



Lifelong learning as a driver for designing pervasive technology.... creating learning technology for the future

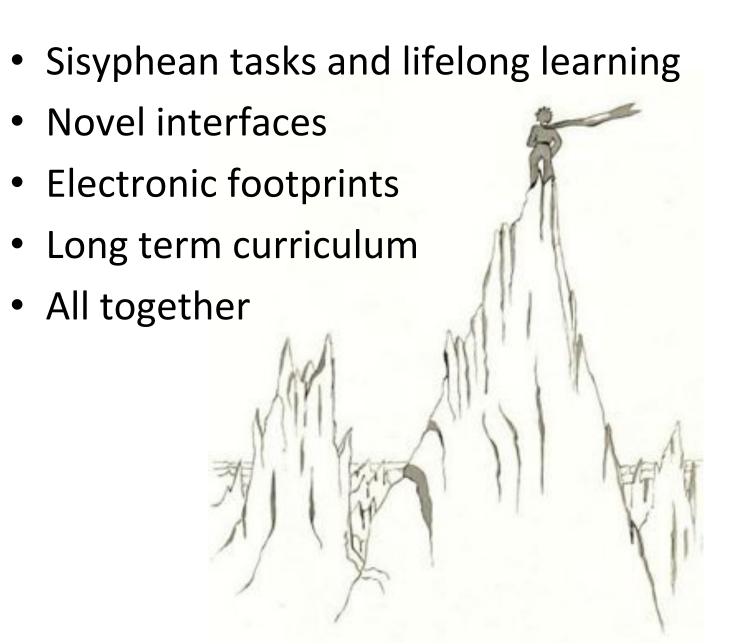
Judy Kay

CHAI: Computer Human Adapted Interaction Research Group
School of Information Technologies
University of Sydney
Immediate Past President of the AIED Society

Programme co-Chair ITS2010, General Chair AIED2011, Programme co-Chair Pervasive 2012







A personal example

Goal: I want to improve my posture





Improve (maintain) posture

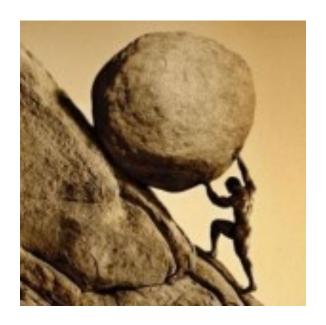
- Tell me when I am:
 - Doing the wrong things eg slouching
 - Being too inactive
- Help me find:
 - "Stuff I've Seen" about posture
 - new things I can do and be inspired to do them
- Help me to:
 - make a plan
 - Remember to do things I planned to do
 - monitor my performance
 - Revise my plans
- Share parts of my learner model with:
 - a health professionals
 - a friend/buddy with similar goals
 - a community of posture improvers



This is a Sisyphean Task



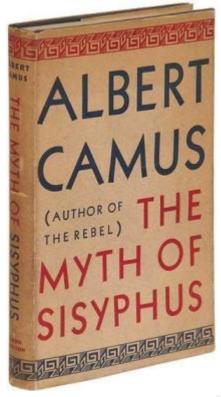


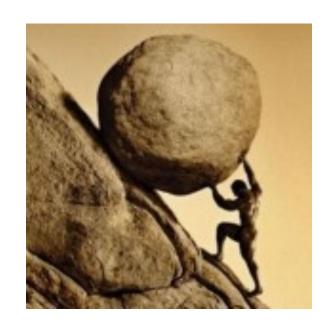


Sisyphus
had to push a rock up a hill
he had to work alone

every day it rolled down as he neared the top



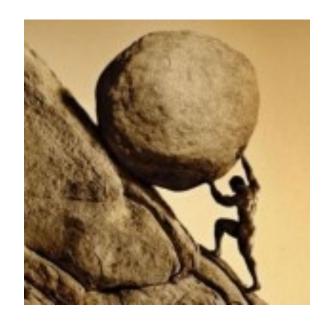




Camus: "The struggle itself [...] is enough to fill a man's heart. One must imagine Sisyphus happy."

chai ::





Sisyphean tasks

are done repeatedly

to achieve important *lifelong goals*perhaps without apparent "progress"





Could it be that
Sisyphus had
trouble detecting his
progress?

Personal Informatics Know thyself.



Quantified Self self knowledge through numbers



Another class of Sisyphean tasks





5,000 Learn X to 10,000 hour skill level Eg X = Programming

- Tell me when I am:
 - Doing the wrong things eg writing spagetti code
 - Being slow in clocking up purposeful practice hours
- Help me find:
 - "Stuff I've Seen" about programming well
 - new things I can do be inspired to do them
- Help me to:
 - make a plan
 - Remember to do things I planned to do
 - monitor my performance
 - Revise my plans
- Share parts of my learner model with:
 - a health professionals
 - a friend/buddy with similar goals
 - a community of programmers



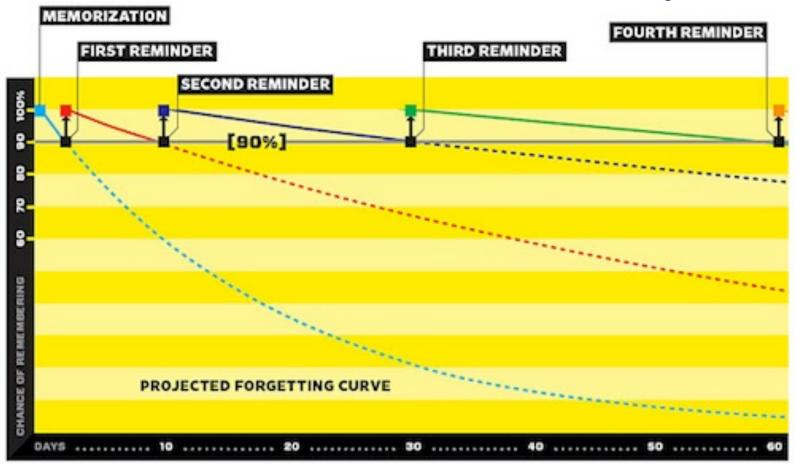
chai::

and examples of really long term tasks



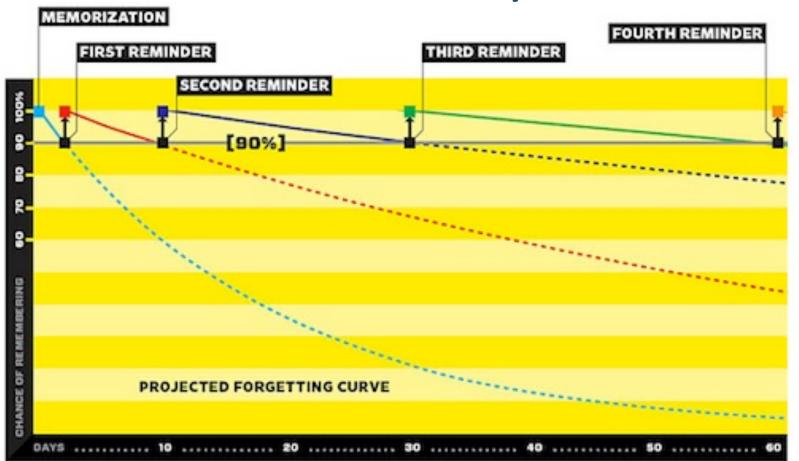


Spaced repetition – to learn and remember vocabulary





Spaced repetition – to learn and remember chemistry, maths,





How to get there? A challenging and long journey...



