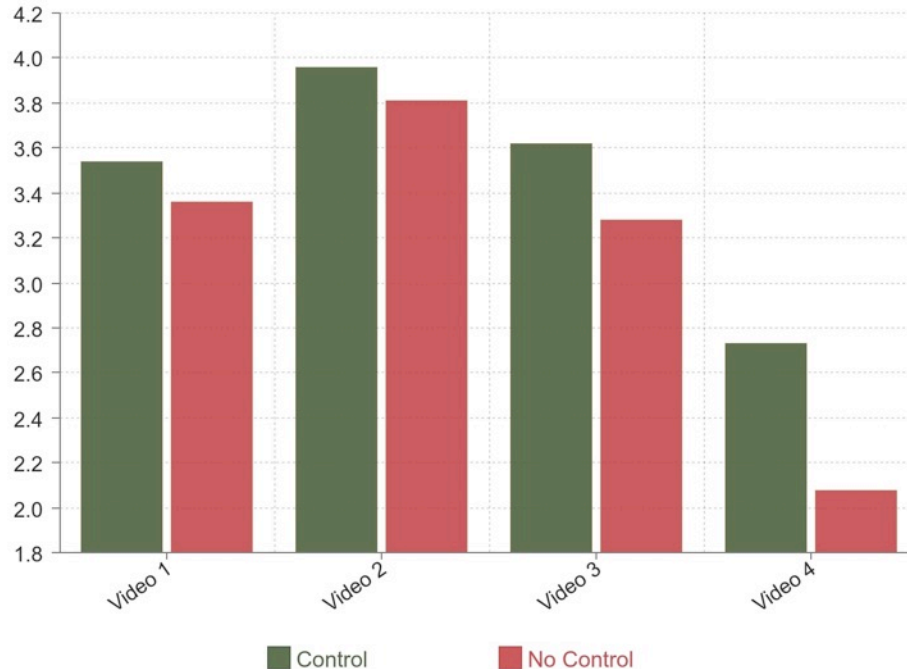
Results

Effect of Controllability on Learning Performance



MACQUARIE
University

Learning Performance



No statistically significant difference between the groups ($p > .05$)

Results

Effect on Change of Confusion (post – pre-test)



MACQUARIE
University

Confusion Progress



Confusion reduction tended to be stronger for the group with control features

Only one significant difference observed:

* Video 2: $F(49) = 2.01$, $p = .02$

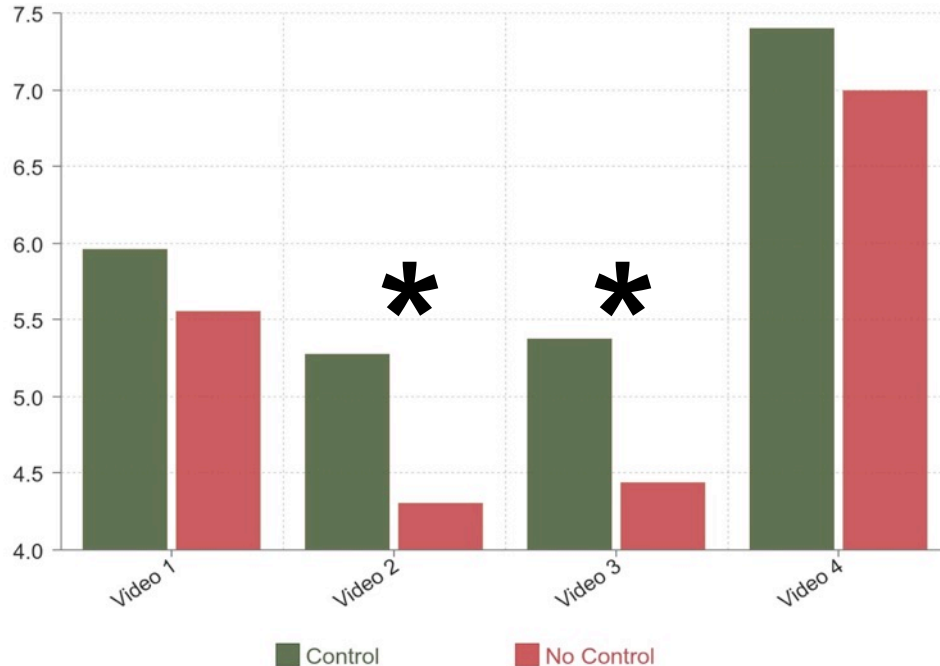
Results

Effect on Level of Cognitive Load



MACQUARIE
University

Cognitive Load



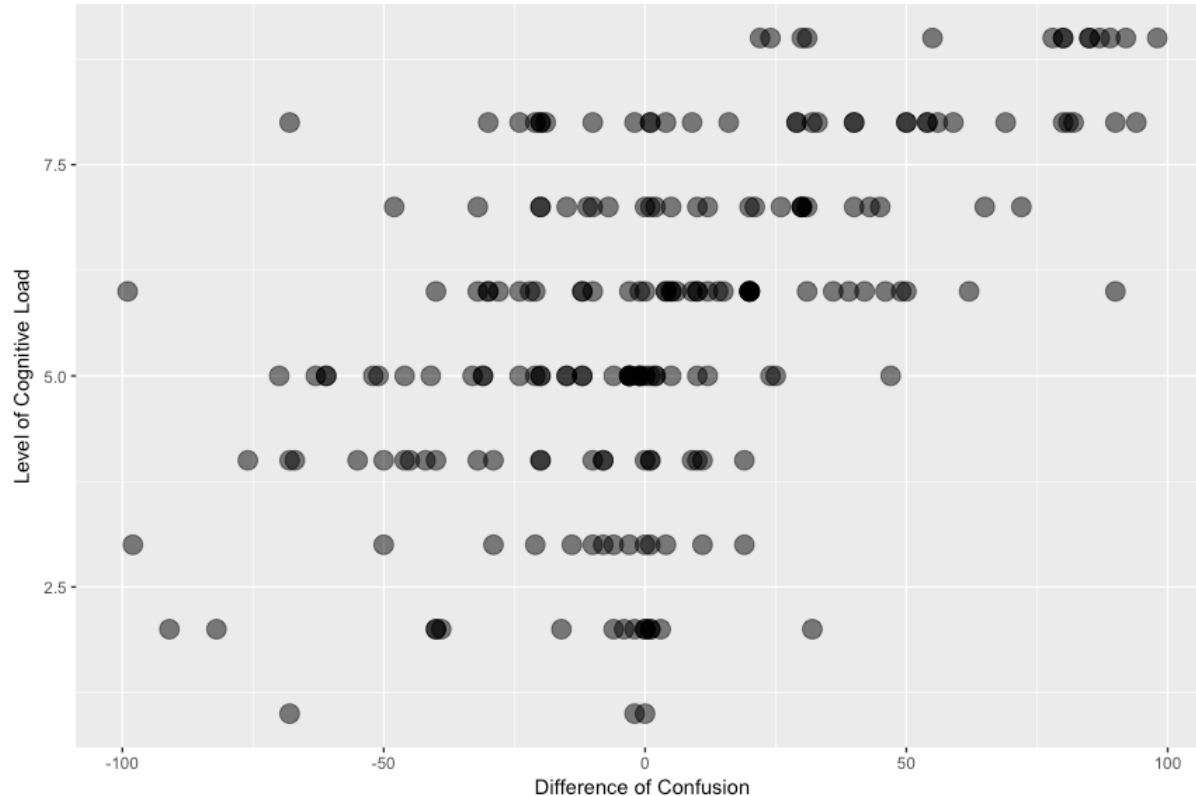
The level of CL tended to be higher with control features

Significant differences observed:

* Video 2: $F(49) = 1.94$, $p = .05$

* Video 3: $F(49) = 2.08$, $p = .04$

Relationship between Confusion and Cognitive Load



Positive correlation
between self-report
Confusion and CL

$$r(202) = .542, p < .001$$

Control features

And their actual usage



MACQUARIE
University



No one used the
play/pause button

Manipulating the **cursor** was used by:

- 36% of participants for Video 1
- 50% for Video 2
- 48% for Video 3
- 46% for video 4

Navigation behaviours

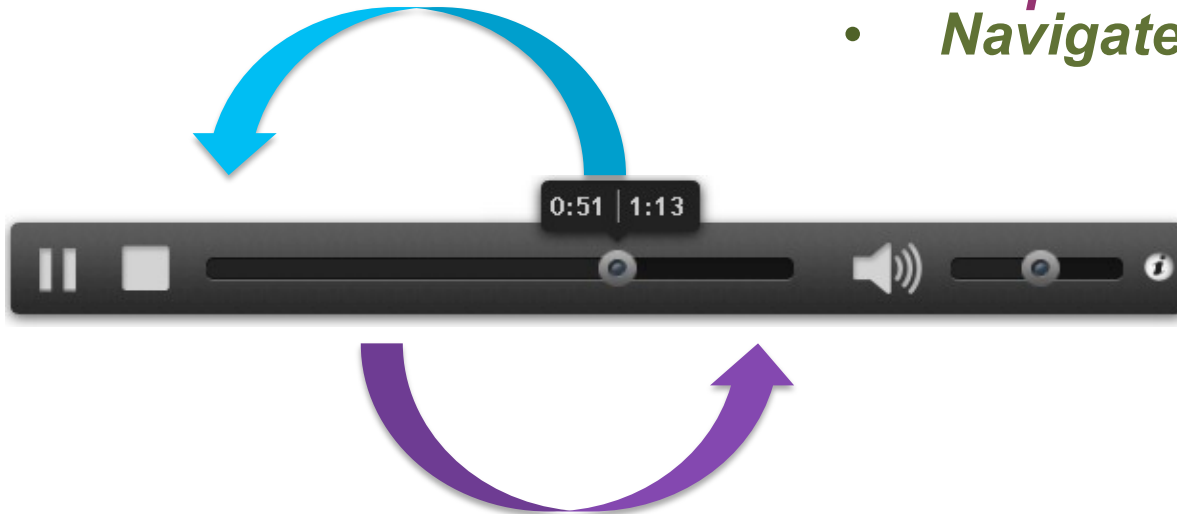
With the controllable videos



MACQUARIE
University

3 types of behaviours:

- *Replay*
- *Skip*
- *Navigate* (replay and skip)

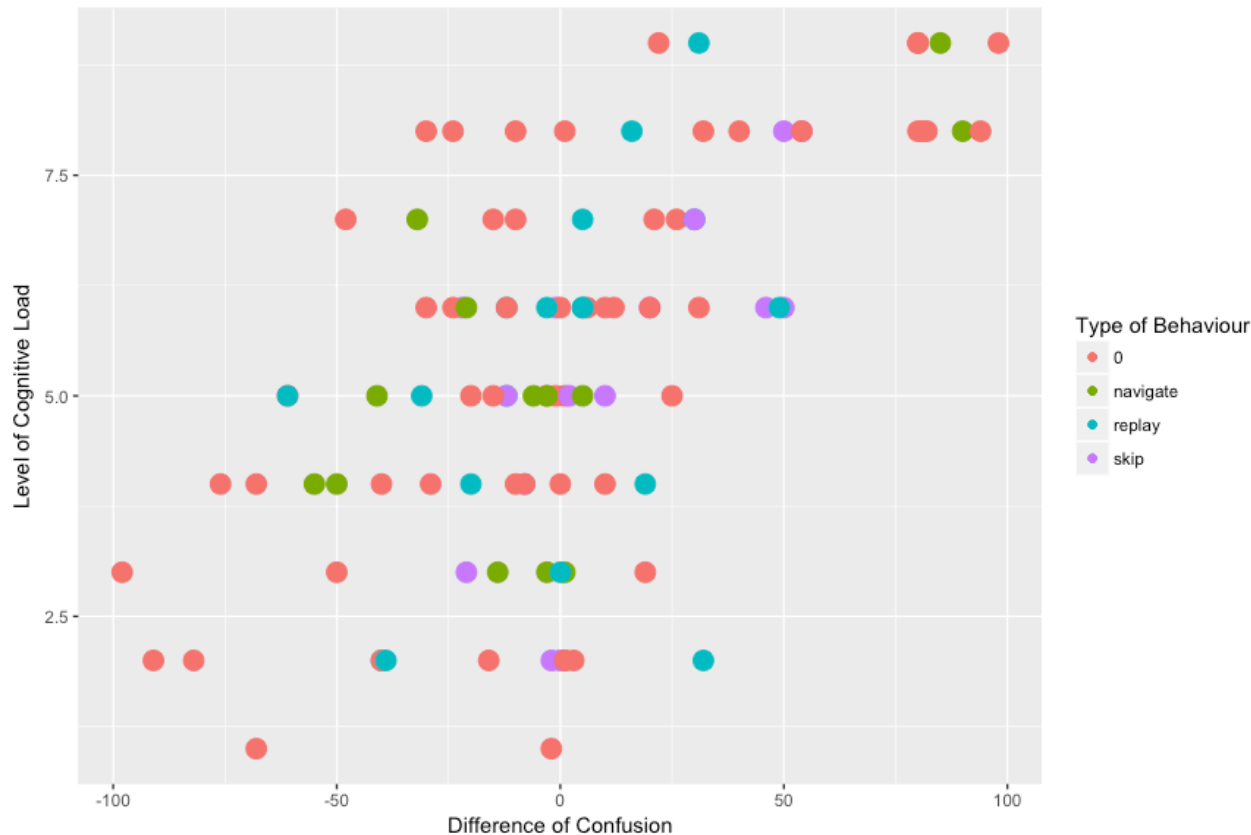


Navigation behaviours

With the controllable videos



MACQUARIE
University



Not enough observations
to allow the identification
of typical patterns of
interactions

Discussion

Questions and further directions



MACQUARIE
University

- Offering the possibility of interacting with videos can produce **beneficial effects**
How to interpret the increase of CL?
- **Confusion** seemed to be linked with the level of self-reported **CL**
Could confusion promote Germane CL?
Inducing “positive confusion” for engaging learners?
- **Interaction activity analytics** is a promising way to identify confusion in digital learning environments
Defining the parameters of predictive models?
Indicator of CL?

Thank you

A Special Research Initiative of the Australian Research Council has supported this research: *ARC-SRI Science of Learning Research Centre* (project number SRI20300015).

amael.arguel@mq.edu.au



MACQUARIE
University



SCIENCE OF LEARNING
RESEARCH CENTRE



Australian Government
Australian Research Council