

Assessing Validity of Cognitive Load Scale in a Problem-Based Learning Setting

<u>Muhamad Saiful Bahri Yusoff¹, Siti Nurma Hanim Hadie²</u>

¹Department of Medical Education, ²Department of Anatomy, School of Medical Sciences, Universiti Sains Malaysia, Kota Bharu, Kelantan, Malaysia. Email: msaiful_bahri@usm.my

www.usm.my



COGNITIVE LOAD THEORY

www.usm.my

Total cognitive load should not exceed the limited capacity of the working memory

Limited Working Memory (WM) Capacity

WM RESOURCES FOR	WM RESOURCES FOR
PROCESSING IL	PROCESSING EL
INTRINSIC LOAD (IL) (Task	EXTRENOUS LOAD (EL) (non-
complexity & learner prior knowledge)	beneficial instruction features for learning)

Total Cognitive Load (CL)

Total cognitive load is contributed by summation of intrinsic and extraneous load

(Bannert et al., 2009; de Croock et al., 1998; Grobe & Renkl, 2006; Kalyuga, 2011; Leppink et al., 2014; Sweller, 1988; Van Gog et al, 2004; Van Gog et al., 2006; Van Gog et al., 2009; van Merrienboer et al., 2002)



COGNITIVE LOAD MEASUREMENT

Subjective

- Learner self-rating of mental effort (during the task)
- Learner self-rating of difficulty (after the task)
- Cognitive Load Scale (CLS) (measures IL, EL & Self-Perceived Learning)

Objective

- Task performance
- Input variables, such as task difficulty
- Process-related behavioural variables, such as psychophysiological measures

(Galy et al., 2012; Leppink et al., 2013,2014; Plass et al., 2010; Pass, 1992; Young et al., 2014)



VALIDITY EVIDENCE



(Cook & Beckman, 2006. Current Concepts in Validity and Reliability for Psychometric Instruments: Theory and Application. *American Journal of Medicine*)



VALIDITY EVIDENCE OF CLS

Response process:

Social & health sciences students (statistics; language); Health sciences freshman (statistics); Medical students (anatomy)

Internal structure:

Stable Factor Structure; High internal consistency

PBL?

Relations to other variables:

Correlate with factors that assumed represent IL & EL

Consequence:

High SPL improve performance; High IL & EL hampering learning

Content: Intrinsic Load; Extraneous Load; Self-Perceived Learning

CLS



PBL: HISTORICAL OVERVIEW

1960'

1969: McMaster University, School of Medicine, Canada 1972: Roskilde University, Denmark 1974: Aalborg University, Denmark 1974: Maastricht University, Holland 1975: Newcastle University, Australia 1979: Universiti Sains Malaysia, Malaysia 1975: University New Mexico, US

1970'

1980'

1985: HarvardSchool of Medicine,US1986: LinköpingUniversity, Sweden

1990'

1990: Tokyo
Women's Medical
University, Japan
1992: Gadjah Mada
University, Indonesia
1997: The University
of Hong Kong, Hong
Kong



PBL: PROCESS

Step 1	 Clarify unfamiliar terms 	Step 5	 Formulation of learning objectives
Step 2	• Define problems to be discussed	Step 6	 Self-study to gather information in relation to the learning objectives
Step 3	• Brainstorm on the problems	Step 7	• Share the results of self-study with the group members
Step 4	 Elaboration of the proposed explanations 	Step 8	• Consolidation on the key learning objectives by experts



PBL: TRIGGER

				Lear
Respirat	ory Sy	ystem Course (GMT 105)		
384			PHASE I	
		PBL 8:	YEAR 1	A t th
	'Cr	ackling Chest'	2015/2016	Atu
				LO1
Mr. David, a 45-year-old odd-job worker	was	admitted to hospital with a	five-day history of	LO 2
high-grade fever, productive cough with	yellov	vish sputum. He also comp	lained of left-sided	
chest pain during inspiration and cough. He	e was i	initially very reluctant to be a	idmitted.	LO3
On obvical exemination, the nations w		et but directoric. There w	an no amanania ar	
clubbing His temperature was 40°C couls	as ale	was 120 beat /minute resp	iratory rate was 36	_
breath/minute and blood pressure was 120/	80 mm	Was 120 Ocat /IIIIIute, Tesp	natory fale was 50	
oreaufininute and blood pressure was 120/	50 IIII	<u></u>		
Examination of respiratory system reveal	ed red	uced chest expansion on th	e left side with in-	
drawing of lower left intercostal spaces du	ring in	spiration. Percussion note w	as dull over the left	
lower zone. Bronchial breath sounds and co	oarse o	rackles were also heard over	the same area.	
Examination of other systems was unreman	kable.			
2				
The following are the results of investigation	ons do	ne for this patient.		
 Haemoglobin 	:	12.0 g /dL		
Total leukocyte count	:	$20.2 \times 10^{9}/L$		
Differential count:				
Neutrophils	1	88%		
Lymphocytes	1	11%		
Eosinophils	1	1%		
Sputum Gram stain	1	Numerous polymorphs se	en.	
	1	Epithelial cells: 1 – 2 per	low power field.	
	1	Gram positive cocci seen		
Sputum culture and sensitivity	1	Pending.		
Chest radiograph	1	Consolidation of the left l	lower zone	
		and a second second		

The attending doctor prescribed empiric intravenous antibiotic. The patient's temperature began to settle after 2 days. The sputum culture later grew pure growth of *Streptococcus pneumoniae*. After one week, his condition improved clinically.

Learni	ng Outcome
At the	end of the session, students should be able to:
LO1	Explain the clinical presentation of this case scenario in relation to the pathophysiology of respiratory tract infection
LO 2	Interpret the investigations for respiratory tract infection
LO3	Discuss the psychosocial implication of respiratory tract infection in this case

"A TRIGGER is problems that provide the key units for structuring relevant learning."

(Davis & Harden, 1999)



PBL: TRIGGER

Respira	atory System Course (GMT 105) PBL 8: 'Crackling Chest'	<u>PHASE I</u> <u>YEAR 1</u> 2015/2016
Mr. David, a 45-year-old odd-job work	er was admitted to hospital with	a five-day history of
high-grade fever, productive cough with	n yellowish sputum. He also con	nplained of left-sided
chest pain during inspiration and cough. I	He was initially very reluctant to b	e admitted.
On physical examination, the patient clubbing. His temperature was 40°C, put breath/minute and blood pressure was 120 Examination of respiratory system revea drawing of lower left intercostal spaces of lower zone. Bronchial breath sounds and	was alert but dyspnoeic. There lse rate was 120 beat /minute, re 0/80 mmHg. aled reduced chest expansion on buring inspiration. Percussion note coarse crackles were also heard ov	was no cyanosis or spiratory rate was 36 the left side with in- was dull over the left yer the same area.
Examination of other systems was unrem	arkable.	
The following are the results of investigat	tions done for this patient	
 Haemoglobin 	: 12.0 g/dL	
Total leukocyte count	: 20.2 x 10 ⁹ /L	
Differential count:		
Neutrophils	: 88%	
Lymphocytes	: 11%	
Lymphocytes Eosinophils	: 11% : 1%	
Lymphocytes Eosinophils 3. Sputum Gram stain	: 11% : 1% : Numerous polymorphs	seen.
Lymphocytes Eosinophils 3. Sputum Gram stain	: 11% : 1% : Numerous polymorphs : Epithelial cells: 1 – 2 p	seen. er low power field.
Lymphocytes Eosinophils 3. Sputum Gram stain	: 11% : 1% : Numerous polymorphs : Epithelial cells: 1 – 2 p : Gram positive cocci see	seen. er low power field. en.
Lymphocytes Eosinophils 3. Sputum Gram stain 4. Sputum culture and sensitivity	: 11% : 1% : Numerous polymorphs : Epithelial cells: 1 – 2 p : Gram positive cocci see : Pending.	seen. er low power field. en.

