APPENDIX

В

OUTLIERS DETECTION AND TREATMENT IN DATA GATHERED FROM MOTIVATION SURVEYS

Prior to any statistical analysis related to participants' motivation in the empirical studies, outliers identified as careless responses have been drop out from the data collected by motivational surveys (section B.1). These outliers correspond to incorrectly entered data by the students in the adapted Portuguese version of Intrinsic Motivation Inventory (IMI) and the Instructional Materials Motivation Survey (IMMS). After to remove the careless responses, outliers identified as extreme values are replaced to the trimmed minimum and maximum values by the Winsorization method (section B.2).

B.1 Removing Careless Responses

The questionnaires of the adapted Portuguese IMI have 24 items, so that a careless response is defined as a response in which the length of uninterrupted identical values for the items is greater than 12 (half of the items). For the data collected by the questionnaires of the adapted Portuguese IMMS, a careless response is defined as a response in which the length of uninterrupted identical values is greater than half of the items (12 items).

B.1.1 Intrinsic Motivation Inventory Data

Table 24 shows the two careless responses identified and removed from the IMI data collected over the pilot empirical study. These two careless responses corresponds to participants with user IDs 10119 and 10133; and they were identified in 32 responses collected from computer science undergraduate students by a web-based questionnaire of the adapted Portuguese version of IMI (shown in section C.1).

@@	UserID	Item01	Item02	Item03	Item04	Item05	Item06	Item07	Item08	
	10116	3	7	4	4	2	6	4	4	•••
	10119	4	4	4	4	4	4	4	4	•••
	10120	7	3	7	7	6	2	1	1	•••
•••										
	10132	1	7	7	6	4	4	3	4	
	10133	4	4	4	4	4	4	4	4	
	10134	2	6	4	4	3	3	4	6	•••
•••										•••

Table 24 – Summary of careless responses in the IMI data collected over the pilot empirical study

Table 25 shows the careless responses identified and removed from the data collected over the first empirical study. These two careless responses correspond to participants with user IDs 10229 and 10241, and they were identified in a set of 62 responses collected from computer engineer undergraduate students by means of the paper-based questionnaire version of IMI (shown in section C.2).

Table 25 – Summary of careless responses in the IMI data collected over the first empirical study

@@	UserID	Item01	Item02	Item03	Item04	Item05	Item06	Item07	
•••	•••	•••	•••	•••	•••	•••	•••	•••	
	10213	7	4	2	7	4	1	4	•••
	10229	4	4	4	4	4	4	4	•••
	10241	1	1	1	1	1	1	1	•••

Table 26 shows the four careless responses identified and removed from the IMI data collected over the third empirical study. These careless responses correspond to participants with user IDs 10178, 10196, 10211 and 10240. These four careless responses were identified in 55 responses collected from computer engineer undergraduate students by means of the web-based questionnaire version of IMI (shown in section C.4).

Table 26 – Summary of careless responses in the IMI data collected over the third empirical study

@@	UserID	Item01	Item02	Item03	Item04	Item05	•••
•••							
	10176	3	6	4	4	5	•••
	10178	4	4	4	4	4	
	10179	6	5	6	6	2	•••
	•••			•••	•••		•••
	10193	1	1	1	1	2	
	10196	4	4	4	4	4	•••

@@	UserID	Item01	Item02	Item03	Item04	Item05	
	10197	4	4	4	4	4	
	10210	1	7	7	4	1	
_	10211	4	4	4	4	4	
	10213	1	7	7	7	3	
	•••	•••	•••	•••	•••	•••	
	10238	3	5	5	5	4	
	10240	4	4	4	4	4	

Table 26 – (continued)

B.1.2 Instructional Materials Motivation Survey Data

No one careless response has been identified in 58 responses collected over the second empirical study by means of the paper-based questionnaire of the adapted Portuguese IMMS (section C.3). Table 27 shows the three careless responses identified and removed in the IMMS data collected over the third empirical study. These careless responses correspond to participants with user IDs 10196, 10211 and 10240; and they were identified in 55 responses collected from computer engineering undergraduate students by means of the web-based questionnaire version of IMMS (shown in section C.4).