Kay, J, Pervasive personalised lifelong learning and remembering, with user model foundations. IEEE Trans on Learning Technologies, 1(4):215-228, 2008.



New ways to interact

Trent Apted, Anthony Collins





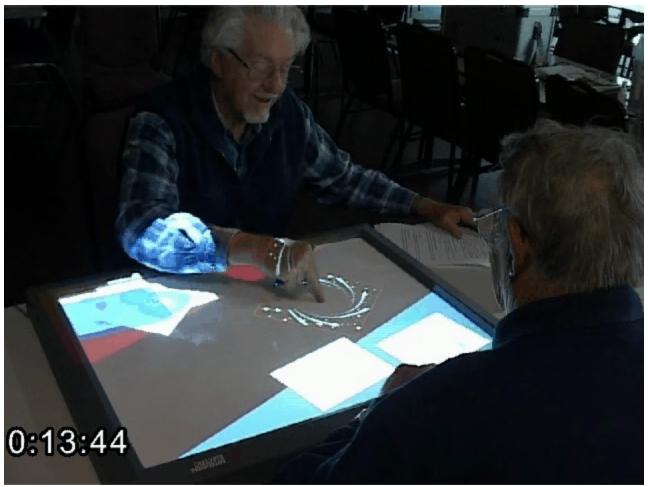
Sydney Sidetracks

Human body information explorer

Exploring collections of resources

Collaborative maths game

Older users too



T. Apted, J. Kay, and A. Quigley. Tabletop sharing of digital photographs for the elderly. In *CHI '06:* SIGCHI Conf on Human Factors in Computing Systems, pp 781-790, New York, NY, USA, 2006. ACM Press



New interfaces create possibilities...

... digital footprints

... huge potential for long term modelling

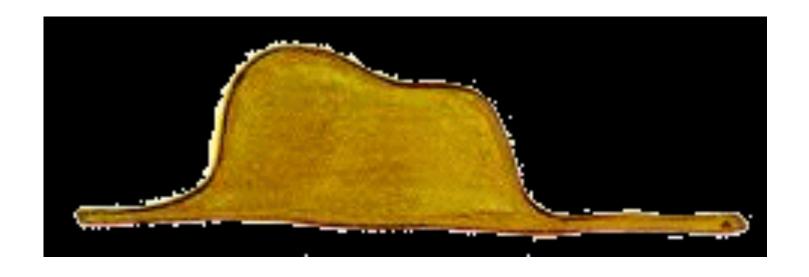
... but ...



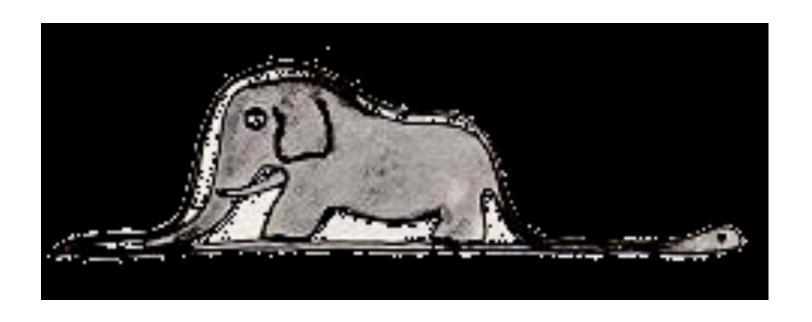




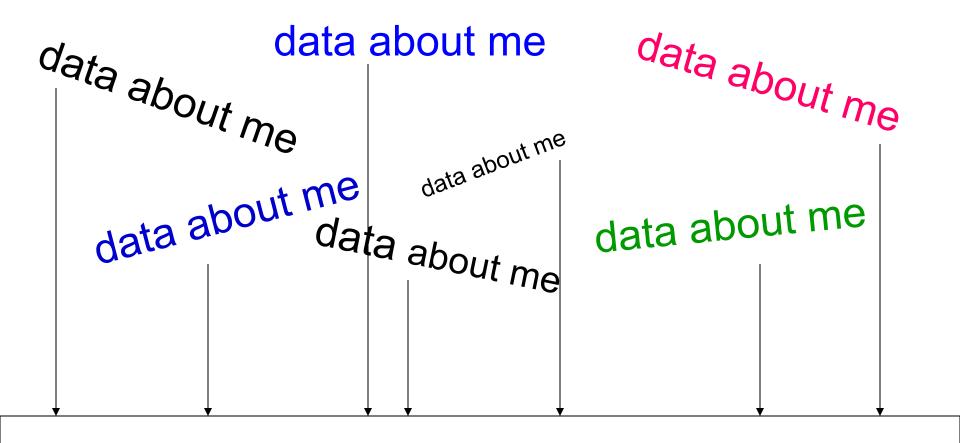
data about me



The challenge of interpretation.....



data about me



interpretation

Learner/user model

Exploiting electronic traces – mirrors, navigation tools

Kalina Yacef, Peter Reimann, Kim Upton





We know what we are, but know not what we may be.

Shakespeare





Shakespeare was too generous:

How self-aware are we?





Case Study: learning to collaborate





Have you ever had a frustrating group work experience?





Some problems for groups

- Establishing common ground
- Social loafing (free-riding)
- Tend to focus on action at the cost of
 - Reflection
 - Attending to psychological needs
- Frustration with quality of interaction
- Feel collaboration overhead too high
- Learning group work skills is hard
- Long term collaboration involves complex skills



Context of our work

Semester long captsone software project Explicit teaching of group work skills





Trac: Tool supporting long term group work

Used by team members, facilitators, teachers, some clients





TRAC

open source tool for supporting software development projects

root / rcwu

Name A	Rev	Age	Last Change
L /			
BaseAdminPluginTest.java	48	4 months	rcwu:
EditBlogEntriesPluginTest.java	47	4 months	rcwu:
EditBlogPropertiesPluginTest.java	47	4 months	rcwu:
journal	16	6 months	rcwu: Having problem with installation
isptest_r6.zip	49	4 months	rcwu:
junit3.8.1.zip	49	4 months	rcwu:
📓 slog-logo-small.gif	55	4 months	rcwu:
📓 slog-logo-small.jpg	52	4 months	rcwu:
🗟 slog-logo.jpg	39	5 months	rcwu:
🗟 slog.gif	View File	4 months	rcwu:
🗟 slog.jpg	52	4 months	rcwu:

SVN source repository

Not a learning system but used in a learning context.



