

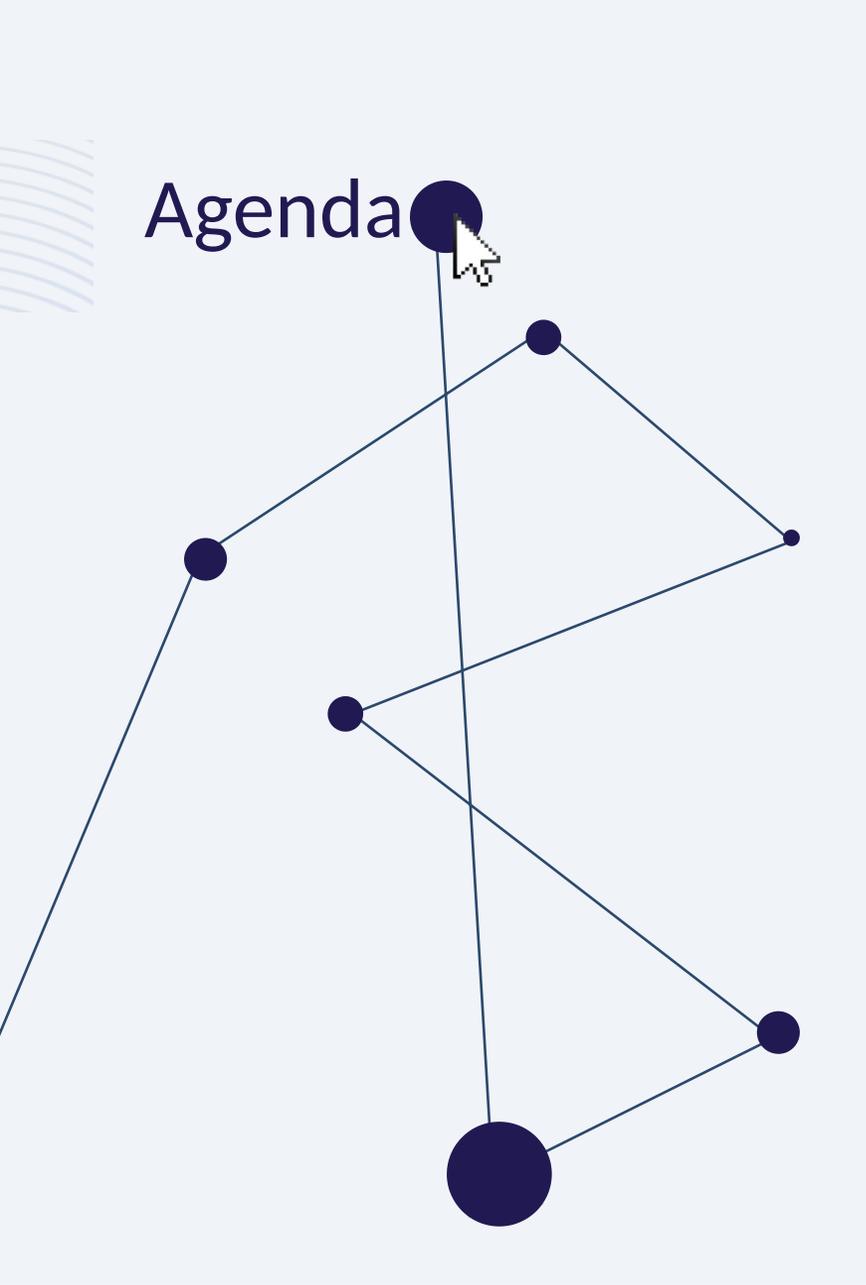


## Simple Mouse Attribute Analysis

Investigating the bivariate potential correlation of mouse movement attributes and the satisfaction with the usability for the determination of the users' satisfaction of a cloud- based vertical business software solution for managing soft data.

**21<sup>ST</sup> INTERNATIONAL CONFERENCE ON HUMAN-COMPUTER INTERACTION**

# Agenda

A network diagram consisting of several dark blue circular nodes of varying sizes connected by thin dark blue lines. The nodes are arranged in a roughly triangular shape. The top-left node is the largest and has a mouse cursor hovering over it. Other nodes are connected to it and to each other, forming a web of connections. The diagram is set against a light blue background with a subtle pattern of horizontal lines on the left side.

Introduction

Usability

Mouse pattern

Examined mouse attributes

Research Methodology

Findings

Conclusion

# ► Introduction

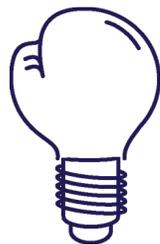


As satisfied as you click

Main research goal is to examine the bivariate potential correlations between the pattern related mouse attributes and the factors of the satisfaction with the usability

# ► Usability

□ Three main points of usability (ISO, 1998):



Effectiveness  
Do the  
right  
things



Efficiency  
Doing  
things  
right



Satisfaction  
The  
personal  
meaning

Nielsen & Norman:  
Learnability,  
Efficiency,  
Memorability,  
Errors,  
Satisfaction

# ► Usability: CSUQ

- satisfaction with the usability
- strong focus on business and it is very suitable for business applications
- 19 statements