The attending doctor prescribed empiric intravenous antibiotic. The patient's temperature began to settle after 2 days. The sputum culture later grew pure growth of *Streptococcus pneumoniae*. After one week, his condition improved clinically.

At the	end of the session, students should be able to:
LO1	Explain the clinical presentation of this case scenario in relation to the pathophysiology of respiratory tract infection
102	Interpret the investigations for respiratory tract infection

Learning Outcome

"The nature of student learning in PBL is to a large extend depend on quality of TRIGGERS presented to them."

(Gijselaers & Schmit, 1990; Schmit et al., 1995)



PBL: PARTICIPANTS' ROLES

www.usm.my



- Encourage all group members to participate
 - Assists chair with group dynamic and keeping to time
 - Check scribe keeps an accurate record
 - Prevent side tracking
 - Ensure group achieve appropriate learning objectives
 - Check understanding
 - Assess performance

- <u>Chair</u> Lead the group through the process **Encourage all** members to participate
 - Maintain group dynamics
 - Keep to time
 - Ensures group keep to tasks in hand
 - Ensures the scriber can keep up and is making accurate record



- Ð • Records points Scrib made by group
 - Help group order their thoughts
 - Participate in discussion
 - Record resources used by group



Membe

roup

U

- Follows the steps of process in sequence
- Participate in discussion
- Listens to and respects
- contributions from others
- Ask open questions
- Research all learning objectives
- Shares information with others



PBL INSTRUCTIONAL VARIABLES & CL







Lessons from Problem-based Learning

Edited by Henk van Berkel, Albert Scherpbier, Harry Hillen, and Cees van der Vleuten

Maastricht Experience on PBL

we lead

First author and publication year	Comparison groups	Statistically significant differences
Medical knowledge		
Answering questions abo	ut knowledge	
Verwijnen et al. (1990)	Volunteers from schools A and B, May 1979–September 1980	B better than Maastricht and A
	Volunteers from schools A and B, September–November 1981	B better than Maastricht and A
	Volunteers from schools A and B, non-select sample from C, March– September 1983	No difference
	Random sample from school C, March 1983	No difference
Verhoeven et al. (1998)	Volunteers from the Nijmegen school, December 1994	No difference
	Volunteers from the Nijmegen school, March 1995	No difference
Van der Vleuten et al. (2004)	Populations from the Groningen and Nijmegen school; first 4 years of the	Maastricht and Groningen better than Nijmegen and Leiden

Self-assessment		
Schmidt et al. (2006)	Volunteer graduates from Rotterdam	Rotterdam better than Maastricht
Diagnostic reasoning skills	5	
Diagnosing cases		
Schmidt et al. (1996)	Volunteers from Groningen and Amsterdam	Maastricht and Amsterdam better than Groningen
Schuwirth et al. (1999)	Volunteers from Groningen	Maastricht better than Groningen
Processing and recalling c	ases	
Boshuizen et al. (1994)	Small samples of volunteers from Amsterdam	Maastricht better than Amsterdam
Boshuizen & Claessen (1982)	Small samples of volunteers from Utrecht	Maastricht better than Utrecht on one task; no differences on the other
Interpersonal skills		
Assessment by observers		
Van Dalen et al. (2002)	Valunteers from Leiden	Maastricht better than Leiden
Self-assessment		
Prince et al. (2005)	Volunteer graduates from four	Maastricht better than the other 4

Random sample from a non-disclosed Maastricht better

No difference

schools

(Continued)

medical school

Sample from all 7 other schools

unspecified medical schools

Imbos et al. (1984)

Prince et al. (2003)

Table 24.1 (continued) Comparison between the performance of students and graduates of the Maastricht problem-based medical curriculum and conventional medical schools on various outcome measures First author and **Comparison groups** Statistically significant differences publication year Schmidt et al. (2006) Volunteer graduates from Rotterdam Maastricht better than Rotterdam Practical medical skills Physical examination assessed by observers Scherpbier (1997) Volunteers from Groningen Maastricht better than Groningen Answering questions about physical examination Remmen et al. (1999) Volunteers from Ghent and Antwerp Maastricht better than Ghent and Antwerp Remmen et al. (2001) Volunteers from Ghent, Antwerp and Maastricht better than Groningen, Groningen both better than Ghent and > Antwerp Self-assessment Schmidt et al. (2006) Volunteer graduates from Rotterdam Maastricht better than Rotterdam Cognitive skills (problem-solving, seeking information) Self-assessment Schmidt et al. (2006) Volunteer graduates from Rotterdam Maastricht better than Rotterdam General academic skills (conducting research, writing, presenting papers) Self-assessment Schmidt et al. (2006) Volunteer graduates from Rotterdam No difference Perception of the quality of the curriculum Steenkamp et al. (2004, Samples from all medical schools Maastricht better than all 2006, 2008) Retention rates Post et al. (1986) Graduates from all medical schools. Maastricht better than all entering 1970 Schmidt et al. (2009a) Graduates from all medical schools, Maastricht better than all entering between 1989 and 1998 * The schools compared were anonymized in this study.

Table 24.1 Comparison between the performance of students and graduates of the Maastricht problem-based medical curriculum and conventional medical schools on various outcome measures

First author and	Comparison groups	Statistically significant differences
publication year		
Medical knowledge		
Answering questions abou	it knowledge	
Verwijnen et al. (1990)	Volunteers from schools A and B, May 1979–September 1980	B better than Maastricht and A
	Volunteers from schools A and B, September–November 1981	B better than Maastricht and A
	Volunteers from schools A and B, non-select sample from C, March– September 1983	No difference
	Random sample from school C, March 1983	No difference
Verhoeven et al. (1998)	Volunteers from the Nijmegen school, December 1994	No difference
	Volunteers from the Nijmegen school, March 1995	No difference
Van der Vleuten et al. (2004)	Populations from the Groningen and Nijmegen school; first 4 years of the Leiden school	Maastricht and Groningen better than Nijmegen and Leiden
Imbos et al. (1984)	Random sample from a non-disclosed medical school	Maastricht better
Prince et al. (2003)	Sample from all 7 other schools	No difference
Self-assessment		
Schmidt et al. (2006)	Volunteer graduates from Rotterdam	Rotterdam better than Maastricht
Diagnostic reasoning skills		
Diagnosing cases		
Schmidt et al. (1996)	Volunteers from Groningen and Amsterdam	Maastricht and Amsterdam better than Groningen
Schuwirth et al. (1999)	Volunteers from Groningen	Maastricht better than Groningen
Processing and recalling c	:ases	
Boshuizen et al. (1994)	Small samples of volunteers from Amsterdam	Maastricht better than Amsterdam
Boshuizen & Claessen (1982)	Small samples of volunteers from Utrecht	Maastricht better than Utrecht on one task; no differences on the other
Interpersonal skills		
Assessment by observers		
Van Dalen et al. (2002)	Volunteers from Leiden	Maastricht better than Leiden
Self-assessment		
Prince et al. (2005)	Volunteer graduates from four unspecified medical schools	Maastricht better than the other 4 schools
		Continued