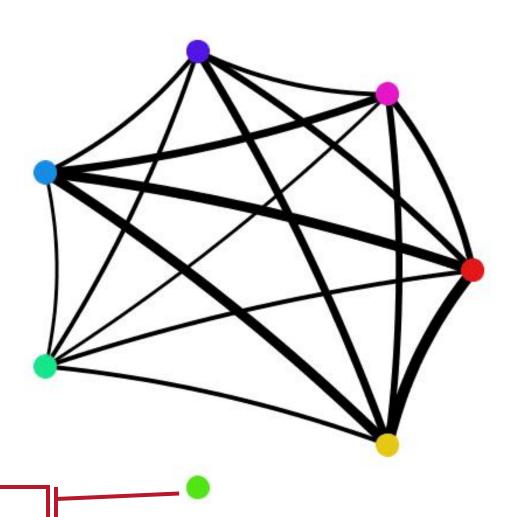
→ Huge amounts of data about the group members and their interactions



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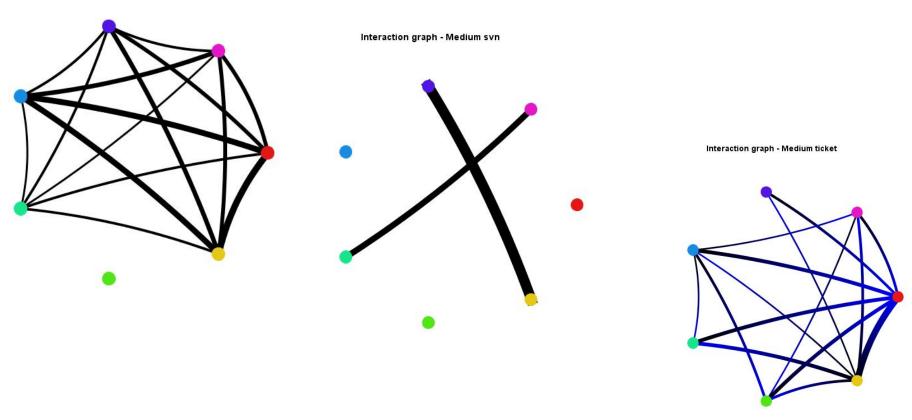
Interaction graph - Medium wiki



Team Leader

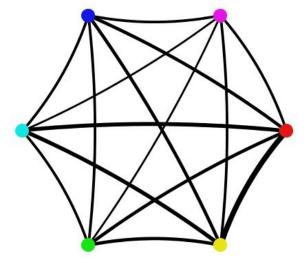
Interaction diagram

Interaction graph - Medium wiki

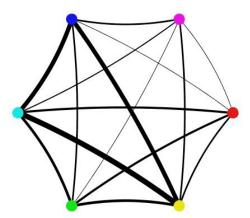


- Same location of people as in activity diagram
- Black is source blue is sink

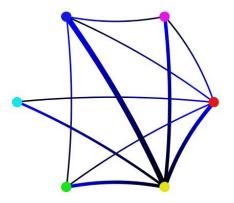
Interaction graph - Medium wiki



Interaction graph - Medium svn



Interaction graph - Medium ticket



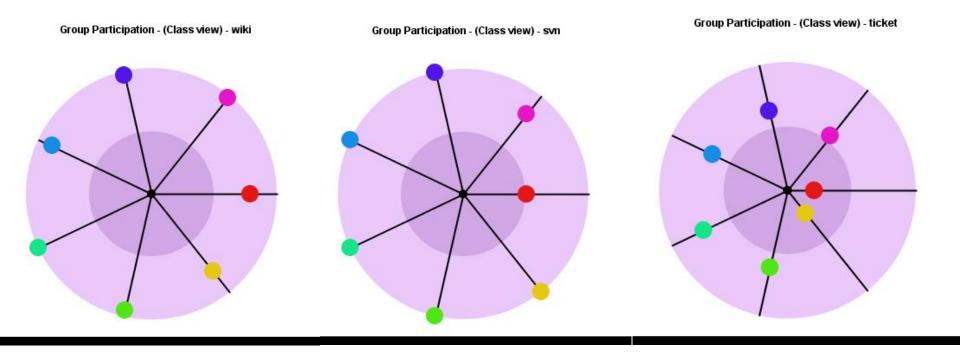
Activity mirrors



omputer human adapted interaction research group



Activity radar



- Each student has consistent colour, clock position
- Closer to centre is more work
- Logarithmic scale

Group Participation - (Class view) - svn Group Participation - (Class view) - ticket Group Participation - (Class view) - wiki

DOT GRAPH: TICKET

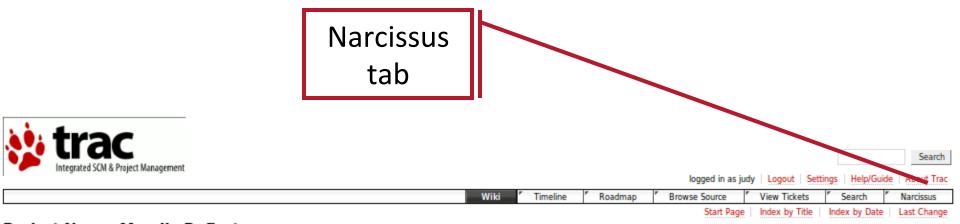
Amount of ticket activity by each student each day

Narcissus

Upton, K., and J. Kay. (2009) Narcissus: interactive activity mirror for small groups. In UMAP09, User Modeling, Adaptation and Personalisation, Springer-Verlag, 54-65



Integrated of mirror tool



Project Name: Moodle-Reflect

Milestone Documents

First Report Final Report Testing

Important Topics

Project Summary
Group member contact details
Meeting Records
Announcements/Discussion
Relevant Documentation
Contract Details

Reports

View comments from other group members within the last 24 hours, or since last login. View what you need to do for the Final Report.

Moodle Sites



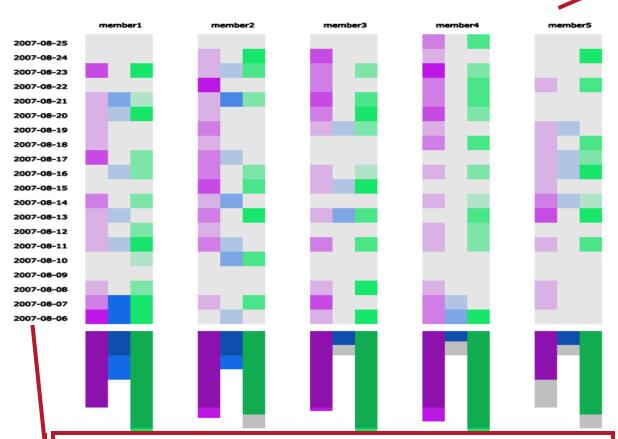
Main Roles

Role	Group Member
Manager	
Tracker	
Lead Programmer	

Header – Group view

Group View - SOFT3300 Group x

Group View | Project View | Ticket View



Time – activity on that day is shown for each user, on each medium

Display for one user

svn ticket

Details

19:06 Changeset [77] by member 2 19:06 Changeset [78] by member 2 20:22 Changeset [79] by member 2 20:24 Changeset [80] by member 2 20:30 Changeset [81] by member 2