SYSUSE  
system  
usefulness

INFOQUAL  
informatio  
n quality

INTERQUAL  
interface  
quality

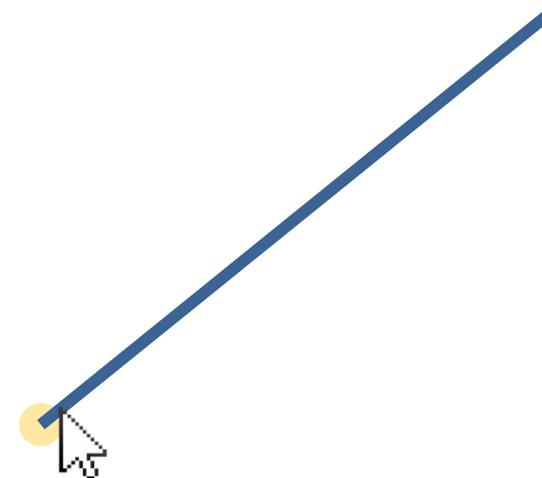
OVERALL

The item assess:

perceived ease-of-use,  
perceived ease of learning,  
simplicity,  
perceived effectiveness,  
information,  
user interface,  
efficiency,  
errors

# ► Mouse patterns: Straight pattern

- Direct movements towards a target  
(after tracing the target)
- Characterised by a pause before the movement (Lee & Chen, 2007; Tzafilkou & Protogeros, 2018)
- Direct movements with no big pauses (Ferreira, Arroyo, Tarrago, & Blat, 2010; Tzafilkou, Protogeros, & Yakinthos, 2014).
- Can be interpreted as a confident move of the user
- may also reveal that a task was easy



# ► Mouse patterns: Hesitation pattern

- Two definitions:
  - 1) movement between two or more elements as hesitation
  - 2) the average time from the beginning of a mouse hover to the moment of the click (ClickTale, 2018).
- more hesitation patterns occurred during a task with a higher level of difficulty (Ferreira, Arroyo, Tarrago, & Blat, 2010).



# ► Mouse patterns: Random pattern

- movements without any specific intention, just playing around doing random movements with short pauses or not (Ferreira, Arroyo, Tarrago, & Blat, 2010)
- arise when the level of difficulty for the task was increased
- indicator of difficulty and low self-efficacy (Tzafilkou & Protogeros, 2018)
- indicator for the perceived usability of the system



## ► Mouse patterns: Fixed pattern

- describes a repose of the cursor
- Tzafilkou & Protogeros (2018) assumed that the user during this time evaluates the cost and benefits of the particular action to make
- evaluate the risk-perception as well as the level of usefulness



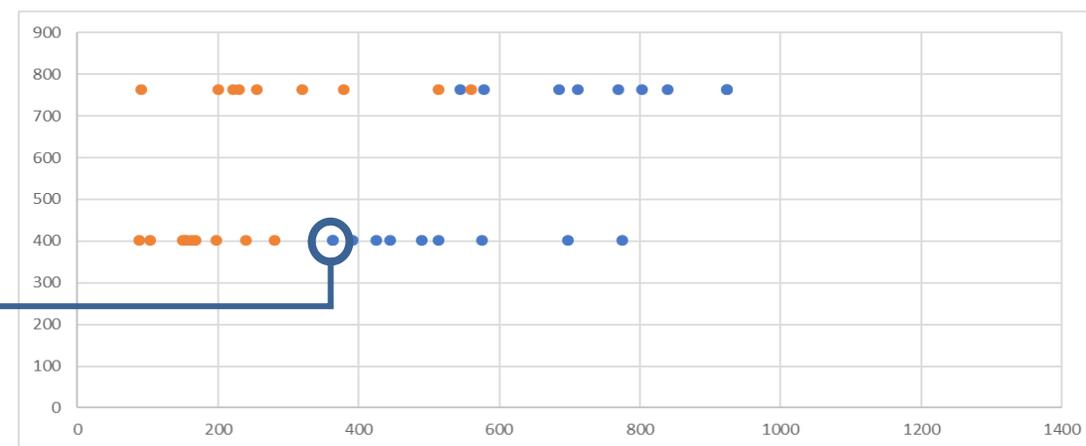
## ► Mouse attributes: pre-studies

1. To define a factor for the determination of the percentage deviation for straight movements

$$a = 1.0433$$

2. To define the of the perception of a slow movement

360 px/sec

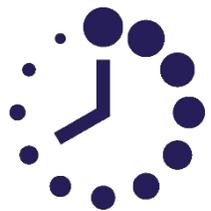


# ► Mouse attributes



Straight pattern attributes	Hesitation pattern attributes	Random pattern attributes	Fixed pattern attributes	Mouse attributes of activity
<ul style="list-style-type: none"> <li>• Number of direct movements</li> <li>• Number of long direct movements (&gt;1/4 of screen diagonal)</li> </ul>	<ul style="list-style-type: none"> <li>• Hovers that turned into clicks</li> <li>• number of pauses before clicks &gt; 0.2 s</li> <li>• All hovers in general</li> <li>• Average time of pauses that turns into clicks</li> </ul>	<ul style="list-style-type: none"> <li>• Non-direct movements</li> <li>• Number of non- direct movements</li> <li>• Total number of movements</li> </ul>	<ul style="list-style-type: none"> <li>• Number of Pauses</li> <li>• Number of long Pauses (&gt;4s)</li> <li>• Average time of pauses</li> <li>• Average time of long pauses</li> </ul>	<ul style="list-style-type: none"> <li>• Total amount of the covered distance during the tasks</li> <li>• Average velocity during the task</li> <li>• Total time of the task</li> <li>• Number of slow movements</li> <li>• Activity Level (Covered distance/ time of task)</li> </ul>