outcome measures		
First author and publication year	Comparison groups	Statistically significant differences
Schmidt et al. (2006)	Volunteer graduates from Rotterdam	Maastricht better than Rotterdam
Practical medical skills		
Physical examination asse	ssed by observers	
Scherpbier (1997)	Volunteers from Groningen	Maastricht better than Groningen
Answering questions abo	ut physical examination	
Remmen et al. (1999)	Volunteers from Ghent and Antwerp	Maastricht better than Ghent and Antwerp
Remmen et al. (2001)		
	Medical knowle	dae:
Self-assessment	Medical knowled	dge:
Self-assessment Schmidt et al. (2006)	Medical knowled	<i>dge</i> : Jlts between
Self-assessment Schmidt et al. (2006) Cognition cours (problem-	Medical knowled	<i>dge</i> : ults between
Self-assessment Schmidt et al. (2006) Cognition Jokus (problem- Self-assessment	<i>Medical knowle</i> Inconsistent resu PBL vs. non-PBL	dge : ults between
Self-assessment Schmidt et al. (2006) Cognitic cours (problem- Self-assessment Schmidt et al. (2006)	<i>Medical knowle</i> Inconsistent resu PBL vs. non-PBL	<i>dge</i> : ults between
Self-assessment Schmidt et al. (2006) Cogniti cours (problem- Self-assessment Schmidt et al. (2006) General academic skills (co	Medical knowled Inconsistent resu PBL vs. non-PBL	dge: ults between
Self-assessment Schmidt et al. (2006) Cogniti cours (problem- Self-assessment Schmidt et al. (2006) General academic skills (c Self-assessment	Medical knowled Inconsistent results PBL vs. non-PBL	dge: ults between
Self-assessment Schmidt et al. (2006) Cognitic usuis (problem- Self-assessment Schmidt et al. (2006) General academic skills (c Self-assessment Schmidt et al. (2006)	Medical knowled Inconsistent result PBL vs. non-PBL	dge: ults between
Self-assessment Schmidt et al. (2006) Cognitic cours (problem- Self-assessment Schmidt et al. (2006) General academic skills (c Self-assessment Schmidt et al. (2006) Perception of the quality	Medical knowled Inconsistent resu PBL vs. non-PBL	dge: ults between
Self-assessment Schmidt et al. (2006) Cogniti cours (problem- Self-assessment Schmidt et al. (2006) General academic skills (c Self-assessment Schmidt et al. (2006) Perception of the quality Steenkamp et al. (2004, 2006, 2008)	Medical knowled Inconsistent resu PBL vs. non-PBL	dge: ults between
Self-assessment Schmidt et al. (2006) Cogniti cauls (problem- Self-assessment Schmidt et al. (2006) General academic skills (c Self-assessment Schmidt et al. (2006) Perception of the quality Steenkamp et al. (2004, 2006, 2008) Retention rates	Medical knowled Inconsistent resu PBL vs. non-PBL	dge: ults between
Self-assessment Schmidt et al. (2006) Cogniti Jakus (problem- Self-assessment Schmidt et al. (2006) General academic skills (c Self-assessment Schmidt et al. (2006) Perception of the quality Steenkamp et al. (2004, 2006, 2008) Retention rates Post et al. (1986)	Medical knowled Inconsistent resu PBL vs. non-PBL vonducting research, writing, presenting p Volunteer graduates from Rotterdam of the curriculum Samples from all medical schools Graduates from all medical schools, entering 1970	dge: ults between

Table 24.1 Comparison between the performance of students and graduates of the Maastricht problem-based medical curriculum and conventional medical schools on various outcome measures

First author and publication year	Comparison groups	Statistically significant differences
Medical knowledge		
Answering questions abou	it knowledge	
Verwijnen et al. (1990)	Volunteers from schools A and B, May 1979–September 1980	B better than Maastricht and A
	Volunteers from schools A and B, September–November 1981	B better than Maastricht and A
	Volunteers from schools A and B, non-select sample from C, March- September 1983	No difference
	Random sample from school C, March 1983	No difference
Verhoeven et al. (1998)	Volunteers from the Nijmegen school, December 1994	No difference
	Volunteers from the Nijmegen school, March 1995	No difference
Van der Vleuten et al. (2004)	Populations from the Groningen and Nijmegen school; first 4 years of the Leiden school	Maastricht and Groningen better than Nijmegen and Leiden
Imbos et al. (1984)	Random sample from a non-disclosed medical school	Maastricht better
Prince et al. (2003)	Sample from all 7 other schools	No difference
Self-assessment		
Schmidt et al. (2006)	Volunteer graduates from Rotterdam	Rotterdam hetter than Maastricht
Diagnostic reasoning skills	5	
Diagnosing cases		
Schmidt et al. (1996)	Volunteers from Groningen and Amsterdam	Maastricht and Amsterdam better than Groningen
Schuwirth et al. (1999)	Volunteers from Groningen	Maastricht better than Groningen
Processing and recalling c	ases	
Boshuizen et al. (1994)	Small samples of volunteers from Amsterdam	Maastricht better than Amsterdam
Boshuizen & Claessen (1982)	Small samples of volunteers from Utrecht	Maastricht better than Utrecht on one task; no differences on the other
Interpersonal skills		
Assessment by observers		
Van Dalen et al. (2002)	Valunteers from Leiden	Maastricht better than Leiden
Self-assessment		
Prince et al. (2005)	Volunteer graduates from four unspecified medical schools	Maastricht better than the other 4 schools

First author and	Comparison groups	Statistically significant differences
publication year		
Schmidt et al. (2006)	Volunteer graduates from Rotterdam	Maastricht better than Rotterdam
Practical modical skills		
Physical examination asses	ised by observers	
Scherpbier (1997)	Volunteers from Groningen	Maastricht better than Groningen
Answering que, ions abou	ut physical examination	
Remmen et al. (1.199)	Volunteers from Ghent and Antwerp	Maastricht better than Ghent and Antwerp
Remmen et al. (2001)	Volunteers from Ghent, Antwerp and Groningen	Maastricht better than Groningen, both better than Ghent and > Antwerp
Self-assessment		
Schmidt et al. (2006)	Disaportic roac	aning chille
Cognitive skills (problem-s	🚺 Diagnostic reus	Oning Skills.
	N - - - - - - - - - -	· · · · · · · · · · · · · · · · · · ·
Self-assessment	📜 Consistently PB	I hased is
Self-assessment Schmidt et al. (2006)	Consistently PB	L based is
Self-assessment Schmidt et al. (2006) General academic ski ^{ll} (co	better than non	L based is PBL based
Self-assessment Schmidt et al. (2006) General academic skill (co Self-assessment	better than non	L based is PBL based
Self-assessment Schmidt et al. (2006) General academic skill (co Self-assessment Schmidt et al. (2006)	Consistently PB better than non	L based is PBL based
Self-assessment Schmidt et al. (2006) General academic skill (co Self-assessment Schmidt et al. (2006) Perception of the quality of	Consistently PB better than non Volunteer graduates from Rotterdam	L based is PBL based
Self-assessment Schmidt et al. (2006) General academic skill (cr Self-assessment Schmidt et al. (2006) Perception of the quality of Steenk inp et al. (2004, 2006, 2008)	Consistently PB better than non Volunteer graduates from Kotterdam of the curriculum Samples from all medical schools	L based is PBL based No difference Maastricht better than all
Self-assessment Schmidt et al. (2006) General academic skill (cr Self-assessment Schmidt et al. (2006) Perception of the quality of Steenk inp et al. (2004, 2000 (2008) Potention rates	Consistently PB better than non Volunteer graduates from Rotterdam of the curriculum Samples from all medical schools	L based is PBL based No difference Maastricht better than all
Self-assessment Schmidt et al. (2006) General academic skill (cr Self-assessment Schmidt et al. (2006) Perception of the quality of Steenkomp et al. (2004, 2006 (2008) Potention rates Post et al. (1986)	Consistently PB better than non Volunteer graduates from Rotterdam of the curriculum Samples from all medical schools Graduates from all medical schools, entering 1970	L based is PBL based No difference Maastricht better than all

First author and publication year	Comparison groups	Statistically significant differences
Medical knowledge		
Answering questions ab	out knowledge	
Verwijnen et al. (1990)	Volunteers from schools A and B, May 1979–September 1980	B better than Maastricht and A
	Volunteers from schools A and B, September–November 1981	B better than Maastricht and A
	Volunteers from schools A and B, non-select sample from C, March– September 1983	No difference
	Random sample from school C, March	No difference
Verhoeven et al. (Pl	hysical examination	n: ed is
Van der Vleuten ((2004)	, etter than non PBL I	based den
		Sasea
Imbos et al. (198		
Imbos et al. (198	medical school	
Imbos et al. (198 Prince et al. (2003)	medical school Sample from all 7 other schools	No difference
Imbos et al. (198 Prince et al. (2003) Self-assessment	medical school Sample from all 7 other schools	No difference
Imbos et al. (198 Prince et al. (2003) Self-assessment Schmidt et al. (2006)	medical school Sample from all 7 other schools Volunteer graduates from Rotterdam	No difference Rotterdam better than Maastricht
Imbos et al. (198 Prince et al. (2003) Self-assessment Schmidt et al. (2006) Diagnostic reasoning sk	medical school Sample from all 7 other schools Volunteer graduates from Rotterdam	No difference Rotterdam better than Maastricht
Imbos et al. (198 Prince et al. (2003) Self-assessment Schmidt et al. (2006) Diagnostic reasoning sk Diagnosing cases	medical school Sample from all 7 other schools Volunteer graduates from Rotterdam ills	No difference Rotterdam better than Maastricht
Imbos et al. (198 Prince et al. (2003) Self-assessment Schmidt et al. (2006) Diagnostic reasoning sk Diagnosting cases Schmidt et al. (1996)	medical school Sample from all 7 other schools Volunteer graduates from Rotterdam ills Volunteers from Groningen and Amsterdam	No difference Rotterdam better than Maastricht Maastricht and Amsterdam better than Groningen
Imbos et al. (198 Prince et al. (2003) Self-assessment Schmidt et al. (2006) Diagnostic reasoning sk Diagnosing cases Schmidt et al. (1996) Schuwirth et al. (1999)	medical school Sample from all 7 other schools Volunteer graduates from Rotterdam ills Volunteers from Groningen and Amsterdam Volunteers from Groningen	No difference Rotterdam better than Maastricht Maastricht and Amsterdam better than Groningen Maastricht better than Groningen
Imbos et al. (198 Prince et al. (2003) Self-assessment Schmidt et al. (2006) Diagnostic reasoning sk Diagnosing cases Schmidt et al. (1996) Schuwirth et al. (1999) Processing and recalling	medical school Sample from all 7 other schools Volunteer graduates from Rotterdam ills Volunteers from Groningen and Amsterdam Volunteers from Groningen g cases	No difference Rotterdam better than Maastricht Maastricht and Amsterdam better than Groningen Maastricht better than Groningen
Imbos et al. (198 Prince et al. (2003) Self-assessment Schmidt et al. (2006) Diagnostic reasoning sk Diagnosing cases Schmidt et al. (1996) Schuwirth et al. (1999) Processing and recalling Boshuizen et al. (1994)	medical school Sample from all 7 other schools Volunteer graduates from Rotterdam ills Volunteers from Groningen and Amsterdam Volunteers from Groningen g cases Small samples of volunteers from Amsterdam	No difference Rotterdam better than Maastricht Maastricht and Amsterdam better than Groningen Maastricht better than Groningen Maastricht better than Amsterdam
Imbos et al. (198 Prince et al. (2003) Self-assessment Schmidt et al. (2006) Diagnostic reasoning sk Diagnosing cases Schmidt et al. (1996) Schuwirth et al. (1999) Processing and recalling Boshuizen et al. (1994) Boshuizen & Claessen (1982)	medical school Sample from all 7 other schools Volunteer graduates from Rotterdam ills Volunteers from Groningen and Amsterdam Volunteers from Groningen grasses Small samples of volunteers from Amsterdam Small samples of volunteers from Utrecht	No difference Rotterdam better than Maastricht Maastricht and Amsterdam better than Groningen Maastricht better than Groningen Maastricht better than Amsterdam Maastricht better than Utrecht on one task; no differences on the other
Imbos et al. (198 Prince et al. (2003) Self-assessment Schmidt et al. (2006) Diagnostic reasoning sk Diagnosing cases Schmidt et al. (1996) Schuwirth et al. (1999) Processing and recalling Boshuizen et al. (1994) Boshuizen & Claessen (1982) Interpersonal skills	medical school Sample from all 7 other schools Volunteer graduates from Rotterdam ills Volunteers from Groningen and Amsterdam Volunteers from Groningen g cases Small samples of volunteers from Amsterdam Small samples of volunteers from Utrecht	No difference Rotterdam better than Maastricht Maastricht and Amsterdam better than Groningen Maastricht better than Groningen Maastricht better than Amsterdam Maastricht better than Utrecht on one task; no differences on the other
Imbos et al. (198 Prince et al. (2003) Self-assessment Schmidt et al. (2006) Diagnostic reasoning sk Diagnostic reasoning sk Diagnostic reasoning sk Diagnostic reasoning sk Diagnostic reasoning sk Diagnostic reasoning sk Schuwirth et al. (1996) Schuwirth et al. (1996) Processing and recalling Boshuizen et al. (1994) Boshuizen & Claessen (1982) Interpersonal skills Assessment by observer	medical school Sample from all 7 other schools Volunteer graduates from Rotterdam ills Volunteers from Groningen and Amsterdam Volunteers from Groningen (cases Small samples of volunteers from Amsterdam Small samples of volunteers from Utrecht	No difference Rotterdam better than Maastricht Maastricht and Amsterdam better than Groningen Maastricht better than Groningen Maastricht better than Amsterdam Maastricht better than Utrecht on one task; no differences on the other
Imbos et al. (198 Prince et al. (2003) Self-assessment Schmidt et al. (2006) Diagnostic reasoning sk Diagnosing cases Schmidt et al. (1996) Schuwirth et al. (1999) Processing and recalling Boshuizen et al. (1994) Boshuizen & Claessen (1982) Interpersonal skills Assessment by observer Van Dalen et al. (2002)	medical school Sample from all 7 other schools Volunteer graduates from Rotterdam ills Volunteers from Groningen and Amsterdam Volunteers from Groningen g cases Small samples of volunteers from Amsterdam Small samples of volunteers from Utrecht	No difference Rotterdam better than Maastricht Maastricht and Amsterdam better than Groningen Maastricht better than Groningen Maastricht better than Amsterdam Maastricht better than Utrecht on one task; no differences on the other Maastricht better than Leiden
Imbos et al. (198 Prince et al. (2003) Self-assessment Schmidt et al. (2006) Diagnostic reasoning sk Diagnosing cases Schmidt et al. (1996) Schuwirth et al. (1999) Processing and recalling Boshuizen et al. (1994) Boshuizen & Claessen (1982) Interpersonal skills Assessment by observei Van Dalen et al. (2002) Self-assessment	medical school Sample from all 7 other schools Volunteer graduates from Rotterdam ills Volunteers from Groningen and Amsterdam Volunteers from Groningen grasses Small samples of volunteers from Amsterdam Small samples of volunteers from Utrecht	No difference Rotterdam better than Maastricht Maastricht and Amsterdam better than Groningen Maastricht better than Groningen Maastricht better than Amsterdam Maastricht better than Utrecht on one task; no differences on the other Maastricht better than Leiden

First author and publication year	Comparison groups	Statistically significant differences
Schmidt et al. (2006)	Volunteer graduates from Rotterdam	Maastricht better than Rotterdam
Practical medical skills		
Physical examination asse	ssed by observers	
Scherpbier (1997)	Volunteers from Groningen	Maastricht better than Groningen
Answering questions abo	ut physical examination	
Remmen et al. (1999)	Volunteers from Ghent and Antwerp	Maastricht better than Ghent and Antwerp
Remmen et al. (2001)	Volunteers from Ghent, Antwerp and Groningen	Maastricht better than Groningen, both better than Ghent and Antwerp
Self-assessment		
Schmidt et al. (2006)	Volunteer graduates from Rotterdam	Maastricht better than Rotterdam
Cognitive skills (problem s	olving, seeking information)	
Self-assessment		
Schmidt et al. (2006)	Volunteer graduates from Rotterdam	Maastricht better than Rotterdam
General academic skills (c	onducting research, writing, presenting p	apers)
Self-assessment		
schmidt et al. (2006)	Volunteer graduates from Rotterdam	No difference
Perception of the quality	of the curriculum	
Steenkamp et al. (2004, 2006, 2008)	Samples from all medical schools	Maastricht better than all
Retention rates		
Post et al. (1986)	Graduates from all medical schools, entering 1970	Maastricht better than all
schmidt et al. (2009a)	Graduates from all medical schools,	Maastricht better than all

Table 24.4 (mating 0) Commission Late

irst author and publication year	Comparison groups	Statistically significant differences
Vedical knowledge		
Answering questions abo	ut knowledge	
/erwijnen et al. (1990)	Volunteers from schools A and B, May 1979–September 1980	B better than Maastricht and A
	Volunteers from schools A and B, September–November 1981	B better than Maastricht and A
	Volunteers from schools A and B, non-select sample from C, March– September 1983	No difference
	Random sample from school C, March 1983	No difference
Verhoeven et al. (1998)	Volunteers from the Nijmegen school, December 1994	No difference
	Volunteers from the Nijmegen school, March 1995	No difference
Van der Vleuten et al.	Populations from the Groningen and	Maastricht and Groningen better
(2004) Imbos et al. (198 Prince et al. (200	ognitive skills: PBL b	based is
(2004) Imbos et al. (198 Prince et al. (200 Self-assessment Schmidt et al. (20	o gnitive skills : PBL k etter than non PBL k	pased is pased
(2004) Imbos et al. (198 Prince et al. (200 Self-assessment Schmidt et al. (20 Diagnostic reasor	o gnitive skills : PBL k etter than non PBL k	based is based
(2004) Imbos et al. (198 Prince et al. (200 Self-assessment Schmidt et al. (20 Diagnostic reasor Diagnostig cases	o gnitive skills : PBL k etter than non PBL k	based is based Maastricht
(2004) Imbos et al. (198 Prince et al. (200 Self-assessment Schmidt et al. (20 Diagnostic reason Diagnostic reason Schmidt et al. (1996)	Ognitive skills : PBL k etter than non PBL k Volunteers from Groningen and Amsterdam	Dased is Dased Maastricht Maastricht and Amsterdam better than Groningen
(2004) Imbos et al. (198 Prince et al. (200 Self-assessment Schmidt et al. (20 Diagnostic reason Diagnosing cases Schmidt et al. (1996) Schuwirth et al. (1999)	Ognitive skills : PBL k etter than non PBL k Volunteers from Groningen and Amsterdam Volunteers from Groningen	Dased is Dased Maastricht Maastricht and Amsterdam better than Groningen Maastricht better than Groningen
(2004) Imbos et al. (198 Prince et al. (200 Self-assessment Schmidt et al. (20 Diagnostic reasor Diagnosing cases Schmidt et al. (1996) Schuwirth et al. (1999) Processing and recalling	Ognitive skills : PBL k etter than non PBL k Volunteers from Groningen and Amsterdam Volunteers from Groningen cases	Maastricht and Amsterdam better than Groningen Maastricht better than Groningen
(2004) Imbos et al. (198 Prince et al. (200 Self-assessment Schmidt et al. (20 Diagnostic reasor Diagnosing cases Schmidt et al. (1996) Schuwirth et al. (1999) Processing and recalling Boshuizen et al. (1994)	Ognitive skills : PBL k etter than non PBL k Volunteers from Groningen and Amsterdam Volunteers from Groningen cases Small samples of volunteers from Amsterdam	Maastricht and Amsterdam better than Groningen Maastricht better than Groningen Maastricht better than Amsterdam
(2004) Imbos et al. (198 Prince et al. (200 Self-assessment Schmidt et al. (20 Diagnostic reasor Diagnosing cases Schmidt et al. (1996) Schuwirth et al. (1996) Schuwirth et al. (1999) Processing and recalling Boshuizen et al. (1994) Boshuizen & Claessen (1982)	Ognitive skills : PBL k etter than non PBL k Volunteers from Groningen and Amsterdam Volunteers from Groningen cases Small samples of volunteers from Amsterdam Small samples of volunteers from Utrecht	Maastricht and Amsterdam better than Groningen Maastricht better than Groningen Maastricht better than Amsterdam Maastricht better than Amsterdam Maastricht better than Utrecht on one task; no differences on the other
(2004) Imbos et al. (198 Prince et al. (200 Self-assessment Schmidt et al. (200 Diagnostic reason Diagnosing cases Schmidt et al. (1996) Schuwirth et al. (1996) Schuwirth et al. (1999) Processing and recalling Boshuizen et al. (1994) Boshuizen & Claessen (1982) Interpersonal skills	Ognitive skills : PBL k etter than non PBL k Volunteers from Groningen and Amsterdam Volunteers from Groningen cases Small samples of volunteers from Amsterdam Small samples of volunteers from Utrecht	Maastricht and Amsterdam better than Groningen Maastricht better than Groningen Maastricht better than Amsterdam Maastricht better than Utrecht on one task; no differences on the other
(2004) Imbos et al. (198 Prince et al. (200 Self-assessment Schmidt et al. (200 Diagnostic reason Diagnosing cases Schmidt et al. (1996) Schuwirth et al. (1996) Schuwirth et al. (1999) Processing and recalling Boshuizen et al. (1994) Boshuizen & Claessen (1982) Interpersonal skills Assessment by observers	Ognitive skills : PBL k etter than non PBL k Volunteers from Groningen and Amsterdam Volunteers from Groningen cases Small samples of volunteers from Amsterdam Small samples of volunteers from Utrecht	Maastricht and Amsterdam better than Groningen Maastricht better than Groningen Maastricht better than Amsterdam Maastricht better than Utrecht on one task; no differences on the other
(2004) Imbos et al. (198 Prince et al. (200 Self-assessment Schmidt et al. (200 Diagnostic reasor Diagnosing cases Schmidt et al. (1996) Schuwirth et al. (1996) Processing and recalling Boshuizen et al. (1994) Boshuizen & Claessen (1982) Interpersonal skills Assessment by observers Van Dalen et al. (2002)	Small samples of volunteers from Cases Small samples of volunteers from Volunteers from Leiden	Maastricht and Amsterdam better than Groningen Maastricht better than Groningen Maastricht better than Groningen Maastricht better than Utrecht on one task; no differences on the other Maastricht better than Leiden
(2004) Imbos et al. (198 Prince et al. (200 Self-assessment Schmidt et al. (200 Diagnostic reasor Diagnosing cases Schmidt et al. (1996) Schuwirth et al. (1996) Schuwirth et al. (1999) Processing and recalling Boshuizen et al. (1994) Boshuizen & Claessen (1982) Interpersonal skills Assessment by observers Van Dalen et al. (2002) Self-assessment	Description of the sector of t	Maastricht and Amsterdam better than Groningen Maastricht better than Groningen Maastricht better than Amsterdam Maastricht better than Utrecht on one task; no differences on the other Maastricht better than Leiden

First author and publication year	Comparison groups	Statistically significant differences
Schmidt et al. (2006)	Volunteer graduates from Rotterdam	Maastricht better than Rotterdam
Practical medical skills		
Physical examination asse	ssed by observers	
Scherpbier (1997)	Volunteers from Groningen	Maastricht better than Groningen
Answering questions abo	ut physical examination	
Remmen et al. (1999)	Volunteers from Ghent and Antwerp	Maastricht better than Ghent and Antwerp
Remmen et al. (2001)	Volunteers from Ghent, Antwerp and Groningen	Maastricht better than Groningen, both better than Ghent and Antwerp
Self-assessment		
Schmidt et al. (2006)	Volunteer graduates from Notterdam	Maastricht better than Rotterdam
Cognitive skills (problem-	solving, seeking information)	
Self-assessment		
Schmidt et al. (2006)	Volunteer graduates from Rotterdam	Maastricht better than Rotterdam
General academic skills (c	onducting research, writing, presenting p	apers)
Self-assessment		
Schmidt et al. (2006)	Volunteer graduates from Rotterdam	No difference
Perception of the quality	of the curriculum	
Steenkamp et al. (2004, 2006, 2008)	Samples from all medical schools	Maastricht better than all
Retention rates		
Post et al. (1986)	Graduates from all medical schools, entering 1970	Maastricht better than all
Schmidt et al. (2009a)	Graduates from all medical schools,	Maastricht better than all

Henk van Berkel, Albert Scherpbier, Harry Hillen, Cees van Der Vleuten. (2010). Lessons from Problem-Based Learning. New York, Oxford University Press, pg 229-230

we lead

First author and publication year	Comparison groups	Statistically significant differences
Medical knowledge		
Answering questions abo	ut knowledge	
/erwijnen et al. (1990)	Volunteers from schools A and B, May 1979–September 1980	B better than Maastricht and A
	Volunteers from schools A and B, September–November 1981	B better than Maastricht and A
	Volunteers from schools A and B, non-select sample from C, March– September 1983	No difference
	Random sample from school C, March 1983	No difference
Verhoeven et al. (1998)	Volunteers from the Nijmegen school, December 1994	No difference
Imbos et al. (19 bas	sed is better than n sed	on PBL
Imbos et al. (19 bas Prince et al. (20 bas Self-assessment	sed is better than n sed	on PBL
Imbos et al. (19 Prince et al. (20 Self-assessment Schmidt et al. (2006)	sed is better than n sed Volunteer graduates from Rotterdam	ON PBL
Imbos et al. (19 Prince et al. (20 Self-assessment Schmidt et al. (2006) Diagnostic reaso	sed is better than n sed Volunteer graduates from Rotterdam	ON PBL Rotterdam better than Maastricht
Imbos et al. (19 Prince et al. (20 Self-assessment Schmidt et al. (2006) Diagnostic reaso Diagnosing case Pe	sed is better than n sed ^{Volunteer graduates from Rotterdam}	ON PBL Rotterdam better than Maastricht
Imbos et al. (19 Prince et al. (20 Self-assessment Schmidt et al. (2006) Diagnostic reaso Diagnosing case Schmidt et al. (1)	sed is better than n sed ^{Volunteer graduates from Rotterdam} rception of the qua	on PBL Rotterdam better than Maastricht Ality of based is
Imbos et al. (19 Prince et al. (20 Self-assessment Schmidt et al. (2006) Diagnostic reaso Diagnostic reaso Schmidt et al. (1 Schuwirth et al.	sed is better than n sed ^{Volunteer graduates from Rotterdam} rception of the qua e curriculum: PBL b	on PBL Rotterdam better than Maastricht ality of ased is Groningen
Imbos et al. (19 Prince et al. (20 Self-assessment Schmidt et al. (2006) Diagnostic reaso Diagnosing case Schmidt et al. (1 Schuwirth et al. Processing and r	sed is better than n sed ^{Volunteer graduates from Rotterdam} <i>rception of the quo</i> <i>e curriculum</i> : PBL b rceive more positiv	on PBL Rotterdam better than Maastricht ality of based is re than
Imbos et al. (19 Prince et al. (20 Self-assessment Schmidt et al. (2006) Diagnostic reaso Diagnostic reaso Diagnostic reaso Schmidt et al. (1 Schuwirth et al. (1 Schuwirth et al. (1 Processing and r Boshuizen et al. (1)	sed is better than n sed ^{Volunteer graduates from Rotterdam} <i>rception of the quo</i> <i>e curriculum</i> : PBL b rceive more positiv n PBL based	on PBL Rotterdam better than Maastricht ality of based is re than Amsterdam
Imbos et al. (19 Prince et al. (20 Self-assessment Schmidt et al. (2006) Diagnostic reaso Diagnostic reaso Diagnos	sed is better than n sed Volunteer graduates from Rotterdam rception of the quid e curriculum: PBL b rceive more positiv n PBL based Small samples of volunteers from Utrecht	on PBL Rotterdam better than Maastricht ased is re than Maastricht better than Utrecht on one task; no differences on the other
Imbos et al. (19 Prince et al. (20 Self-assessment Schmidt et al. (2006) Diagnostic reaso Diagnostic reaso Schmidt et al. (1 Schuwirth et al. Processing and r Boshuizen et al. Boshuizen et al. Boshuizen & Claessen (1982)	sed is better than n sed Volunteer graduates from Rotterdam rception of the quo e curriculum : PBL b rceive more positiv n PBL based Small samples of volunteers from Utrecht	on PBL Rotterdam better than Maastricht ality of based is re than Maastricht better than Utrecht on one task; no differences on the other
Imbos et al. (19 Prince et al. (20 Self-assessment Schmidt et al. (2006) Diagnostic reaso Diagnostic reaso Chuwirth et al. (1 Schuwirth et al. (1 Processing and r Boshuizen et al. (1 Boshuizen et al. (1 Processing and r Boshuizen et al. (1 Boshuizen et al. (1 Boshuize	sed is better than n sed Volunteer graduates from Rotterdam rception of the quo e curriculum : PBL b rceive more positiv n PBL based Small samples of volunteers from Utrecht	on PBL Rotterdam better than Maastricht ality of based is re than Maastricht better than Utrecht on one task; no differences on the other
Imbos et al. (19 Prince et al. (20 Self-assessment Schmidt et al. (2006) Diagnostic reaso Diagnosing case Schwirth et al. (1 Processing and r Boshuizen et al. (1 Boshuizen et al. (1 Processing and r Boshuizen et al. (1 Boshuizen et al. (1 Processing and r Boshuizen et al. (2002)	sed is better than n sed Volunteer graduates from Rotterdam rception of the quo e curriculum: PBL b rceive more positiv n PBL based Small samples of volunteers from Utrecht Volunteers from Leiden	Ansterdam better than Maastricht blity of based is re than Maastricht better than Utrecht on one task; no differences on the other Maastricht better than Leiden
Imbos et al. (19 Prince et al. (20 Self-assessment Schmidt et al. (2006) Diagnostic reaso Diagnostic reaso Diagnostic reaso Diagnostic reaso Charlet et al. (2006) Diagnostic reaso Diagnostic reaso Diagnostic reaso Pe the pe nO Boshuizen et al. (1982) Interpersonal skills Assessment by observers Van Dalen et al. (2002) Self-assessment	sed is better than n sed Volunteer graduates from Rotterdam rception of the quo e curriculum: PBL b rceive more positiv n PBL based Small samples of volunteers from Utrecht Volunteers from Leiden	Anstricht better than Utrecht on one task; no differences on the other

First author and publication year	Comparison groups	Statistically significant differences
Schmidt et al. (2006)	Volunteer graduates from Rotterdam	Maastricht better than Rotterdam
Practical medical skills		
Physical examination asses	ssed by observers	
Scherpbier (1997)	Volunteers from Groningen	Maastricht better than Groningen
Answering questions about	ut physical examination	
Remmen et al. (1999)	Volunteers from Ghent and Antwerp	Maastricht better than Ghent and Antwerp
Remmen et al. (2001)	Volunteers from Ghent, Antwerp and Groningen	Maastricht better than Groningen, both better than Ghent and Antwerp
Self-assessment		
Schmidt et al. (2006)	Volunteer graduates from Rotterdam	Maastricht better than Rotterdam
Cognitive skills (problem-s	olving, seeking information)	
Self-assessment		
Schmidt et al. (2006)	volunteer graduates from Kotterdam	Maastricht better than Kotterdam
General academic skills (co	onducting research, writing, presenting p	apers)
Self-assessment		
Schmidt et al. (2006)	Volunteer graduates from Rotterdam	No difference
Perception of the quality of	of the curriculum	
Steenkamp et al. (2004, 2006, 2008)	Samples from all medical schools	Maastricht better than all
Retention rates		
Post et al. (1986)	Graduates from all medical schools, entering 1970	Maastricht better than all
Schmidt et al. (2009a)	Graduates from all medical schools,	Maastricht better than all

Henk van Berkel, Albert Scherpbier, Harry Hillen, Cees van Der Vleuten. (2010). Lessons from Problem-Based Learning. New York, Oxford University Press, pg 229-230

we lead



ANTICIPATED CL IN PBL

 Task complexity and the

 learner's prior knowledge



EL Instructional features that are not beneficial for learning

Low to Moderate

SPL Instructional features that are beneficial for learning Moderate to High



RESEARCH QUESTIONS

www.usm.my

3 Questions

- To what extent does CLS distinguishably measure IL, EL & SPL in PBL setting?
- Does CLS is a reliable measurement tool of cognitive loads in PBL setting?
- To what extent does CLS score reflect the anticipated cognitive loads in PBL?



Study Design

• A cross sectional for a validation study.

Sample Size

 Calculated sample size: 50 to 100 sample is adequate (10 item self-rating; 5-10 samples per item) (Costello & Osborne, 2005).

Sampling

Purposive sampling method.



MATERIALS & METHODS

Participants

- 125 first year medical students in 2015/2016 academic session.
- SPICES (student-centred, problem-based, integrated, community-based, elective, systematic and spiral) medical curriculum.
- 15 PBL groups (8-9 students per group).
- 25 PBL sessions.
- Per PBL, 2 meetings, 2 hours per meeting, usually scheduled at the beginning and end of each week.



Data Collection

- CLS was administered the medical students immediately after the first PBL meeting.
- CLS was immediately collected after the first PBL meeting.
- Participation was voluntary.
- A short briefing (less than 5 min) on the CLS was provided to the participants and completion of CLS was expected to take less than 5 min.



MATERIALS & METHODS

COGNITIVE LOAD SCALE

Dear student,

This inventory measures your cognitive load during the Problem-based learning (PBL) session. All of the following 10 questions refer to the PBL session that has just finished. Please take your time to read each of the questions carefully and please tick (v) your response on the column based on the following rating scale:

Completely the case

Not all the case

1 2 3 4 5 6 7 8 9 10

A ten-point semantic rating scale

Figure 1: The Cognitive Load Scale

Measures participant's subjective ratings



Interpretation of the mean score of each:

Low level = 0-4

Moderate level = more than 4 and less than 7

High level = 7 and more



Data Analysis

• CFA was performed by AMOS 22 to examine its internal structure:

- Construct validity: Goodness of Fit Indices (Table 1)

Name of category	Name of index	Level of acceptance
Absolute fit ¹	Root Mean Square of Error Approximation (RMSEA)	less than 0.08 (Browne & Cudeck, 1992)
	Goodness of Fit Index (GFI)	more than 0.9 (Jöreskog & Sörbom, 1984)
Incremental Fit ²	Comparative Fit Index (CFI)	more than 0.9 (Bentler, 1990)
	Tucker-Lewis Index (TLI)	more than 0.9 (Bentler & Bonett, 1980)
	Normed Fit Index (NFI)	more than 0.9 (Bollen, 1989)
Parsimonious fit ³	Chi Square/Degree of Freedom (Chisq/df)	less than 5 (Marsh & Hocevar, 1985)

Table 1: Goodness of fit indices that were used to signify model fit.

¹Absolute Fit: Measures overall goodness-of-fit for both the structural and measurement models collectively. This type of measure does not make any comparison to a specified null model (incremental fit measure) or adjust for the number of parameters in the estimated model (parsimonious fit measure). ²Incremental Fit: Measures goodness-of-fit that compares the current model to a specified "null" (independence) model to determine the degree of improvement over the null model. ³Parsimonious Fit: Measures goodness-of-fit representing the degree of model fit per estimated coefficient. This measure attempts to correct for any "overfitting" of the model and evaluates the parsimony of the model compared to the goodness-of-fit.



Data Analysis

- CFA was performed by AMOS 22 to examine its internal structure:
 - Construct validity: Goodness of Fit Indices (Table 1)
 - Convergent validity: 1) Factor loading (more than 0.5); 2) Average variance extracted (AVE; more than 0.5); 3) Composite reliability (CR; more than 0.6) (Hair et al., 2009; Streiner & Norman, 2008; Zainudin, 2012).
 - Discriminant validity: 1) AVE value higher than SV values (Fornell & Larcker, 1981); 2) A correlation between constructs of less than 0.85 (Brown, 2006).



Data Analysis

 Reliability analysis was performed by SPSS 22 to examine its internal consistency – Cronbach's alpha value more than 0.7 is considered as high internal consistency (Streiner &

Norman, 2008) -





Construct Validity

 The original three-factor CLS with 10 items achieved acceptable values on the goodness-offit indices, suggesting a good model fit.

Variable	X^2 – statistic (df)) p-value Goodness of fit		Goodness of fit indices				
			ChiSq/df	RMSEA	GFI	CFI	NFI	TLI
One-factor model ^a	295.003 (35)	< 0.001	8.429	0.284	0.619	0.650	0.625	0.549
3-factor model ^a	36.885 (32)	0.253	1.153	0.041	0.929	0.993	0.953	0.991
	50.005 (52)	0.200	1.1.55	0.041	0.727	0.775	0.755	0.7

Table 2: The results of confirmatory factor analysis of CLS.

^a The original construct of the CLS was supported for a model fit.





Reliability

• CLS achieved high internal consistency, indicated by Cronbach's alpha more than 0.7.

No	Item	Standardized factor loading	^b Domain	^a Cronbach's Alpha	^c AVE	dCR
1	The topics covered in the PBL were very complex.	0.76	Intrinsic load	0.88	0.73	0.89
2	The PBL covered terminologies that I perceived as very complex.	0.95				
3	The PBL covered concepts and definitions that I perceived as very complex.	0.84				
4	The instructions and explanations during the PBL were very unclear.	0.87	Extraneous load	0.82	0.62	0.83
5	The instructions and explanations during the PBL were full of unclear language.	0.84				
6	The instructions and explanations during the PBL were, in terms of learning, very ineffective.	0.63				
7	The PBL really enhanced my understanding of the topics covered.	0.77	Self-perceived learning	0.95	0.84	0.95
8	The PBL really enhanced my understanding of the terminologies covered.	0.91	-			
9	The PBL really enhanced my knowledge of concepts and definitions.	0.97				
10	The PBL really enhanced my knowledge and understanding of the subject.	0.99				

^a Reliability analysis; Cronbach's alpha coefficient.

^b Domains were predetermined based on a previous study.

^c AVE (Average Variance Extracted) was calculated manually based on formula given by Fornell & Larcker.⁵¹





Convergent Validity

• CLS achieved good convergent validity, indicated by factor loading and AVE more than 0.5, and CR more than 0.5 (Hair et al., 2009; Streiner & Norman, 2008; Zainudin, 2012).

No	Item	Standardized factor loading	^b Domain	^a Cronbach's Alpha	^c AVE	^d CR
1	The topics covered in the PBL were very complex.	0.76	Intrinsic load	0.88	0.73	0.89
2	The PBL covered terminologies that I perceived as very complex.	0.95				
3	The PBL covered concepts and definitions that I perceived as very complex.	0.84				
4	The instructions and explanations during the PBL were very unclear.	0.87	Extraneous load	0.82	0.62	0.83
5	The instructions and explanations during the PBL were full of unclear language.	0.84				
6	The instructions and explanations during the PBL were, in terms of learning, very ineffective.	0.63				
7	The PBL really enhanced my understanding of the topics covered.	0.77	Self-perceived learning	0.95	0.84	0.95
8	The PBL really enhanced my understanding of the terminologies covered.	0.91	U			
9	The PBL really enhanced my knowledge of concepts and definitions.	0.97				
10	The PBL really enhanced my knowledge and understanding of the subject.	0.99				

^a Reliability analysis; Cronbach's alpha coefficient.

^b Domains were predetermined based on a previous study.

^c AVE (Average Variance Extracted) was calculated manually based on formula given by Fornell & Larcker.⁵¹





Discriminant Validity

• CLS achieved acceptable discriminant validity, indicated by 1) correlation between IL, EL & SPL construct less than 0.85 (Fornell & Larcker, 1981) and 2) AVE values more than SV values (Brown, 2006)



Table 4: AVE and SV of the CLS based on the fin	inal model.
---	-------------

Factors	AVE	SV by factor		
		IL	EL	SPL
Intrinsic load	0.73	1	0.017	0.029
Extraneous load	0.62	0.017	1	0.096
Self-perceived learning	0.84	0.029	0.096	1

Figure 2: Correlation between three CLS constructs based on the final model.



RESULTS

Table 5: The mean and s	standard	deviation of	f the CLS scores.
CLS domain	Ν	Mean	Std. Deviation
Intrinsic load	93	6.33	1.83
Extraneous load	93	3.72	2.06
Self-perceived learning	93	7.05	1.89

Task complexity and thelearner's prior knowledge

Instructional features that are **not beneficial for learning**

SPL

EL

Instructional features that are beneficial for learning





DISCUSSION

INTERNAL STRUCTURE

- CLS has good:
 - ✓ construct validity
 - ✓ convergent validity
 - ✓ discriminant validity
- Cronbach's alpha values of CLS constructs ranged from 0.82 to 0.95.
 - Leppink et al (2013) reported the Cronbach's alpha ranged from 0.75 to 0.82 (statistics).
 - Leppink et al (2014) reported the Cronbach's alpha ranged from 0.79 to 0.95 (statistics & language)



Effects of pairs of problems and examples on task performance and different types of cognitive load

Jimmie Leppink^{a,*}, Fred Paas^{b,c}, Tamara van Gog^b, Cees P.M. van der Vleuten^a, Jeroen J.G. van Merriënboer^a

^a Department of Educational Development and Research, Maastricht University, The Netherlands ^b Institute of Psychology, Erasmus University Rotterdam, The Netherlands "Interdisciplinary Educational Research Institute, University of Wollongong, Australia



INTERNAL STRUCTURE

 These facts suggest CLS has a stable validity with high internal consistency across datasets of different population: Social & health sciences students (lecture in statistics & language); Health sciences freshman (lecture in statistics); Medical students (PBL).



PBL & CL PBL imposed a moderate intrinsic load Anticipated Finding IL Task complexity and the learner's prior knowledge

EL

Instructional features that are not beneficial for learning

SPL Instructional features that are beneficial for learning





Instructional features that are beneficial for learning







DISCUSSION

PBL & CL

- These findings suggest that the students invested more mental effort processing the IL than the EL.
- These findings fit the concept of PBL because:
 - → students were exposed to complex clinical-based triggers despite being novices;
 - Students have autonomy in learning because they were able to decide the content of discussion and deliver information in a manner that could be easily understood by their peers;
 - →students could learn at their own pace with the appropriate use of available resources.
- This suggests consequence validity of CLS scores in PBL setting → the score reflects the anticipated CL of PBL.



DISCUSSION

LIMITATIONS

- This study was **conducted at a medical school**, the findings **might not be generalizable** to other institutions.
- This study was **conducted after one PBL session**, which might **not completely reflect** the **respondents' judgments** regarding "the PBL".
- These data assessed the construct validity of the questionnaire merely of its internal structure without manipulation of PBL elements that is known to make difference in term of either the IL or EL.
- The sample size was relatively small, so the findings should be interpreted with caution.



IMPLICATIONS

- CLS should be **used as a diagnostic feedback** measure before making any improvisations to PBL instruction.
- Future research should contribute towards a better understanding of how CLT could be adopted in PBL without jeopardizing the concept of PBL.
- Students' cognitive loads should not be limited to one or several PBL sessions, but should be measured longitudinally across different durations.
- Further study would benefit from an additional randomized controlled experiment that uses the current questionnaire and manipulates an element in the PBL session (experimental vs. control condition) that is known to make a difference in terms of either the IL or EL.



CONCLUSION

- This study supports the construct validity, reliability, feasibility and significance of the CLS as a tool to measure cognitive loads of medical students during PBL.
- This study warrants the need for more research to explore students' mental workload during PBL session for improving PBL instruction for future implementation.

Hadie SNH, Yusoff MSB. Assessing the validity of the cognitive load scale in a problem-based learning setting. J Taibah Univ Med Sc, 2016;11(3):194-202. http://dx.doi.org/10.1016/j.jtumed.2016.04.001 On behalf of the editorial board members, you are invited to submit educational papers to Education in Medicine Journal at www.eduimed.com

The journal is an open access journal that does not charge any fee to authors and readers as it is supported by Universiti Sains Malaysia Press.



Looking forward to receive your submission.

Dr Saiful, MD, MMEd, PhD Editor in Chief Education in Medicine Journal



UNIVERSITI SAINS MALAYSIA Q&A

Thank You

msaiful_bahri@usm.my snurma@usm.my