Score

The following activity was detected: syn add: 78 lines added

svn add: 78 lines added svn add: 73 lines added svn edit: 3 lines added

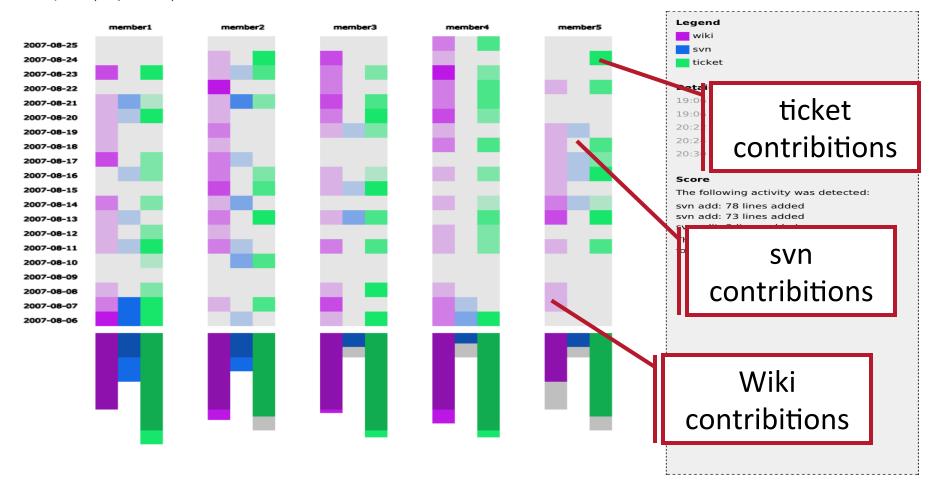
The points for svn are calculated as follows:

- 1 point for up to 50 added lines
- 2 points for up to 150 added lines
- 3 points for up to 300 added lines
- 4 points for over 300 added lines