# ► Research Methodology: Tasks



- small enough to be understood and conducted by the participants in a limited amount of time
- little loading time as possible

first task  
find specific information

second task  
create a task



# ► Research Methodology: SMATA

 Simple Mouse Attribute Analysis

User ID: 133    Session Time: 11.92

Office 365 | SharePoint

MY TOOLS    GENNEMSE    SIDE

Dokument    Dokument (Avanceret)    Kunde - Projekt - Udstyr    Installation    Ordre    Udlejning

Nyt dokument

Projekter oprettet dagsdato

+ nyt element eller rediger denne liste

✓ Site	Projektnummer	Titel	Projekt type	Kundens ordrenr	Projekt Status	Leveringsdato
Der er ingen elementer at vise i denne visning af listen "Projekter".						

Projekter jeg er nævnt i

+ nyt element eller rediger denne liste

✓ Site	Projektnummer	Titel	Projekt type	Kundens ordrenr	Faktureringsstatus	Projektleder	Projektdeltagere	Tildelt til
<input type="checkbox"/>		Master	...		0 - Igangværende	<input type="checkbox"/> Jennifer Jorina Matthiesen		
<input type="checkbox"/>		Udlejning af 50 tons dynamometer	...		0 - Igangværende	<input type="checkbox"/> Jennifer Jorina Matthiesen <input type="checkbox"/> Christina Stolberg Grøn <input type="checkbox"/> Christina Stolberg Grøn		

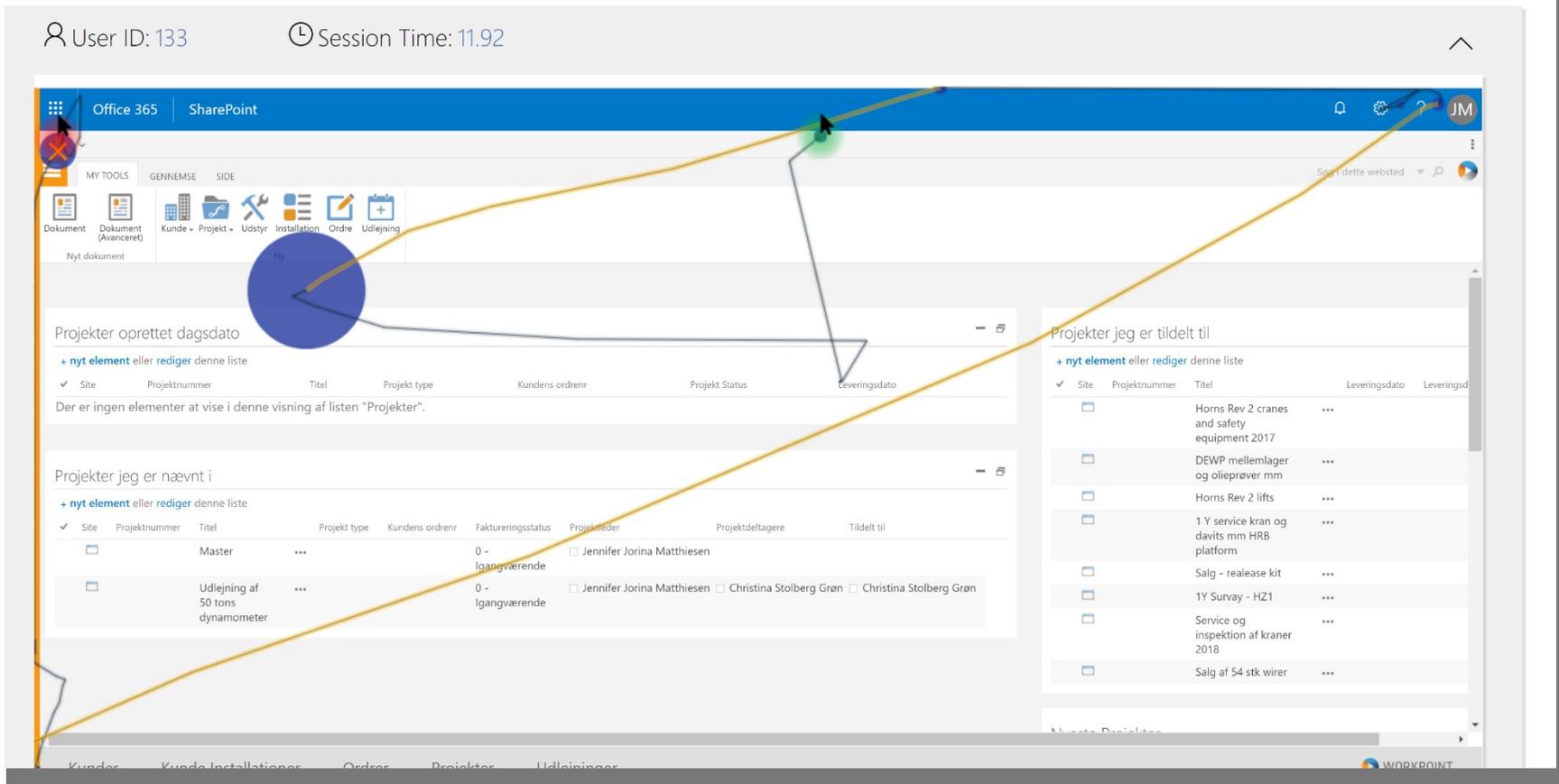
Projekter jeg er tildelt til

+ nyt element eller rediger denne liste

✓ Site	Projektnummer	Titel	Leveringsdato	Leveringsd
<input type="checkbox"/>		Horns Rev 2 cranes and safety equipment 2017	...	
<input type="checkbox"/>		DEWP mellemlager og olieprøver mm	...	
<input type="checkbox"/>		Horns Rev 2 lifts	...	
<input type="checkbox"/>		1 Y service kran og davits mm HRB platform	...	
<input type="checkbox"/>		Salg - release kit	...	
<input type="checkbox"/>		1Y Survay - HZ1	...	
<input type="checkbox"/>		Service og inspektion af kraner 2018	...	
<input type="checkbox"/>		Salg af 54 stk wirer	...	

Kunder    Kunde Installationer    Ordre    Projekter    Udlejninger

WORKPOINT



# ► Research Methodology: SMATA

### Pauses

number of pauses: 7  
 number of long pauses (>4s): 1  
 avg time of pauses: 0.982142857142857  
 avg time of long pauses: 4.083333333333333  
 pauses: [{"length":0.375,"xcoord":933,"ycoord":59,"startIndex":0,"endIndex":1,"type":"long"}, {"length":0.375,"xcoord":933,"ycoord":59,"startIndex":1,"endIndex":2,"type":"normal"}, {"length":0.375,"xcoord":1075,"ycoord":1,"startIndex":2,"endIndex":3,"type":"normal"}, {"length":0.20833333333333331,"xcoord":1621,"ycoord":21,"startIndex":3,"endIndex":4,"type":"normal"}, {"length":0.375,"xcoord":1666,"ycoord":21,"startIndex":4,"endIndex":5,"type":"normal"}, {"length":0.375,"xcoord":0,"ycoord":816,"startIndex":5,"endIndex":6,"type":"normal"}, {"length":1.0833333333333333,"xcoord":28,"ycoord":77,"startIndex":6,"endIndex":7,"type":"long"}]

### Point of Movement

For the calculation of a direct movement (calculation from start to finish)

Points for movement calculation:  
 [{"index":0,"xcoord":933,"ycoord":59,"evt":"start"}, {"index":1,"indexEnd":9,"xcoord":933,"ycoord":59,"evt":"end"}, {"index":25,"indexEnd":122,"xcoord":323,"ycoord":243,"evt":"end"}, {"index":130,"indexEnd":138,"xcoord":1075,"ycoord":1,"evt":"end"}, {"index":143,"indexEnd":147,"xcoord":1621,"ycoord":21,"evt":"end"}, {"index":174,"indexEnd":182,"xcoord":1666,"ycoord":21,"evt":"end"}, {"index":193,"indexEnd":201,"xcoord":0,"ycoord":816,"evt":"end"}, {"index":256,"indexEnd":281,"xcoord":28,"ycoord":77,"evt":"end"}, {"index":285,"xcoord":28,"ycoord":61,"evt":"end"}]

### Movements

		id	from:	id	to:	cov-Dist:	euc-Dist:	velocity	longDirMov	slow
	1.	non-direct movement	9 x: 933 y: 59	25 x: 323 y: 243	1088.12 px	637.15 px	1088.123 (pix/sec)			
	2.	direct movement	122 x: 323 y: 243	130 x: 1075 y: 1	794.81 px	789.98 px	181.671 (pix/sec)			
	3.	non-direct movement	138 x: 1075 y: 1	143 x: 1621 y: 22	593.33 px	547.37 px	1095.373 (pix/sec)			
	4.	non-direct movement	147 x: 1621 y: 22	174 x: 1666 y: 21	120.25 px	46 px	93.095 (pix/sec)			
	5.	direct movement	182 x: 1666 y: 21	193 x: 0 y: 816	1874.84 px	1847.77 px	2368.224 (pix/sec)			
	6.	non-direct movement	201 x: 0 y: 816	256 x: 28 y: 77	1039.77 px	738.53 px	396.102 (pix/sec)			
	7.	direct movement	281 x: 28 y: 77	285 x: 28 y: 61	17 px	17 px	14.069 (pix/sec)			

Number of movements: 7  
 Number of direct movements: 3  
 Number of non-direct movements: 4  
 Number of long direct movements: 2  
 Number of slow movements (<360 pix/sec): 3

start point: {"xcoord":933,"ycoord":59}  
 end point: {"xcoord":28,"ycoord":61}

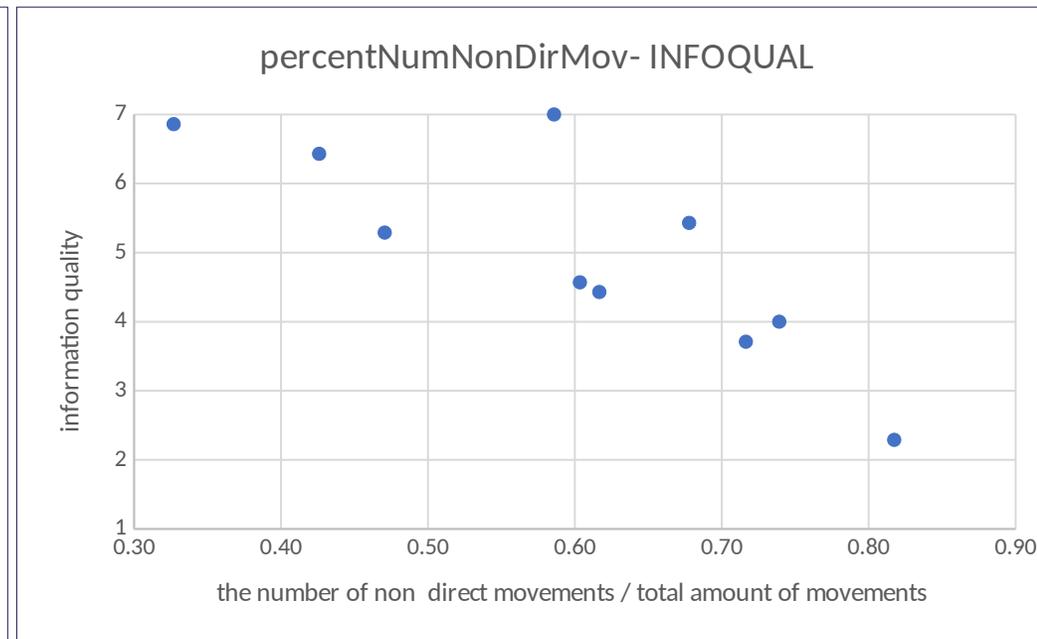
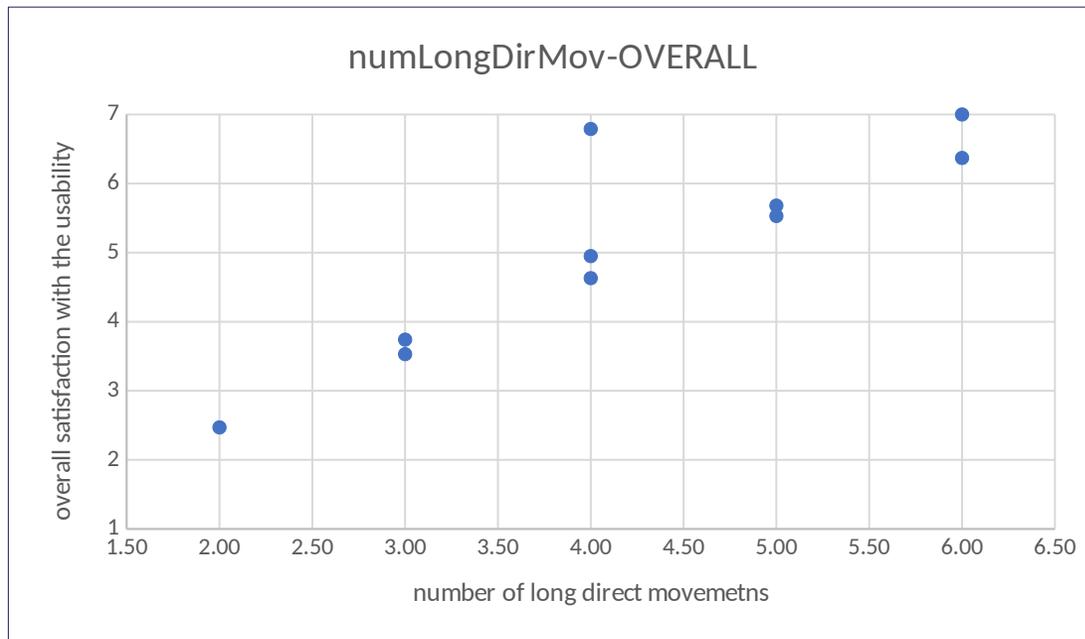
# ► Findings

Pattern category	Mouse attribute	Correlation	SYSUSE	INFOQUAL	INTERQUAL	OVERALL
Straight pattern	numDirMov	Pearson	-.708*	-.852**	-.770**	-.797**
	numLongDirMov	Pearson	.871**	-.819**	-.799**	-.882**
Hesitation pattern	pausesBfrClick	Pearson	-0.078	-0.005	0.103	-0.02
	numHover	Pearson	0.334	0.263	0.406	0.341
Random pattern	numMov	Pearson	0.347	0.339	0.29	0.355
	percentNumNonDirMov	Pearson	.739*	.813**	.670*	.787**
	numNonDirMov	Pearson	0.581	0.625	0.549	0.621
Fixed pattern	numPauses	Pearson	.747*	.699*	0.592	.741*
	numLongPauses	Pearson	0.187	0.324	0.119	0.229
	avgPause	Pearson	-0.134	0.146	-0.077	-0.041
	avgLongPause	Pearson	-0.311	-0.356	-.639*	-0.398
Mouse attributes of activity	numSlowMov	Pearson	0.324	0.305	0.302	0.334
	numClicks	Pearson	-0.080	0.048	0.207	0.014
	covDist	Spearman's	0.48	0.345	0.492	0.467
	actLevel	Pearson	0.187	0.139	0.273	0.198
	avgVelocity	Pearson	0.144	0.173	0.091	0.153
	sessTime	Pearson	0.606	.774**	0.595	.688*

\*. Correlation is significant at the 0.05 level (2-tailed).

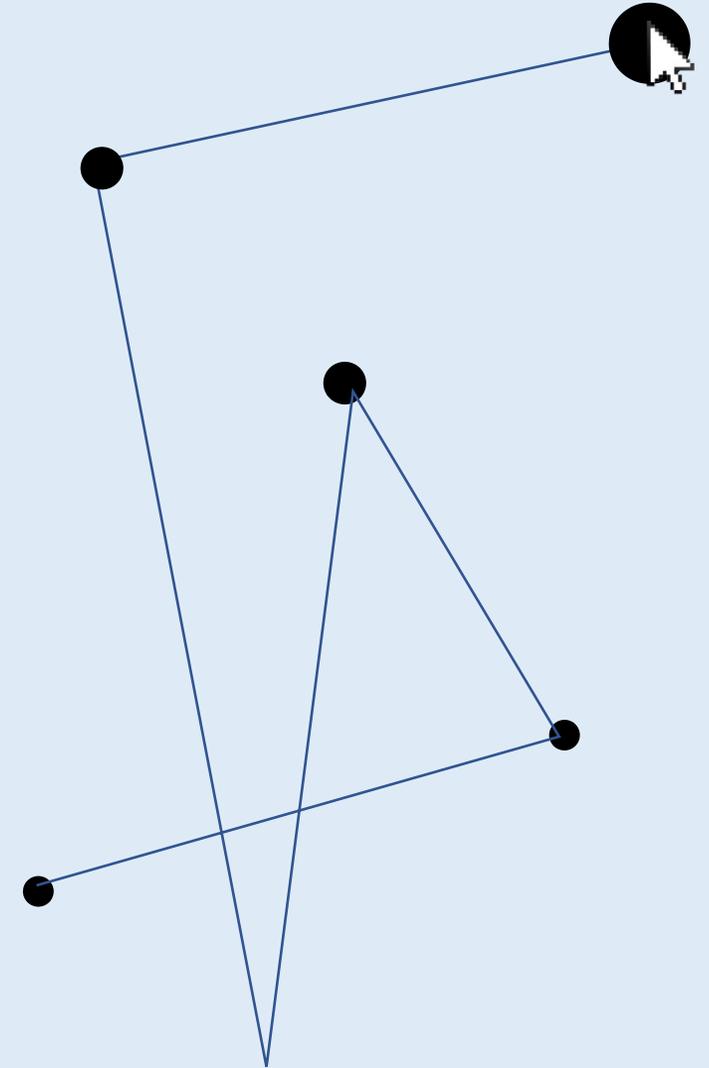
\*\* . Correlation is significant at the 0.01 level (2-tailed).

# ► Findings



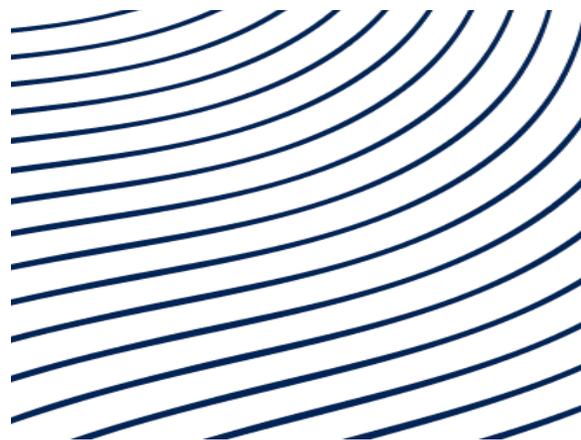
# ► Conclusion

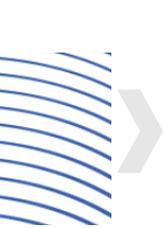
- SMATA: a prototype tool for the analysis and calculation of mouse attributes have been designed and implemented
- significant factors in the determination of the users' satisfaction with the usability in ECM systems are:
  - the number of direct movements,
  - the number of long direct movements,
  - the number of pauses
  - the covered distance
  - the session time



▶ End

Thank you for  
your attention!