Table 27 – Summary	v of careless respons	es in the IMMS	data collected over	er the third	empirical study
$-1abic \Delta I - 5ummar$	y of carcicos respons		uata concettu ov	or the time	cilipitical study

@@	UserID	Item01	Item02	Item03	Item04	Item06	
		•••					•••
	10193	1	1	1	2	1	
	10196	4	4	4	4	4	
	10197	7	5	3	7	5	•••
	•••	•••	•••	•••		•••	
	10210	1	1	1	1	1	
	10211	4	4	4	4	4	
	10213	5	7	7	5	7	•••
•••							•••
	10238	4	5	5	4	5	
	10240	4	4	4	4	4	•••

B.2 Winsorizing Extreme Values

In surveys, a extreme value is an outliers that happens when a participant has an extreme response style score (EXTREME..., 2008). These tendency of some participants to answer

surveys indicating extreme lower and upper values generates representative outliers that cannot simply removed from the data for the statistical analyses. Thus, to reduce the impact of extreme values in the surveys, by transforming the extreme values into a specified percentile of the data, the data collected by the motivation surveys had been Winsorized. Winsorization is a method that shrink extreme values to the border of the main part of the data, and it had been carried out with the robustHD package version 0.5 (ALFONS, 2016) in R software version 3.4.3 (R Core Team, 2017).

B.2.1 Intrinsic Motivation Inventory Data

Table 28 show the responses identified as extreme values in the data collected by means of the adapted Portuguese IMI over the empirical studies. This table also shows how these extreme values had been transformed into the trimmed minimum and maximum values by the Winsorization method for the validation of the adapted Portuguese IMI.

B.2.2 Instructional Materials Motivation Survey Data

Table 29 presents the responses identified as extreme values in the data collected over the empirical studies by means of the adapted Portuguese version of IMMS. This table also shows the changes in these extreme values by the Winsorization method for the validation of the adapted Portuguese IMMS.

Table 28 – Summary of Winsorized responses for the validation of adapted Portuguese IMI

Item21	:	9	9	_	3	5	7	1	2	5	_	9	:	5	4	5	:	5	3	5	9	7	7	3	1	9	:	5	2	4	:	7	4	_	:	7	3	2	9	7
Item20	:	2	-	2->6	2	3	1	7->6	4	2	9	_	:	_	5	3	:	7	2->6	3	1	2->6	2	4	9<- <i>L</i>	2	:	_	3	3	:	_	4	_	:	2	5	5	2	_
Item19	:	2	4	7	4	5	7	7	4	2	4	3	:	_	4	5	:	2	4	3	4	7	7	4	4	2	:	2	2	2	:	2	4	1	:	2	4	5	2	_
Item18	:	_	2	1	7->5	5	2	2	3	4	7->5	_	:	_	5	_		2	4	3	5	5	2	2	3	_		_	_	1	:	_	7->5		:	1	-	6->5	3	7
Item17	:	2	4	_	4	4	2->6	2	5	2	9<-/	_	:	_	4	4	:	2	4	3	3	9	2	5	9	_	:	7	2	3	:	2	4	_	:	1	9<-/	4	3	2
Item16	:	_	4	1	5	5	2	2	3	4	3	_	:	3	4	3	:	3	4	3	5	7->5	2	2	6->5	_		_	_	1	:	2	7->5	2	:	4	-	4	2	4
Item15	:	2	3	_	5	4	7	3	5	2	5	4	:	7	4	4	:	4	7	4	4	9	2	9	9	4	:	3	2	4	:	2	4	_	:	2	7	9	9	1
Item14	:	2	2	1	7->5	4	1	2	3	4	1	_	:	4	6->5	4	:	2	4	3	2	7->5	3	2	2	_	:	_	_	1	:	3	7->5	_	:	1		4	2	2
Item13	:	1	6->5	7->5	5		3	3			5		:	4	5	5					2						:	1	6->5	1				2	:	_	-	-	6->5	2
Item12	:	9	9	1	1	4	7	1	2	5	1	9	:	3		3	:	4	4	5	4	1	7	5	2	7	:	9	5	4	:	7	4	7	:	7	3	4	5	9
	:	:	:	:	:	:	:	:	:	:	:	:	:	:	:	:	:	:	:	:	:	:	:	:	:	:	:	:	:	:	:	:	:	:	:	:	:	:	:	:
Item09	:	9	9	1	2	5	5	1	2	5	1	5	:	9	4	5	:	4	4	5	4	_	7	5	4	9		9	9	5	:	7	4	7	:	9	3	5	7	9
Item08	:		_	J->6	_	16	61	_		2	9<-/	_	:	_	_	4	:	2	_	2	_	9<-/	1	6)	15	_		_	~	~	:	2		_	:		9<-/	16	~	
Item07		5	7		7	4,	(4	7				_		_	7	7		2	7											-			-		•			٠,		
Item06 I				7	2	2	1		4	5	9	_		S	4	en.		7		2	-	S												5				_	9	2
Item05 It	:	2	3	_	4	5	7	4	3	_	9	_	:	4	4	9	:	3	4	æ	1	7			9			2				3		_			7	S	9	3
Item04 It	:	9	9	->3 7	2	4	4	4	3	7	->3	4 5	:	7	->3 4	4		5	1	9	4		7		2		:	7 7	3				4		:		4	33	3	7
Item03 It				1 > 2 1			7	9	4	7	1	4	:	7	2	4	:	9	4	9					4	7	:	7			:	7	7	7					3	
Item02 It	:	5	5	Ţ	7	9	9	7	4	5	3	5	:	5	3	5	:	9	7	9	9	7	7	5	5	7	:	3	5	9	:	7	7	5	:	7	7	9	3	9
Item01 It	:	2	2	4	7	33	5	7	9	4	7	_	:	4	4	4	:	4	7	33	3	3	3	4	9		:	2	4	4	:	2	7	_	:	4	7	9	7	3
		5 5	4	3 1	1	4	4	. 1	1 2	5	, 1	5	:	-	1	1 2	:	4	1	5 5	4	4			1 3		:		9 7				4		:	9 :	4	4	7	3
y UserID	:	10126	10127	10128	10125	10130	10131	10132	10134		10136		:		10140												:	10171	10172	10174	:	10201	10202	10203	:	10208	10209	10210	10211	10212
Study	:	pilot	pilot	pilot	pilot	pilot	pilot	pilot	pilot	pilot	pilot	pilot	:	pilot	pilot	pilot	:	pilot	pilot	:	first	first	first	:	first	first	first	:	first	first	first	first	first							
<i>@ @</i>	:		Ŷ	Ŷ	Ŷ		Ŷ	Ŷ			Ŷ		:		Ŷ		:		Ŷ			Ŷ	Ŷ		Ŷ		:		Ŷ		:		Ŷ		:		Ŷ	Ŷ	Ŷ	