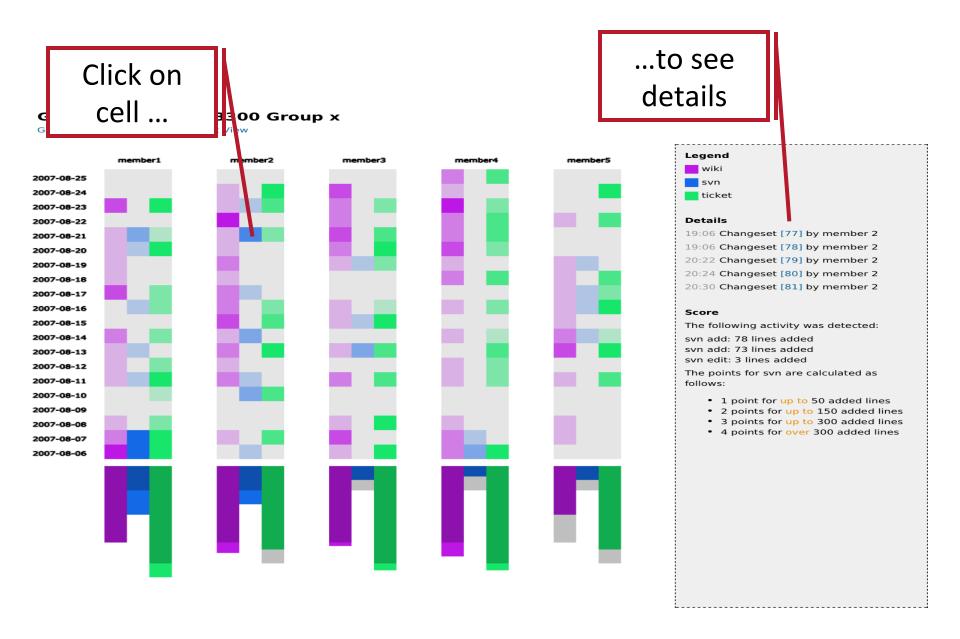


Group View - SOFT3300 Group x

Group View | Project View | Ticket View



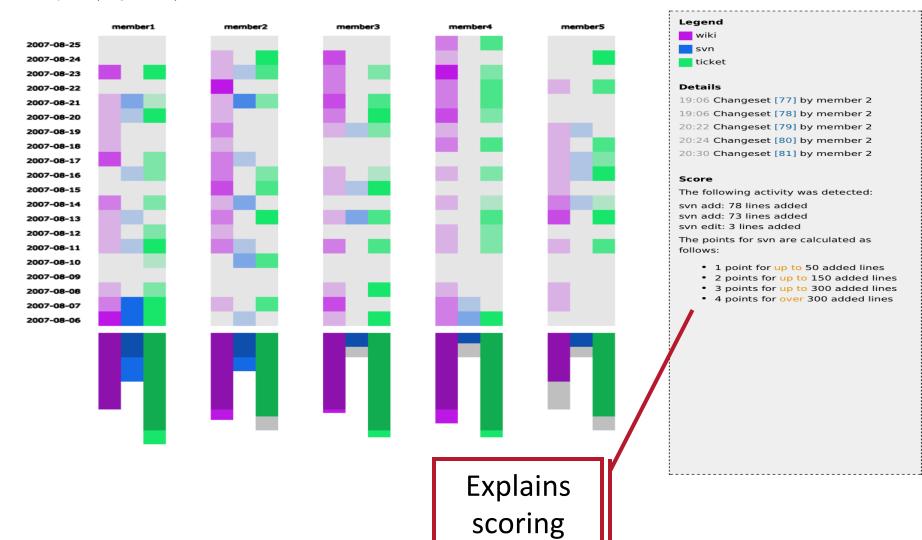






Group View - SOFT3300 Group x

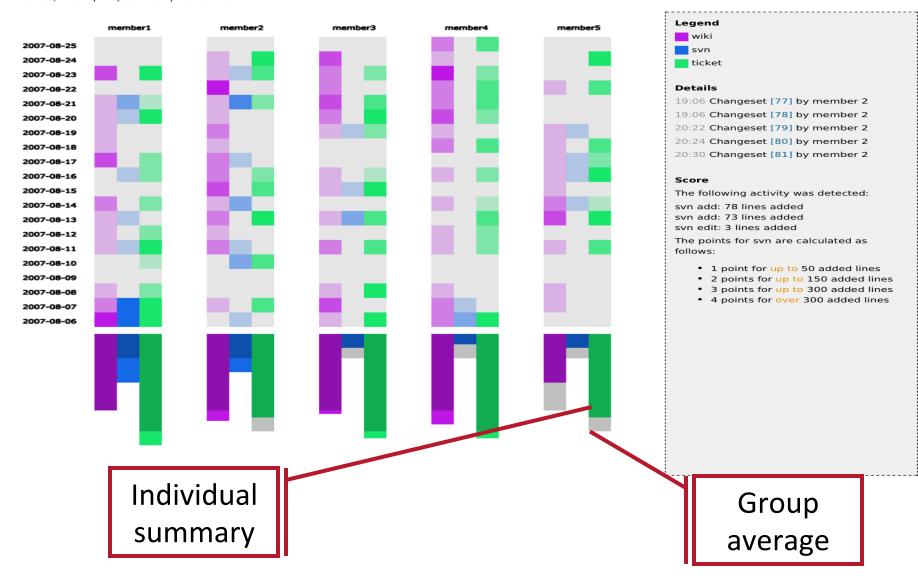
Group View | Project View | Ticket View





Group View - SOFT3300 Group x

Group View | Project View | Ticket View

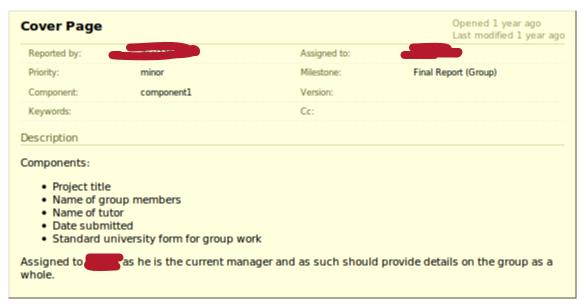






Details of that ticket

Ticket #31 (closed task: fixed)



Attachments

- coversheetMike.jpg (203.6 kB) added by final Coversheet
- FinalCoverSheet.ipg (203.6 kB) added by ______on 05/12/08 16:19:22.

Exploiting electronic traces – EDM

Educational Data Mining

Kalina Yacef, Agathe Merceron, Irena Koprinska, Dilhan Perera, Osmar Zaiane



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Sequences

characteristic of managers.

* That person had the manager role

	Managers/	Developers	Loafers	Others	
Group 1	/ _{*1}	3	1	1	
Group 2	*1	0	Group	1 – 3 member	s had
Group 3	0	1	develor	per activity sequ	uences
Group 4	*1	3	2	0	
Group 5	3	*1		ip 3 – dysfuncti ere we might se	
Group 6	*1	1			
Group 7	*1	0	Group	5 – another wa dysfunctional	y to be

Long term learning over 3-5 year Degree Programme

Richard Gluga, Tim Lever, Ray Lister



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CUSP: >200 degrees, >2000 subjects

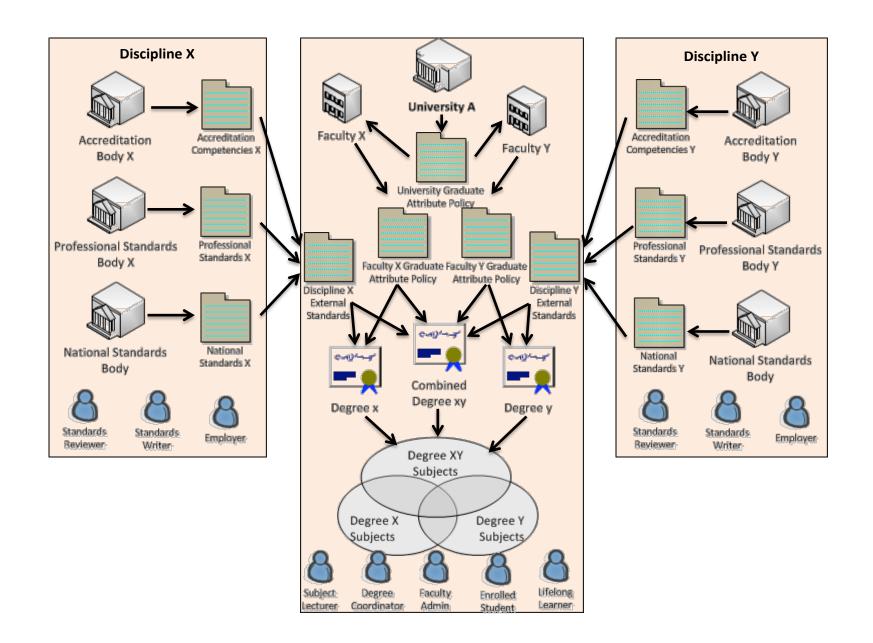
Faculties of Engineering and IT, Architecture, Health Sciences, Commerce...

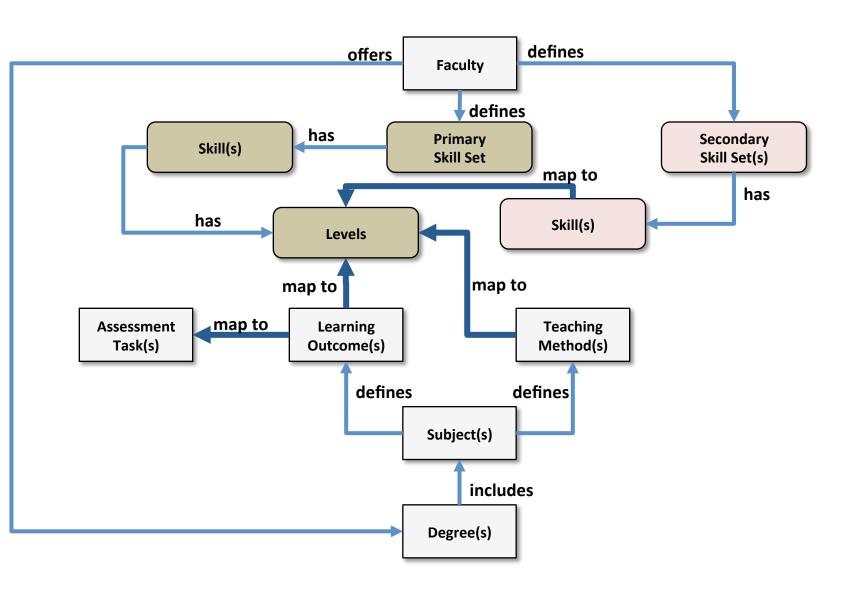


computer human adapted interaction research group



University Degrees & Curriculum Goals





Individual Subject view – for Lecturer

Units > COMP2007: Algorithms and Complexity > 2010 - Semester 2 (Open) 🖪 🕱 🤋

Created: 2009-10-14 21:56:11.94, Last Updated: 2010-05-20 10:56:48.442444, admin, Lockdown Date: , Release Date:

(Level 1)

WARNING: Version is Open! Submit for Review to mark for approval!