# Sources

Analysing Business. (2017, November 11). Business Critical Application - Definition . Retrieved from <http://analysing-business.com/business-critical-application>

Analysing Business. (2017, November 11.). Business Critical Application VS Mission Critical Application. Retrieved from <http://analysing-business.com/business-mission-critical-application>

Atterer, R. W. (2006). Knowing the User's every move - user activity tracking for website usability evaluation and implicit interaction. Proceedings of the 15th international conference on World Wide Web (pp. 203-212). Edinburgh, Scotland: ACM New York, NY, USA. doi:10.1145/1135777.1135811

Bandura, A. (1977). Self-efficacy: Toward a unifying theory of behavioural change. *Psychological Review*, 8(2), 191-215.

Blackwell, A. F., Rode, J. A., & Toye, E. F. (2009). How do we program the home? Gender, attention investment, and the psychology of programming at home. *International Journal of Human-Computer Studies*(67), 324-341.

Brooke, J. (1996). SUS - A quick and dirty usability scale. In P. W. Jordan, B. Thomas, W. B.A., & I. (. McClelland, *Usability evaluation in industry* (pp. 189–194). London: Taylor & Francis.

Chen, M., Anderson, J. R., & Sohn, M. (2001). What can a mouse cursor tell us more? Correlation of eye/mouse movements on web browsing. *Ext. Abstracts CHI 2001*, 281-282.

Churruca, S. L. (2011). Comparative study of cursor movement patterns between a touchpad and a mouse devices. Master Thesis. Department of information and communications Technologies. UPF.

# Sources

Clicktale. (2018, Juni 10). Click maps. Retrieved from Clicktale: Click maps:

<https://www.internetrix.com.au/services/analytics/clicktale/click-maps/>

ClickTale Ltd. (2013, February 1). ClickTale: Basic System Manual. Retrieved from

<http://demos.clicktale-samples.com/Materials/Product/ClickTale%20User%20Guide%20April%202013.pdf>

Cohen, J. (1988). Statistical power analysis for the behavioral sciences. Hillsdale: NJ: Erlbaum.

Cooke, L. (2006). Is the mouse a "poor Man's eye tracker?". Usability and information design magazine, 252-255.

Davis, F. D. (1989). Perceived usefulness, perceived ease of use, and user acceptance of information technology. MIS Quarterly(13), 319-340.

Dijkstra, M. (2013). The diagnosis of self-efficacy using mouse and keyboard input. Utrecht: Faculty of Science Theses.

Ferreira, S., Arroyo, E., Tarrago, R., & Blat, J. (2010). Applying mouse tracking to investigate patterns of mouse movements in web forms. Pompeu: Universitat Pompeu Fabra.

Frøkjær, E., Hertzum, M., & Hornbæk, K. (2000, April 01-06). Measuring Usability: Are Effectiveness, Efficiency, and Satisfaction Really Correlated? CHI '00 Proceedings of the SIGCHI conference on Human Factors in Computing Systema, pp. 345-352.

doi:10.1145/332040.332455

Gerling, K. M., Klauser, M., & Niesenhaus, J. (2011). Measuring the impact of game controllers on player experience in FPS games.

MindTrek '11 Proceedings of the 15th International Academic MindTrek Conference: Envisioning Future Media Environments (pp. 83-86). Tampere, Finland: ACM. doi:10.1145/2181037.2181052

# Sources

Hinbarji, Z., Albatal, R., & Gurrin, C. (2015). Dynamic user authentication based on mouse movements curves. MultiMedia modeling: 21st international conference (pp. 111-122). Sydney, NSW, Australia, January 5-7,,: Springer International Publishing.

International Organisation for Standardisation. (1998). ISO9241 Ergonomic, Part 11: Guidance on usability. Geneva, Switzerland: International Organisation for Standardisation.

Keir, P. J., Bach, J. M., & Rempel, D. (1999). Effects of computer mouse design and task on carpal tunnel pressure. *Ergonomics*, 42(10), 1350-1360. doi:10.1080/001401399184992

Lee, G., & Chen, Z. (2007). Investigating the differences in web browsing behaviour of Chinese and European user using mouse tracking. In N. A. (Ed.), *Usability and internationalization* (pp. 502-512). Beijing, China: Springer-Verlag Berlin Heidelberg.

Leiva, A. L., & Vivó, R. (2008). A gesture Inference Methodology for user evaluation based on mouse activity tracking. *Proceedings of the IADIS international conference on interfaces and HCI*, 18-26.

Leiva, L. A., & Vivó, R. (2007). (smt) Real Time Mouse Tracking Registration and Visualization Tool for Usability Evaluation on Websites. *Proceedings of IADIS WWW/Internet*, 187-192.

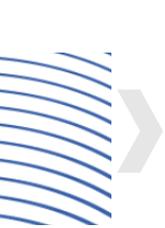
Leiva, L. A., & Vivó, R. (2012). Web Browsing Behavior Analysis and Interactive Hypervideo. *Proceedings of 21st conference companion on World Wide Web (WWW)* (pp. 381-384). Lyon, France: ACM New York. doi:10.1145/2187980.2188054

Leiva, L., & Vivó, R. (2013, October). Web browsing behavior analysis and interactive hypervideo. *ACM Transactions on the Web (TWEB)*, Volume 7(Issue 4), pp. 20-28. doi:10.1145/2529995.2529996

Lewis, J. R. (1995). *IBM Computer Usability Satisfaction Questionnaires: Psychometric Evaluation and Instructions for Use*. Boca Raton, FL: Human Factors Group.

# Sources

- Loewenstein, G. (1994). The psychology of curiosity: A review and reinterpretation. *Psychology Bulletin*, 116(1), 75-98.
- McCarney, R., Warner, J., Iliffe, S., Van Haselen, R., Griffin, M., & Fisher, P. (2007). Hawthorne Effect: a randomised, controlled trial. *BMC medical research methodology*, 7(1), 30.
- McQuiggan, S. W., & Lester, J. C. (2006). Diagnosing self-efficacy in intelligent tutoring systems: An empirical study. *Proceedings of the 8th International Conference on Intelligent Tutoring Systems*, 565-574.
- Mitakos, T., Almaliotis, I., & Demerouti, A. (2010). An Auditing Approach for ERP Systems Examining Human Factors that Influence ERP User Satisfaction. *Informatica Economică*, vol. 14(no. 1), 78-92.
- Mueller, F., & Lockerd, A. (2001). Cheese: tracking mouse movement activity on websites, a tool for user modeling,". *CHI '01, Extended Abstracts on Human Factors in Computing Systems*, 279-280.
- Naumann, A., Hurtienne, J., Israel, J. H., Mohs, C., Kindsmüller, M. C., Meyer, H., & Hußlein, S. (2007). Intuitive Use of User Interfaces: Defining a Vague Concept. In D. (. Harris, *Engineering Psychology and Cognitive Ergonomics. EPCE 2007* (pp. 128-136). Berlin, Heidelberg: Springer. doi:[https://doi.org/10.1007/978-3-540-73331-7\\_14](https://doi.org/10.1007/978-3-540-73331-7_14)
- Navalpakkam, V., & Churchill, E. (2012). Mouse tracking: measuring and predicting users' experience of web-based content. (ACM, Ed.) *Proceedings of the SIGCHI Conference on Human Factors in Computing Systems (CHI '12)*, 2936-2972.
- Nielsen, J. (2012, Januar 4). Usability 101: Introduction to Usability. Retrieved from Nielsen Norman Group: <https://www.nngroup.com/articles/usability-101-introduction-to-usability/>



# Sources

- Rodden, K. X., Fu, A. A., & Spiro, I. (2008). Eye-mouse coordination patterns on web search results pages. (ACM, Ed.) CHI '08 extended abstracts on human factors in computing systems, 2997-3002.
- Spool, J. M. (2005, January 10). uie articles. Retrieved from What Makes a Design Seem 'Intuitive'?: [https://articles.uie.com/design\\_intuitive/](https://articles.uie.com/design_intuitive/)
- Tanjim -Al- Akib, M., Ashik, L. K., Hosne-Al-Walid, & Chowdhury, K. (2016). User-modeling and Recommendation Based on Mouse-tracking for E-commerce Websites. 19th International Conference on Computer and Information Technology (pp. 517- 523). Dhaka, Bangladesh: North South University,. doi:10.1109/ICCITECHN.2016.7860252
- Torres, L. A., & Hernando, R. V. (2008, July 25-27). A Gesture Inference Methodology for User Evaluation based on Mouse Activity Tracking. Proceedings of the IADIS International Conference on Interfaces and Human Computer Interaction.
- Tzafilkou, K., & Protoperos, N. (2018, Februar 5). Mouse behavioral patterns and keystroke dynamics in End-User Development: What can they tell us about users' behavioral attributes? Computers in Human Behavior, pp. 288-305.
- Tzafilkou, K., Protoperos, N., & Yakinthos, C. (2014). Mouse Tracking for Web Marketing: Enhancing User Experience in Web Application Software by Measuring Self-Efficacy and Hesitation Levels. International Journal on Strategic Innovative Marketing, 233-247. doi:10.15556/IJSIM.01.04.005
- Vicente, A. d., & Pain, H. (2002). Informing the detection of the students' motivational state: an empirical study. Intelligent Tutoring Systems, Lecture Notes in Computer Science, 2363, 933-943.
- WorkPoint A/S. (2017). WorkPoint 365. Retrieved 12 10, 2017, from home page: <http://www.workpoint365.com/>
- Zahoor, S., Rajput, D., Bedekar, M., & Kosamkar, P. (2015). Inferring Web Page Relevancy through Keyboard and Mouse Usage. International Conference on Computing Communication Control and Automation, 474-478.
- Zimmermann, P., Guttormsen, S., Danuser, B., & Gomez, P. (2003). Affective computing--a rationale for measuring mood with mouse and keyboard. International journal of occupational safety and ergonomics, 9(4), 539-551.