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00	Study	UserID	Item01	Item02	Item03	Item04	Item05	Item06	Item07	Item08	Item09	Itc	Item12 Ite	Item13 Ite	Item14 It	Item15 I	Item16	Item17	Item18	Item19	Item20	Item21
:	:	:	:	:	:	:	:	:				:	:	:	:			:	:	:	:	
	first	10221	4		9	9	9	4	2	_	5	4	_	_	4	_	_	_	_	7	4	5
Ŷ	first	10222			4	· v	- 2	9	1 4	2->e		-	7	3	7	. (7)	. ~	9	4	. 9	9	
	first	10223	9	2	9	5	9	2	3	_	9	9	3	1	2	(4	2	1	1	9	3	7
^	first	10224	9	4	4	7	7	4	4	2- >€	7	7	2	_	7			7->6	3	5	3	7
	first	10226	2	9	9	9	2	4	_	5	4		-	1	9		_	4	3	5	2	4
:	÷	:	:	:	:	:	:	:	:	:	:	:	:	:	:		:	:	:	:	:	:
	first	10238	4	4	5	7	33	5	2	4	3		2	4	7	•	+	5	5	3	2	4
Ŷ	first	10240	4	9	5	9	9	7	4	5	3		3	1	7			2->6	1	7	2->6	2
Ŷ	third	10169	7	4	5	7	5	2	5	2	7	7	5	7-	7->5 4			2	6->5	4	2	7
	third	10170	3	2	4	9	4	_	3	3	4		3	_	æ	_		2	1	2	2	9
	third	10171	5	2	7	7	9	2	_	_	7	5	_	2	2			2	1	_	2	9
Ŷ	third	10172	4	5	4	9	5	5	5	5	5	5	5	4	5			9	5	5	5	7
Ŷ	third	10174	3	4	4	4	5	3	2	4	4	9	5	4	4	4)		4	6->5	9	5	9
	third	10175	4	_	4	5	7	_	_	_	4		1	1	33			1	-	_	-	4
Ŷ	third	10176	3	9	4	4	5	5	5	4	4		4	4	4			4	6->5	5	5	4
	third	10179	9	5	9	9	2	5	_	4	4		2		7			9	2	4	4	3
^	third	10181	2	5	1->2	2->3	3	5	4	3	3	2	7-;	7->5 4	5			1	5	5	4	2
Ŷ	third	10183	3	2	2	2->3	2	3	3	5	3	2	4		4	- 47		4	5	4	4	3
	third	10184	4	3	3	5	3	4	4	4	3		4	4	4	eri		5	4	4	4	4
:	:	:	:	:	:	:	:	:	:	:	:	:	i		:	•		;	:	:	:	:
	third	10189	_	S	5	4	_	4	3	4	2	2	1		5	_		5	2	9	5	4
Ŷ	third	10190	2	ж	4	5	5	5	5	4	4		3		7			2->6	6->5	4	5	3
	third	10191	_	5	4	4	7	4	4	5	2	2	2		5			5	1	9	4	3
	third	10192	4	ж	7	9	4	4	5	4	5	::	_		æ	4		2	4	4	3	4
Ŷ	third	10193	_	_	1->2	1->3	7	_	2	_	_	2	1		_	-		1	2	_	1	1
	third	10197	4	4	4	4	4	2	3	4	2	2	3	33	2	(,)	3	3	5	3	3	5
:	:	:	:	:	:	:	:	:	:	:	:	:	:					:	:	:	:	:
	third	10203	5	-	7	7	4	1	1	1	4		-	. ,	2			-	_	1	5	3
٠	third	10204	_	7	4	4	_	7	-	2- ≻€	_	-	4	7-				2->6	7->5	7	4	
	third	10206	3	3	5	5	5	2	2	2	5		2	3	33			2	3	2	3	4
	third	10208	3	4	5	3	5	4	2	2	4	4	2	2	4			2	2	5	5	4
^	third	10209	2	7	3	3	_	7	3	2-> 6	2	2	2	2				9<-/	_	5	9	2
Ŷ	third	10210	_	7	7	4	_	7	_	J->6	_		_	7-	7->5 7	7 7	7->5	2->6	7->5	7	9<-/	1
Ŷ	third	10213	_	7	7	7	3	7	1	2-> 6	4		1	1	7			2->6	7->5	7	1	4
	third	10214	_	9	7	4	-	7	_	9	_			5	9			2	4	5	9	2
:	:	:	:	:	:	:	:	:	:	:	:	:	:	:	:		:	:	:	:	:	:
	third	10218	4	4	4	4	3	5	4	4	4		4	4	4	41	~	5	4	3	3	4
Ŷ	third	10219	4	-	1->2	1->3	_	4	7->6	7->6	1	2	5	_	7		_	7->6	_	7	7->6	
	third	10220	-	-	4	7	7	4	-	1	4		-	1			_	1	_	1	4	4