Direct equivalents Nowledge of the major technical areas comprising least one engineering discipline, and competence in applying mathematics, science and engineering science to the analysis and solution of representative problems, situations and challenges in those areas [EAStage1: PE1.2a] Knowledge of materials and resources relevant to the discipline, and their main prorties, and ability to select appropriate materials and techniques for particular objectives [EAStage1: PE1.2b] Indirect equivalents Yes Quiz (20.00%), Final Exam (60.00%), Yes Quiz (20.00%), Final Exam (60.00%),	load UoS	Outline Student Vi		113 <u>Open:</u> <u>c</u>	oubline for i	to ma	тк тог аррго	vai:			
tributes from Engineering & IT Graduate Attribute Matrix that are practiced or assessed in this unit. Durse Goal/Attribute Practiced? Assessed by? Yes Assignment (20.00%), Quiz (20. Final Exam (60.00%), Prinal Exam (60.00%), Assignment (20.00%), Prinal Exam (60.00%), Prinal Exam (60.00%), Assignment (20.00%), Prinal Exam (60.00%), Prinal Exam (60.00%	ndbook	Requirements	Teaching	Attributes	Outcomes	Assessments	Resources	Schedule	Course Map	Reports	
Practiced? Assessed by? Surse Goal/Attribute Practiced? Assessed by? Yes Assignment (20.00%), Quiz (20. Final Exam (60.00%)), Prinal Exam (60.00%), Pri	port: At	tribute Summary	- Full 🔻	Show							
Assignment (20.00%), Quiz (20. Final Exam (60.00%), Direct equivalents Knowledge of the major technical areas comprising least one engineering discipline, and competence in applying mathematics, science and engineering science to the analysis and solution of representative problems, situations and challenges in those areas [EAStage1: PE1.2a] Knowledge of materials and resources relevant to the discipline, and their main prorties, and ability to select appropriate materials and techniques for particular objectives [EAStage1: PE1.2b] Indirect equivalents Yes Assignment (20.00%), Quiz (20.00%), Assignment (20.00%), Assignment (20.00%), Assignment (20.00%), Assignment (20.00%), Assignment (20.00%), Final Exam (60.00%), Assignment (20.00%), Assignment (20.00%), Assignment (20.00%), Final Exam (60.00%), Assignment (20.00%), Final Exam (60.00%), Assignment (20.00%), Final Exam (60.00%), Final Exam (60.00%), Assignment (20.00%), Assignment (20.00%), Assignment (20.00%), Assignment (20.00%), Final Exam (60.00%), Assignment (20.00%), Final Exam (60.00%), Assignment (20.00%), Assignment	nt View		jineering	& IT Gra	duate Att	ribute Matr	rix that are				his unit.
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Direct equivalents -Knowledge of the major technical areas comprising least one engineering discipline, and competence in applying mathematics, science and engineering science to the analysis and solution of representative problems, situations and challenges in those areas [EAStage1: PE1.2a] -Knowledge of materials and resources relevant to the discipline, and their main prorties, and ability to select appropriate materials and techniques for particular objectives [EAStage1: PE1.2b] Indirect equivalents Yes Quiz (20.00%), Final Exam (60.0 4) Information Skills (Level 2) Yes	1) Des	ign and Problem	Solving Sk	ills (Level 2)			Yes			
4) Information Skills (Level 2) Yes	Direct equivalents Knowledge of the major technical areas comprising least one engineering discipline, and competence in applying mathematics, science and engineering science to the analysis and solution of representative problems, situations and challenges in those areas [EAStage1: PE1.2a]Knowledge of materials and resources relevant to the discipline, and their main prorties, and ability to select appropriate materials and techniques for particular objectives [EAStage1: PE1.2b]										
1) Information online (Edvarz)	🕸 3) Fundamentals of Science and Engineering (Level 2) Yes Quiz (20.00%), Final Exam (60.									inal Exam (60.00%),	
5) Professional Communication (Level 2) Yes	‡ 4) Information Skills (Level 2) Yes										
,											

No

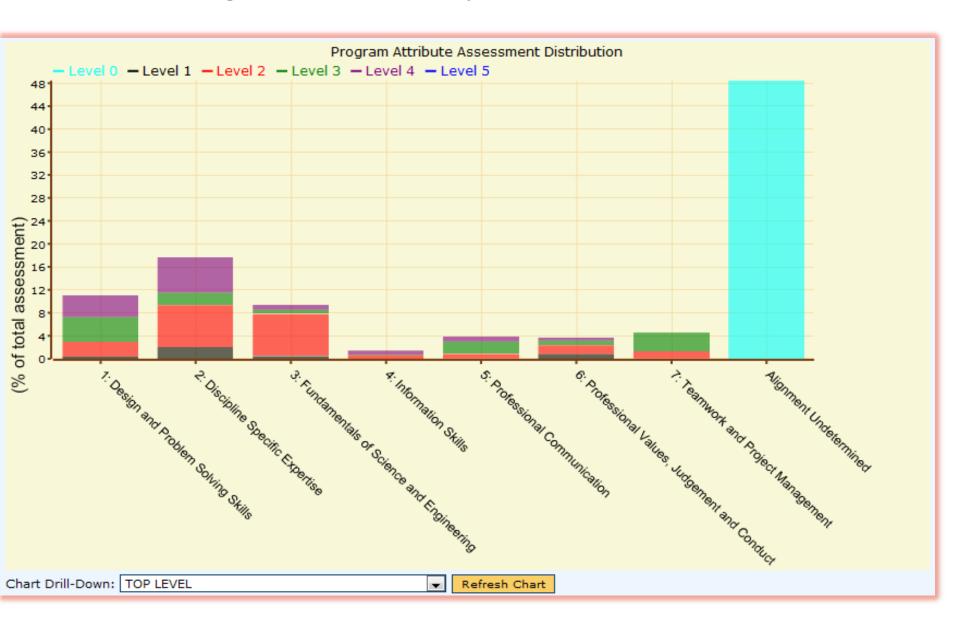
CUSP Degree Level view – for Lecturer, Degree Co-ordinator

Detailed Program Attribute Assessment - Engineering & IT Graduate Attribute Matrix (or Equivalents)

This report shows a detailed breakdown of attribute assessment data. Note that for Unit Blocks containing electives we take a pessimistic approach and determine the minimum possible assessment weight for each attribute level. This is calculated based on the Unit Block Min CP and Free Elective CP values.

	No Level	Level 1		Level 2			evel 2 Level 3					Level 4				Level 5			
1: Design and Problem Solving		CORE:	CORE:				CORE:				CORE:			Adv Recommended					
Skills		Unit CP W	CPEW	Unit	CP W	1	CPEW	Unit	CP	w	CPEW	Unit	CF	w	CPEW	Unit	CP 1	w	CPEV
		ELEC1601 6 0.03	0.18	INFO2110		_	0.58	ELEC4702	0	0.14	0	COMP3615	6	+	_	COMP5318	6 (0.04	0.23
		ENGG1805 6 0.1	0.59	INFO2120		$\overline{}$	0.63	INFO3220		0.15		ELEC5618	+-	_	1.05	COMP3308	-	$\overline{}$	2.09
		CPEW Min Sum	0.77	INFO1105		\rightarrow	0.84	ELEC3609	$\overline{}$	0.24	1.43		6	+	1.44	COMP3608	-	$\overline{}$	2.09
		Yr1 Recommended		COMP2007	6 0.	$\overline{}$	2.84	INFO3315		1	6		6	-	1.71		-	$\overline{}$	1.34
		Unit CP W	CPEW	CPEW Min S	Sum		4.89	CPEW Min S	um		8.32	ELEC4711	6	0.35	2.13	COMP3520	-		0.45
		ELEC1103 6 0.17		Yr2 Recommended				Yr2 Recommended				CPEW Min Sum 7.21			7.21	COMP3456	-	$\overline{}$	1.25
		CPEW Min Sum	0.55	Unit CP W CPEW				Unit CP W CPEW				Adv Recom	nded		COMP5426	-	$\overline{}$	0.6	
		CPEW PIIII SUIII	U	ELEC2302			.78	ELEC2602				Unit	CE	w	CPEW		-		3.6
				ELEC2104	-	-	.89	CPEW Min S	_	_	0	ELEC4605	6	_	0.12	COMP5028	-	0.65	
				ELEC2103	-	_	.82					ELEC4505	6	0.05		COMP5047		_	
				CPEW Min S		0		Adv Recon	ıme	nded			6	0.05	_	CPEW Min S	um		0
								Unit	CF	w	CPEW		6	+	0.83				
								ELEC3304	6	0.01	0.08		6	+	0.25				
								ELEC3607	6	0.03	0.15		6	0.1	0.6				
								COMP5114	6	0.13	0.79		6	_	1.45				
								ELEC3305	6	0.01	0.08		6	0.15	0.9				
								ELEC3203	6	0.19	1.15	ELEC5616	6	0.32	1.9				
								ELEC3505	6	0.35	2.1	ELEC5514	6	0.2	1.2				
								ELEC4706	6	0.2	1.2	ELEC5508	6	0.29	1.76				
								ELEC3404	6	0.15	0.9	ELEC5507	6	0.22	1.31				
								ELEC3104	6	0.5	3	ELEC5205	6	0.06	0.38				
								ELEC3206	6	0.62	3.74	ELEC3506	6	0.24	1.45				
								COMP3109	6	0.5	3	ELEC5206	6	0.24	1.42				
								CPEW Min S	um		0	ELEC5303	6	0.29	1.76				
												ELEC5101	6	+	1.06				
												ELEC3405	6	0.16	0.93				

Degree level summary of levels and broad areas



One Accreditation View

Detailed Program Attribute Assessment - Stage 1 Competency Standards for Professional Engineers (or Equivalents)

This report shows a detailed breakdown of attribute assessment data. Note that for Unit Blocks containing electives we take a pessimistic approach and determine the minimum possible assessment weight for each attribute level. This is calculated based on the Unit Block Min CP and Free Elective CP values.

	No Level								
PE1: KNOWLEDGE BASE									
PE1.1: Knowledge of science and engineering fundamentals									
PE1.1a: Sound knowledge of mathematics to the level required for fluency in the techniques of analysis and synthesis that are relevant to the	CORE: Unit CP W CPEW								
broad field of engineering, and to potentially related fields	INFO2315 6 0.09 0.57 COMP2129 6 0.11 0.67								
	INFO2120 6 0.28 1.71 COMP2007 6 0.46 2.76								
	INFO1103 6 0.63 3.79 ELEC1601 6 0.76 4.59								
	CPEW Min Sum 14.08								
	Yr1 Recommended Unit CP W CPEW								
	ELEC1103 6 0.33 1.98								
	Yr2 Recommended								
	Unit CP W CPEW ELEC2104 6 0.15 0.89								
	ELEC2103 6 0.3 1.82								
	CPEW Min Sum 0 Adv Recommended								
	Unit CP W CPEW								
	COMP3456 6 0.44 2.64								
PE1.1b: Sound basic knowledge of the physical sciences, life sciences, and information sciences	CORE:								

Novel interfaces, EDM, learner model visualisation interfaces, classroom orchestration

Roberto Martinez, Kalina Yacef



computer human adapted interaction research group



externalisation

affection

argumentation

building on others

Collaboration has been proven to activate special learning mechanisms that cannot be triggered by working individually

P. Dillenbourg.

What do you mean by 'collaborative learning'?

discussion?

diverse expertise

Two hands are better than one



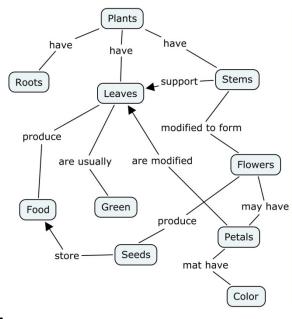
Tabletops in classrooms

- This field is in its infancy.
- The hardware is developing month to month
- Educators want to "use" them in the classrooms but they still don't know exactly how.

- (i) teachers have several groups
- (ii) students need timely feedback on
- (iii) tabletops offer new ways to support learning
- (iv) and the potential to capture and use traces of the interaction

The collaborative task (concept mapping and problem solving)

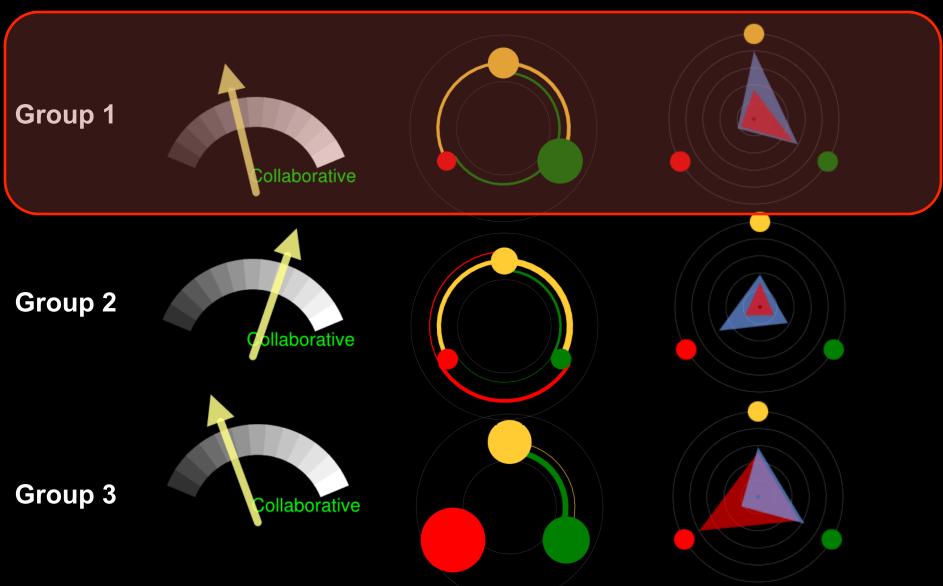
- Concept mapping is:
 - A tool for externalising knowledge
 - Applied in different domains
 - Promotes meaningful learning
 - Has been used by organisations such as
 NASA, Navy, and universities around the world.







Class level Dashboard



Martinez Maldonado, R., Kay, J., Yacef, K. and Schwendimann, B. An Interactive Teacher's Dashboard for Monitoring Groups in a Multi-tabletop Learning Environment. *Intelligent Tutoring Systems* (2012), 482-492.

Class level: Indicator of detected collaboration.

Group 1



Group 2



Group 3



 A Best-First tree model trained in another dataset classifies each block 30 seconds of activity

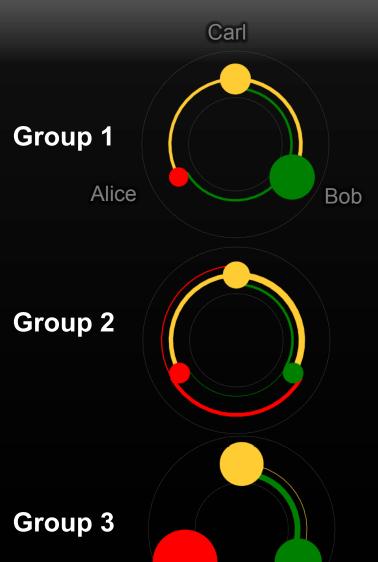
Features:

- # of active participants in verbal discussions,
- •amount of speech,
- number of touches
- symmetry of activity (Gini coefficient).
- •Labels: Collaborative, Non-collaborative, or Average.
- •The visualisation shows the accumulation of these.



Martinez R, Wallace J, Kay J, Yacef K Modelling and identifying collaborative situations in a collocated multi-display groupware setting. In: AIED 2011. pp. 196-204 (2011)

Class level: Graph of interaction with others' objects



- The Circles indicate the number of touches
- •The Lines represent the number of actions that each learner performed on others' links and concepts



Class level: Mixed radar of participation



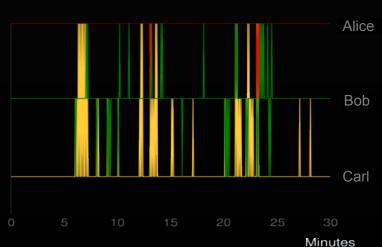
- Symmetry of physical participation
- Symmetry of verbal participation
- •The closer the corner of the triangle to the centre the less participative the student



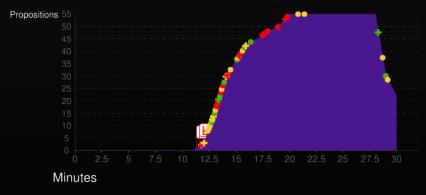
Group level: Evolution of the group map and Timeline of interaction with other learners' objects

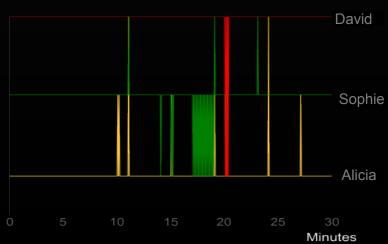
A group where student in RED is doing very little

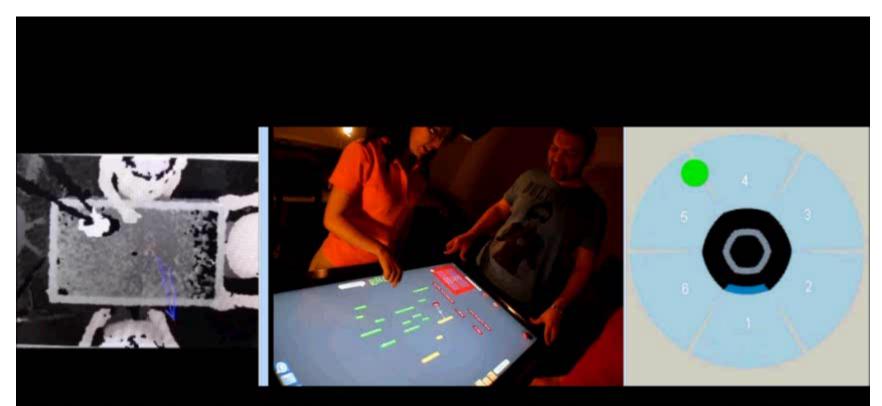




A group where the three students worked separately







Martinez, R., Kay, J. and Yacef, K. Collaborative concept mapping at the tabletop. *In ACM International Conference on Interactive Tabletops and Surfaces (2010), 207-210.*



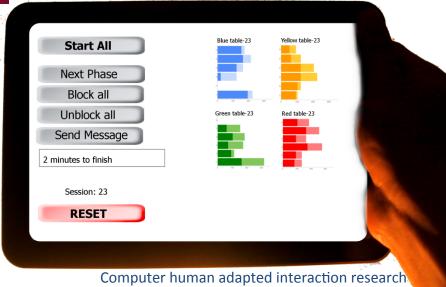
Classroom Orchestration

















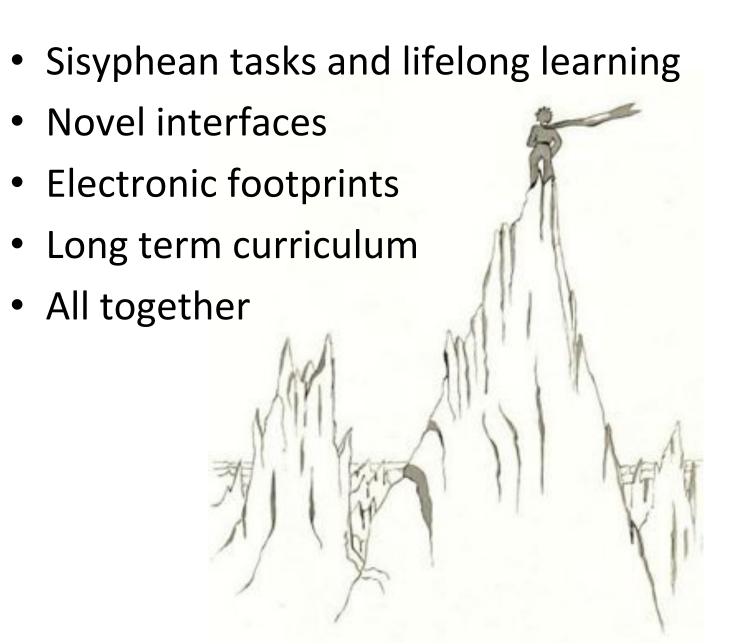
Summary

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computer human adapted interaction research group







Acknowledgements



Embedded, mobile UIs

OLMs, Scrutiny Uls

































Acknowledgements





















Software infrastructure user control, scrutability







Acknowledgements





Questions?

Please visit CHAI at chai.it.usyd.edu.au

This talk presents a vision for lifelong learning as a driver for designing pervasive technologies. It does this via case studies for challenging long-term learning goals associated with health and wellness, collaboration to learn and learning to collaborate.

One strand of that vision involves the new learning interfaces across each learner's personal digital ecosystem of devices, ranging from mobiles, to desktops and embedded interactive surfaces on walls and tables. A second strand concerns the huge amounts of data that these devices can, and do, capture about learners. This takes diverse forms, including personal information, learning data and digital footprints. There is a huge and growing amount of this data. It lives across the personal digital ecosystem, on personal devices and in the cloud.

The talk illustrates the design of technologies to give this data to the learner at three levels. One concerns learner control over the capture and use of their data. Another involves data mining to transform it into new insights for the learner, their teachers and facilitators, and for education researchers. The final one is the design of interfaces such as in Open Learner Models to scaffold the learner's metacognitive activities of self-monitoring, self-reflection and planning.