Table 28 – (continued)

@@	Study	UserID	Item01	Item02	Item03	Item04	Item05	Item06	Item07	Item08	Item09	:	Item12 I	tem13	Item14	Item15	Item16	Item17	Item18	Item19	Item20	Item21
Ŷ	third	10221	2	9	5	3	2	5	3	9	3	:	3 2		4	4	2	4	6->5	4	9	3
	third	10223	5	4	5	5	4	3	4	4	5	:	2		4	4	4	4	2	4	3	9
	third	10224	4	4	5	5	33	4	5	4	4	:	4		4	5	5	5	5	4	3	4
Ŷ	third	10226	_	7	1->2	1->3	_	7	7->6	2->6	_	:	,		7->5	7	7->5	2->6	7->5	4	4	4
	third	10227	5	3	4	5	5	3	3	3	3	:	3,		5	4	4	4	3	3	3	9
Ŷ	third	10228	_	_	1->2	1->3	_	_	_	2	1	:	2 2		2	2	3	2	2	_	2	2
Ŷ	third	10230	4	κ	Э	9	4	3	2	5	5	:	5		5	5	4	4	9->5	9	3	5
Ŷ	third	10231	9	2	1->2	9	7	2	4	2	4	:	5	3	1	_	_	_	_	2	4	4
	third	10232	4	ĸ	5	5	4	4	-	4	4	:	5	_	2	3	2	33	2	_	2	5
Ŷ	third	10234	_	7	1->2	5	3	9	9	9	2	:	2 (, 5<-5	4	9	2	9	2	9	5	2
Ŷ	third	10237	4	Э	4	5	5	3	4	4	5	:	5 2	٠ ـ ـ ـ ـ ـ ـ ـ ـ ـ ـ ـ ـ ـ ـ ـ ـ ـ ـ ـ	6->5	9	5	3	4	4	4	3
	third	10238	3	S	5	S	4	5	2	4	4		4	_	5	7	5	5	5	4	4	4

Table 29 - Summary of Winsorized responses for the validation of adapted Portuguese IMMS

Table 29 – (continued)

۔ ا	l																												
Item26	3	5	9	-	ю	:	5	_	5	4	4	_	4	2	8	:	-	2	S	4	2	9	e	4	:	4	2	4	:
Item25	3	3	5	1->2	4	:	4	4	9	3	4	4	4	2	4	:	7	3	7	5	5	9	2	4	:	7	4	5	:
Item24	1->2	3	9	1->2	5	:	5	1->2	4	4	4	1->2	7	2	2	:	4	4	2	4	1->2	5	2	3	:	9	5	5	:
Item23	4	2	4	1	3	:	_	7->6	3	3	5	_	5	9	1	:	4	4	3	4	5	4	2	5	:	2	9	4	:
Item22	5	-	7	1	1	:	2	1	4	3	-	4	5	-	1	:	4	3	5	4	4	9	1	2	:	7	-	2	:
Item21	5	3	1	1	5	;	4	_	3	5	4	2- >6	2	5	1	:	_	9	2	4	4	4	7->6	3	:	2	4	4	:
tem20		6)	7	_		:	_	_	_	~	~	_	6)	6)	_		_	61	_	_	_	, ,	6)	16	:	_		_	
-	:	:	:	:	7 ::	:	7 ::	:	· ::	:	:	:	:	:	-:	:	:	:	::	7 ::	7 ::	:	:	:	:	· ::	:	:	
Item11	3	3	4	1	4	:	4	1	5	3	4	1	4	3	4	:	4	4	4	5	4	5	_	7	:	9	1	5	:
Item10	2	3	4	2	_	;	4	9<-/	3	2	2	9<-/	_	5	_		_	4	3	3	4	2	2	4		2	_	4	
Item09	4	6)			2	:		`		_	_	`	~	_	16		_		_	-	` _		_	,	:	-		_	
Item08 1	7		7		4,	•	Ŭ		7	7	7	9	.,		4,	•	7	9	7	7		4,		Ŭ	•	7		7	•
	4	9	4	-	4	:	3	4	æ	æ	_	9<-/	-	Э	1	:	-	9<-/	4	ю	5	2	_	ж	:	_	2	7	:
Item07	5	7	4	2	4	:	7	1	4	7	-	-	7	-	_	:	1	3	4	4	1	5	_	2	:	4	7	3	:
Item06	9	4	4	1->2	5	:	7	1->2	9	4	4	1->2	7	1->2	2	:	7	33	4	5	2	4	1->2	2	:	5	9	2	:
Item04	9	2	4	2	7	:	4	_	4	2	2	_	5	_	4	:	_	4	3	4	3	5	_	3	:	4	2	4	;
Item03	5	3	5	1->2	3	:	4	4	4	3	1->2	1->2	7	2	2	:	4	4	3	5	3	5	1->2	5	:	5	1->2	3	:
Item02	9	4	4	1->2	5	:	7	1->2	5	4	4	1->2	7	2	2	:	7	2	4	5	4	4	1->2	5	:	9	2	5	:
Item01	3	4	4	_	7	:	4	_	4	2	2	_	5	3	5	:	4	2	4	5	4	5	_	4	:	4	9	3	:
UserID	10190	10191	10192	10193	10197	:	10203	10204	10206	10208	10209	10210	10213	10214	10215	:	10220	10221	10223	10224	10226	10227	10228	10230	:	10232	10234	10237	:
Study	third	third	third	third	third	:	third	third	third	third	third	third	third	third	third	:	third	third	third	third	third	third	third	third	:	third	third	third	:
<i>@ @</i>	Ŷ			Ŷ		:		Ŷ			Ŷ	Ŷ		Ŷ		:		Ŷ			Ŷ		Ŷ		:		Ŷ		: