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Article:

Ang, D orcid.org/0000-0003-3739-5870, Diecidue, E and Dewitte, S (2022) *To Deliberate or Not? The Effects of Anticipated Regret and Deliberation on Willingness-to-Pay*. *Journal of Business Research*, 151. pp. 563-578. ISSN 0148-2963

<https://doi.org/10.1016/j.jbusres.2022.07.013>

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To Deliberate or Not? The Effects of Anticipated Regret and Deliberation on

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Willingness-to-Pay

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Acknowledgments

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The authors acknowledge support from CONCORT, a EU funded (FP7) Marie Curie Initial

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training network.

21

Abstract

22 While consumers favor control over the price to pay, they also are deterred by the effort involved
23 and tend to underpay in participative pricing contexts. We identify anticipated regret and
24 deliberation as potential psychological determinants for consumers' willingness to pay (WTP). In
25 3 studies, we show that anticipated regret and deliberation increase the WTP for the preferred
26 option. Our single-paper meta-analysis (includes 11 studies) demonstrates the combined effect of
27 anticipated regret and deliberation on valuation across varying manipulations, purchase context,
28 goods, and decision contexts. By detailing how anticipated regret and deliberate increases WTP,
29 we offer a potential solution for underpaying and conclude by discussing directions for future
30 research and managerial implications.

31

Keywords: anticipated regret, deliberation, willingness-to-pay, participative pricing

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46 **To Deliberate or Not? The Effects of Anticipated Regret and Deliberation on**
47 **Willingness-to-Pay**

48 **1. Introduction**

49 Participative pricing strategies allow consumers to determine the price they are willing to pay.
50 These strategies come in many forms, from name-your-own-price, pay-what-you-want (PWYW),
51 auctions, exchanges to negotiations (for a review, see Kim et al., 2009). While participative
52 pricing can increase sales and brand loyalty, it also involves an inherent risk where consumers
53 (on average) pay much less than they would when prices are fixed (Wang et al., 2021). Notably,
54 Panera Bread and Lyft have discontinued participative pricing due to substantive losses (Viglia
55 et al., 2019). Thus, it is crucial to examine the factors that could increase the price consumers are
56 willing to pay.

57 One of the factors hindering the successful implementation of PWYW pricing strategies is the
58 cognitive effort involved (Chandran & Morwitz, 2005; Rathore et al., 2022). To determine a final
59 price, consumers need to weigh up the benefits of paying the lowest price possible against the
60 costs of being unfair and appearing cheap (Gneezy et al., 2012; Rabbanee et al., 2022).
61 Consumers also need to balance their negative feelings associated with overpaying (Kunter,
62 2015) with their long-term interests in keeping the seller in business (Wang et al., 2021).
63 Correspondingly, the deliberative effort of PWYW pricing deters consumers, reducing their
64 purchase intentions (Wang et al., 2022). We aim to mitigate this issue by identifying the
65 conditions under which deliberation could increase the price consumers are willing to pay for
66 their preferred option.

67 In particular, we posit that how deliberation affects willingness-to-pay (WTP) depends on
68 anticipated regret. Prior research has shown that reliance on feelings during deliberation led
69 people to hold more certain attitudes towards their preferences (Maglio & Reich, 2019).
70 Consequently, people who focused on feelings when processing decision-relevant information
71 were more likely to defend their decision against negative feedback, perceiving reviews against
72 their preference as less accurate (Maglio & Reich, 2020). We posit that anticipating regret during
73 deliberation could have a similar effect on attitude certainty, increasing WTP for their preferred
74 option. Since individuals cope with anticipated regret by bolstering the least objectionable option
75 during deliberation (Janis & Mann, 1970), we propose that deliberation increases WTP for the
76 preferred option when anticipated regret is high.

77 Across three experimental studies and a single-paper meta-analysis of 11 studies, we show
78 that consumers are willing to pay more for their preferred option after deliberating while
79 anticipating regret. This work contributes to the extant literature in several ways. Firstly, we
80 identify novel factors – deliberation and anticipated regret that could aid the successful
81 implementation of PWYW by boosting WTP. By doing so, we further the stream of research that
82 has identified factors such as guilt (Kutner, 2015), prosocial concerns (Gneezy et al., 2012),
83 reference prices (Johnson & Cui, 2013; Roy et al., 2021), payment timing (Viglia et al., 2019)
84 that affect WTP in participative pricing. In particular, we extend the literature where the
85 consumer's cognitive state is considered in participative pricing. While previous research has
86 revealed that pick-your-price (PYP) strategies, mental resources, and a high need-for-cognition
87 could mitigate the issues of cognitive effort in PWYW pricing (Rathore et al., 2021; Wang et al.,
88 2021; 2022), we identify another boundary condition - anticipated regret.

89 Secondly, our work contributes to the regret literature. While a considerable amount of
90 theoretical and empirical research (e.g., Loomes & Sugden, 1982; Connolly & Reb, 2003;
91 Zeelenberg & Beattie, 1997; Somasundaram & Diecidue, 2017) has examined the effects of
92 anticipated regret on *choice*, this research has largely neglected to address how anticipated regret
93 influences *valuation*. Our research attends to this research gap, showing that anticipated regret
94 increases WTP for the preferred option when coupled with deliberation. Lastly, we also broaden
95 the scope of feelings in decision-making (e.g., Pham, 2007). While previous research showed
96 that feeling-focused deliberation improves evaluations of the preferred option (e.g., Maglio &
97 Reich, 2019; 2020; Meloy, 2000), we show that this extends to a willingness to pay a higher
98 price.

99 **2. Conceptual development**

100 ***2.1 Deliberation***

101 The dual-process model posits that preferences are constructed by intuitive and deliberate
102 processes (Dhar & Gorlin, 2013). Some choices are attributed to rapid, unintentional, and
103 intuitive processing, whereas others arise from intentional and deliberative processing (Dhar &
104 Gorlin, 2013). Thus, intuitive processes rely on heuristics and require little cognitive effort.
105 Conversely, deliberative processes involve cognitive effort where individuals carefully consider
106 and analyze information in depth (Cacioppo & Petty, 1984; Wegener & Chien, 2013).
107 Participative pricing requires consumers to weigh up the benefits of maximizing their utility (i.e.,
108 paying anything, including \$0) against the cost to their reputation (Gneezy et al., 2012; Rabbanee
109 et al., 2022) and their long-term interests in keeping the seller in business (Wang et al., 2021). In
110 other words, deliberation - the "processes in which available attitude-relevant information is

111 scrutinized for its merits by comparing it with other available information." (Wegener & Chien,
112 2013) is inherent in participative pricing.

113 Although prior research has shown that the deliberation in PWYW pricing deters purchases
114 and sales, it is unclear how deliberation affects willingness to pay. While past research on
115 deliberation and choice evaluations could offer some clues, the results are equivocal. Option
116 attachment postulates that deliberating induces attachment to options, increasing the
117 attractiveness of the foregone option after choosing (Carmon et al., 2003). Conversely, pre-
118 decisional distortion asserts that new information is evaluated biasedly in favor of the preferred
119 option, resulting in more favorable evaluations (Russo et al., 2008). We postulate that the
120 reliance on feelings such as anticipated regret during deliberation could account for these mixed
121 findings. Specifically, we show that deliberation (vs. no deliberation) increases WTP for the
122 preferred option when anticipated regret is high.

123 *2.2 Anticipated regret*

124 When faced with difficult and important decisions, individuals often worry about it turning
125 out badly and regretting their choices (Zeelenberg & Pieters, 2007). Anticipated regret is a
126 comparison-based emotion of self-blame evoked when one anticipates that the current situation
127 would have been better if one had decided otherwise (Roese & Summerville, 2005; Zeelenberg
128 & Pieters, 2007). Individuals predict the possibility of regret and adjust their behavior to avoid it
129 (Bleichrodt, Cillo, & Diecidue, 2010; Somasundaram and Diecidue, 2017). Although predictions
130 of future feelings are not always accurate (Wilson & Gilbert, 2003), individuals still expect these
131 emotions and make decisions to minimize regret (Bleichrodt & Wakker, 2015; Zeelenberg &
132 Pieters, 2007). A meta-analysis revealed that anticipated regret is a strong predictor of behavior

133 (Brewer et al., 2016), affecting preferences for global vs. local brands (Davvetas &
134 Diamontopoulos, 2017), repeat purchases (Inman & Zeelenberg, 2002), hedonic vs. utilitarian
135 products (Sameeni et al., 2022), counterfeit products (Chen et al., 2015), and pricing promotions
136 (Scheinbaum et al., 2020).

137 Anticipated regret also underlies various pricing strategies. Coupon redemption increases just
138 before the expiration as consumers anticipate regret over non-usage (Inman & McMcAlister,
139 1994; Chiou-Wei & Inman, 2008). The Steadily Increasing Discount pricing strategy also
140 harnesses anticipated regret to boost purchases. By pitting product scarcity against a future
141 discount, this pricing strategy forces consumers to choose between cost savings and the potential
142 risk of missing out on the purchase (Gabler & Reynolds, 2013). Correspondingly, consumers
143 anticipate regret over missing out on the discount and the limited product (Gabler et al., 2017).
144 Similarly, in early-bird discounts, consumers often have to purchase a product (e.g., concert
145 ticket) at a discount without knowing if they can utilize it in the future (e.g., covid restrictions).
146 Thus, anticipated regret stems from the lost opportunity of the discount, forward purchasing
147 something that might not be needed later, and missing out on something of limited availability
148 (Diecidue et al., 2012). These findings suggest that managers should account for anticipated
149 regret in pricing decisions (Seo et al., 2020).

150 ***2.3 The moderating role of anticipated regret***

151 We posit that anticipated regret moderates the effect of deliberation on WTP. Specifically, we
152 predict that deliberation increases WTP for the preferred option when consumers anticipate
153 regret. Feelings have been found to moderate the effect of deliberation on choice evaluation.
154 When consumers are in a good (vs. neutral) mood, they tend to evaluate new information in

155 favor of a tentative choice during deliberation (Meloy, 2000). Similarly, when consumers
156 focused on their feelings (vs. details) during the decision-making process, they were more
157 satisfied with their preferred option (Mikels et al., 2011). Consumers who relied on their feelings
158 during deliberation (vs. no deliberation) also saw their preference as more representative of their
159 true selves, resulting in greater attitude certainty (Maglio & Reich, 2019). These findings suggest
160 that reliance on feelings during deliberation improves evaluations of the preferred option,
161 translating into a willingness to pay more.

162 We purport that anticipated regret moderates the effect of deliberation on WTP by allowing
163 for the spreading of alternatives (i.e., boosting the attractiveness of the preferred option and
164 reducing the attractiveness of the rejected alternative, Gilbert & Erbert, 2002). In other words,
165 people cope with anticipated regret by bolstering the least objectionable option during
166 deliberation (Janis & Mann, 1970). When consumers anticipate regret over irreversible decisions
167 (Mourali et al., 2018; Zeelenberg & Pieters, 2007), they attend to aspects of the decision that
168 increase satisfaction. Positive aspects of the preferred option and negative aspects of the
169 foregone alternative were more accessible than the negative aspects of the preferred alternative
170 and positive aspects of the foregone alternative when people made irreversible (vs. reversible)
171 decisions (Bullens et al., 2013). Thus, the more regret consumers anticipate, the more likely they
172 are to concentrate on the merits of their preferred option during deliberation, boosting the price
173 they are willing to pay. Formally, we hypothesize that

174 H1: Deliberation (vs. no deliberation) increases WTP for the preferred option to a
175 larger extent under high (vs. low) anticipated regret.

176 We also do not have strong arguments to expect an interaction effect of anticipated regret and
177 deliberation on the WTP for the foregone option because the focus of deliberation centers on the
178 preferred option (Gilovich & Medvec, 1995).

179 **3. Overview of studies**

180 We ran three experimental studies to examine the effect of deliberation and anticipated regret
181 on valuation. Study 1 shows that deliberating while anticipating regret increased WTP for the
182 preferred option. Study 2 demonstrates that the effect is robust regardless of incentives and
183 different anticipated regret manipulations. Study 3 shows that the effect of deliberation and
184 anticipated regret on WTP for the preferred option is robust even when money-back guarantees
185 are provided. An internal meta-analysis of 11 studies (these three and an additional eight studies
186 varying manipulations and decision contexts) further demonstrates that deliberating while
187 anticipating regret inflates the WTP of the preferred option.

188 **4. Study 1**

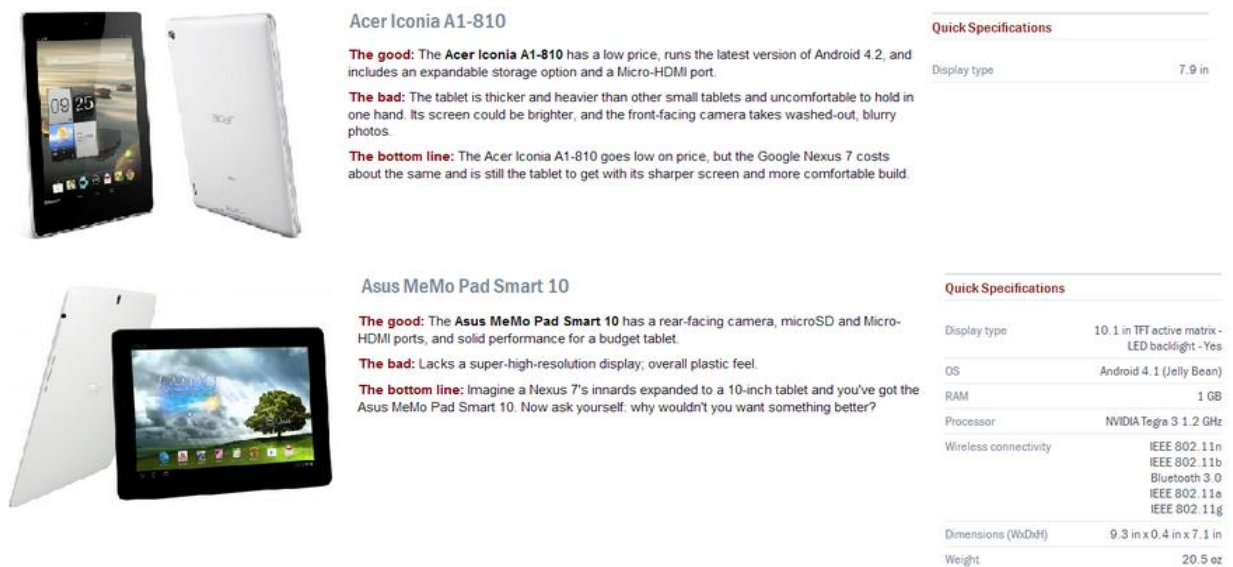
189 Study 1 demonstrates that deliberating in situations of high anticipated regret increases the
190 WTP for the preferred option. When faced with equally attractive options, deliberating in
191 situations of high anticipated regret offers an opportunity to bolster the least objectionable
192 option, increasing the valuation for the preferred option. When anticipated regret is high,
193 individuals who deliberated (vs. not deliberated) are expected to increase their WTP for the
194 preferred option. Among participants that deliberated, those who anticipated high (vs. low)
195 anticipated regret should increase their WTP for the preferred option.

196

197 **4.1 Method**

198 One hundred and twelve participants (60 males, $M_{\text{age}} = 27.06$) were recruited online for the 2
 199 (anticipated regret: low vs. high) x 2 (deliberation: no deliberation vs. deliberation) between-
 200 subjects experiment. They were randomly assigned to one of four conditions and awarded
 201 US\$3.50 for their participation.

202 The task required participants to indicate the attractiveness and willingness to pay for two
 203 tablets and choose the better option. Specifically, they were asked to imagine that they were in
 204 the market for a tablet and have shortlisted two options. For realism, pictures and product
 205 information on two tablets adapted from the popular electronics review site, CNET.com was then
 206 presented (Figure 1). The tablets were pretested for equal attractiveness and willingness to pay
 207 on Amazon Mechanical Turk, $F < 1$ (see Appendix A).

208 **Figure 1**209 *Product options for Study 1*


Acer Iconia A1-810

The good: The Acer Iconia A1-810 has a low price, runs the latest version of Android 4.2, and includes an expandable storage option and a Micro-HDMI port.

The bad: The tablet is thicker and heavier than other small tablets and uncomfortable to hold in one hand. Its screen could be brighter, and the front-facing camera takes washed-out, blurry photos.

The bottom line: The Acer Iconia A1-810 goes low on price, but the Google Nexus 7 costs about the same and is still the tablet to get with its sharper screen and more comfortable build.

Quick Specifications	
Display type	7.9 in

Asus MeMo Pad Smart 10

The good: The Asus MeMo Pad Smart 10 has a rear-facing camera, microSD and Micro-HDMI ports, and solid performance for a budget tablet.

The bad: Lacks a super-high-resolution display; overall plastic feel.

The bottom line: Imagine a Nexus 7's innards expanded to a 10-inch tablet and you've got the Asus MeMo Pad Smart 10. Now ask yourself: why wouldn't you want something better?

Quick Specifications	
Display type	10.1 in TFT active matrix - LED backlight - Yes
OS	Android 4.1 (Jelly Bean)
RAM	1 GB
Processor	NVIDIA Tegra 3 1.2 GHz
Wireless connectivity	IEEE 802.11n IEEE 802.11b Bluetooth 3.0 IEEE 802.11e IEEE 802.11g
Dimensions (WxDxH)	9.3 in x 0.4 in x 7.1 in
Weight	20.5 oz

210

211 Anticipated regret was manipulated by the expectation of feedback on foregone options and

212 an anticipated regret scale (e.g., Zeelenberg et al., 1996; Inman & Zeelenberg, 2002; Chen et al.,

213 2015). In the high anticipated regret condition, participants were told that they would discover
214 which tablet was rated as the better option by CNET experts at the end of the study (adapted
215 from Zeelenberg, 1999). To further incentivize participants, they were also told that only those
216 who chose the better tablet would be given a chance to win a \$50 Amazon voucher. Participants
217 were also asked how upset and regretful they would feel if they made the wrong choice on a 9-
218 point scale (1 = *not at all*, 9 = *extremely*; "How upset will you feel if you made the wrong
219 choice", "If you made the wrong choice, how much will you regret?" $\alpha = .97$; adapted from
220 Simonson, 1992). In contrast, participants in the low anticipated regret condition were simply
221 told to review the information carefully.

222 Next, in the deliberation condition, participants were asked to list the pros and cons of both
223 tablets. Those in the no deliberation condition simply moved on to the next part of the
224 experiment (Carmon et al., 2003).

225 After completing the manipulations, we measured perceived attractiveness and willingness-to-
226 pay for both options. To minimize order effects, the order in which the measures were presented
227 was randomized. All participants indicated their perceived attractiveness of both tablets on a
228 sliding scale ranging from 0 (*Very unattractive*) to 100 (*Very attractive*). We adapted the Becker-
229 DeGroot-Marschak (BDM) method (Wertenbroch & Skiera, 2002; Becker, DeGroot, &
230 Marschak, 1964) to elicit participants' willingness-to-pay (WTP) for both product options.
231 Specifically, we asked them if they would purchase the tablet at \$50. If they answered "no", they
232 indicated their WTP on a slider scale ranging from \$0 to \$49. If they answered "yes", they were
233 asked if they were willing to pay \$100. Contingent on their response, they were either asked if
234 there were willing to pay higher amounts in \$50 increments or indicate the amount they were
235 willing to pay on a slider scale ranging from the minimum to the maximum amount they had

236 previously indicated (e.g., \$50 - \$99). Unlike the original BDM method, we did not randomly
237 determine a price from a prespecified distribution and obliged participants to purchase the
238 product if their stated WTP was lower or equal to the randomly determined price.

239 Next, participants chose between the tablets. We then provided feedback on the better option
240 as suggested by CNET reviewers and measured experienced regret (1 = *not at all*, 9 = *very*
241 *much*; "To what extent do you feel regret; Itzchakov & Van Harreveld, 2018). To check for
242 demand effects, participants were asked to state the purpose of our study. Finally, demographic
243 information was collected. All participants were debriefed, given a chance to win the \$50
244 Amazon voucher, and thanked for their participation (see Appendix D for complete measures).

245 **4.2 Results**

246 **4.2.1 Manipulation checks.** As intended, participants in the high anticipated regret condition
247 predicted significantly more regret than the scale midpoint ($M = 5.62$, $SD = 1.87$ vs. the scale
248 midpoint of 5; $t(58) = 2.55$, $p = .01$, $d = .33$). Note that we did not measure anticipated regret in
249 the low regret condition as the measurement itself constituted the manipulation.

250 **4.2.2 The preferred option.** We identified participants' preferences based on their final
251 choice and coded $WTP_{\text{preferred}}$, WTP_{foregone} , $\text{attractiveness}_{\text{preferred}}$, $\text{attractiveness}_{\text{foregone}}$ accordingly.
252 Since our hypotheses focused on WTP, results on the other measures are presented in Appendix
253 D.

254 An ANOVA was also used to test the effects of anticipated regret and deliberation on WTP of
255 the preferred option. The analysis yielded a significant main effect of anticipated regret on
256 $WTP_{\text{preferred}}$, $F(1, 108) = 46.13$, $p < .001$, with participants in the high anticipated regret condition
257 ($M_{\text{highAR}} = \$136.03$, $SD = \$70.09$) willing to pay significantly more than their counterparts in the
258 low anticipated regret condition ($M_{\text{lowAR}} = \$62.30$, $SD = \$49.91$). Deliberation also had a

259 significant main effect on $WTP_{\text{preferred}}$, $F(1, 108) = 3.98$, $p < .05$. Participants that deliberated
260 ($M_{\text{deliberate}} = \116.59 , $SD = \$98.44$) were willing to pay significantly more for their preferred
261 option than those who did not deliberate ($M_{\text{no-deliberate}} = \89.13 , $SD = \$36.00$).

262 Consistent with our hypothesis, there was a significant interaction effect of anticipated regret
263 and deliberation on $WTP_{\text{preferred}}$, $F(1, 108) = 6.65$, $p < .001$. In the high anticipated regret
264 conditions, participants who deliberated ($M_{\text{highAR-deliberate}} = \163.97 , $SD = \$92.32$) were willing to
265 pay significantly more for their preferred option than participants who did not deliberate ($M_{\text{highAR-}}$
266 $\text{no-deliberate}} = \112.47 , $SD = \$28.15$, $F(1, 108) = 11.18$, $p < .001$). The effect of deliberation
267 attenuated in the low anticipated regret conditions, with no significant differences between
268 deliberation and no deliberation conditions in the low anticipated regret conditions, $F < 1$.

269 Viewed from the other angle, participants who deliberated were willing to pay significantly
270 more in the high anticipated regret condition ($M_{\text{highAR-deliberate}} = \163.97 , $SD = \$92.32$) than their
271 counterparts in the low anticipated regret condition ($M_{\text{lowAR-deliberate}} = \58.45 , $SD = \$71.92$, $F(1,$
272 $108) = 38.85$, $p < .001$). Amongst participants that did not deliberate, those in the high anticipated
273 regret condition ($M = \$112.47$, $SD = \$28.15$) were willing to pay significantly more for their
274 preferred option than those in the low anticipated regret condition, ($M = \$65.03$, $SD = \$26.04$),
275 $F(1, 108) = 10.20$, $p < .001$. This finding could suggest that participants in the high anticipated
276 regret condition naturally deliberated (despite the lack of explicit instruction), increasing the
277 price they were willing to pay.

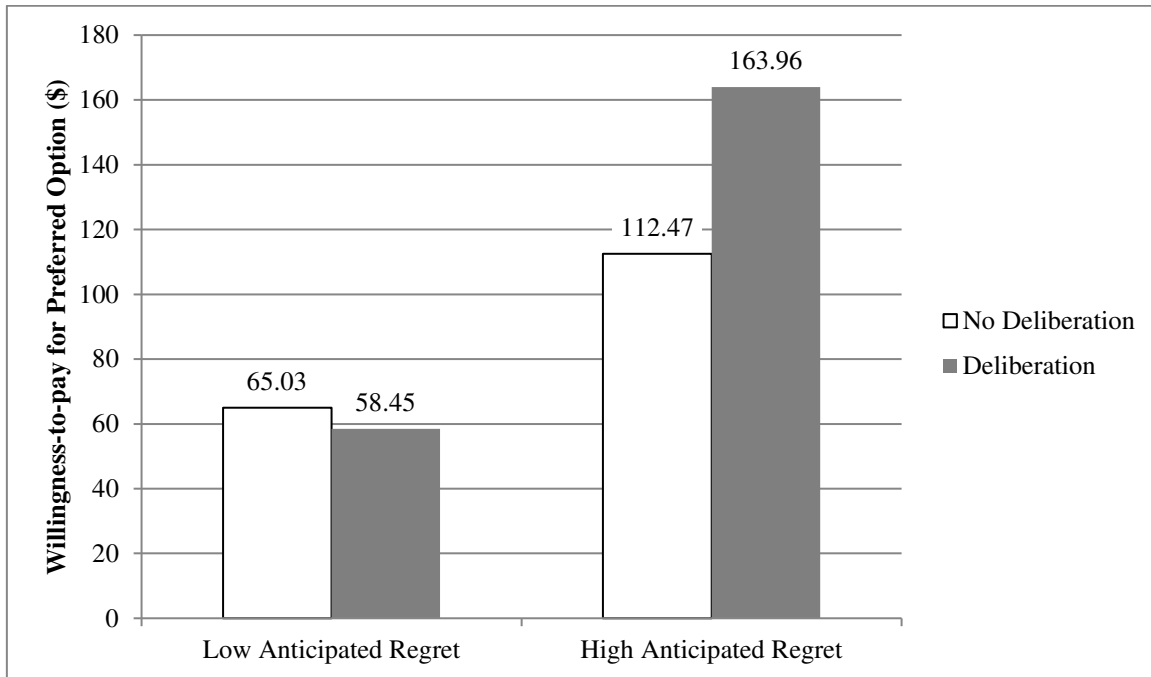
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283 **Figure 2**284 *2-way ANOVA results of Study 1*

285

286 **4.2.2 The foregone option.**

287 An ANOVA on the effects of anticipated regret and deliberation on WTP for the foregone

288 option yielded a non-significant interaction effect of anticipated regret and deliberation on

289 WTP_{foregone} , $F < 1$.290 **4.3 Discussion**

291 In support of our hypothesis, Study 1 shows that deliberating (vs. no deliberation) under high

292 (vs. low) anticipated regret increases the price consumers are prepared to pay for their preferred

293 option. However, Study 1 has some limitations. Incentivizing participants to choose in line with

294 expert reviews might have induced alternative negative feelings such as anxiety in addition to

295 anticipated regret. Study 2 replicates the effect of anticipated regret and deliberation on

296 $WTP_{\text{preferred}}$ without such incentives to address these issues.

297 Although we argue that the effects of deliberating when anticipating regret will occur when
298 options are equally attractive and challenging to differentiate, the options might be too similar
299 for a meaningful choice. Given that difficult trade-offs are a crucial determinant of anticipated
300 regret (Zeelenberg & Pieters, 2007; Zeelenberg et al., 1999), the lack of clear trade-offs between
301 the options could also reduce the strength of the anticipated regret manipulations. Moreover,
302 participants might not have deliberated since the product descriptions contained the pros and
303 cons required by the deliberation task.

304 **5. Study 2**

305 To address these shortcomings of Study 1, Study 2 replicates the finding that deliberating
306 under high anticipated regret increases WTP for the preferred option using a different anticipated
307 regret manipulation, other products, and omitting incentives. We also ensured that the provided
308 options had difficult trade-offs and highlighted product attributes rather than pros and cons;
309 while overall being equally attractive.

310 ***5.1 Method***

311 One hundred and fifty-nine participants (79 males), ranging from 17 to 62 years old, were
312 recruited online for the experiment and were awarded US\$2 for their participation. Similar to
313 Study 1, a 2 (anticipated regret: high vs. low) x 2 (deliberation: deliberation vs. no deliberation)
314 between-subjects design was also adopted. Participants were randomly assigned to one of the
315 four conditions. To ensure that the effects of deliberating while anticipating regret were robust to
316 incentives, participants were not incentivized to pick the best option.

317 Like Study 1, the task required participants to evaluate two options on attractiveness and WTP
318 and then choose an option. Instead of tablets, participants were presented with two second-hand
319 cars. Participants were asked to imagine moving to the UK and thinking of purchasing a car off a

320 popular website. Based on a guide price ranging from £3699 to £7899, they have narrowed their
 321 options down to two equally attractive cars with pictures and attribute information. To address
 322 the lack of clear trade-offs between options in Study 1, choosing between these two car options
 323 required difficult trade-offs: one car had great resale value, whereas the other had better engine
 324 performance and handling (see Figure 3).

325 **Figure 3**

326 *Product options used in Study 2*

Audi A3 1.6 Special Edition 3dr (2006) ★ Save | ▲ Report ad

0844234xxxxx [Reveal number](#)

Make Audi	Model A3 Special Edition	Year 2006	Mileage 84,129 miles
Seller type Trade	Body type 3 Door Hatchback	Fuel type	Transmission Manual
Colour Blue	Engine size 1,595 cc		

On the road ☆☆☆

- The dual-clutch S tronic gearbox disappoints, delivering jerky shifts
- Light steering - unstable driving experience at high speed

Ownership ☆☆☆☆☆


- Great resale value
- Impressive reliability record

In the cabin ☆☆☆☆☆


- Plenty of room upfront
- Beautifully crafted interiors

[Images](#) [Map](#)

[Check your credit score](#)



[Enlarge](#)



Volkswagen Golf V 2.0 SDI ★ Save | ▲ Report ad

Alan on 0740472xxxxx [Reveal number](#)

Make Volkswagen	Model Golf 5 Sdi	Year 2006	Mileage 84,255 miles
Seller type Private	Body type 5 Door Hatchback	Fuel type Diesel	Transmission Manual
Colour Black	Engine size 1,968 cc		

On the road ☆☆☆☆☆

- Sensational to drive - steering is well weighted, while the suspension manages to blend an extremely comfortable ride with good body control
- Very little engine & suspension noise


Ownership ☆☆☆

- Poor resale values compared to rivals in the same class
- Received 4 out of 5 stars on Euro NCAP crash tests


In the cabin ☆☆☆☆☆

- Drivers of all sizes should be able to find a comfortable driving position, thanks to the huge range of adjustment on offer
- Large boot with adjustable floor for even more luggage space

[Check your credit score](#)



[Enlarge](#)



327

328

329 Anticipated regret was manipulated in these product descriptions. To ensure that our findings
330 extend to other manipulations of anticipated regret, Study 2 adopted a different manipulation. As
331 hasty searches are considered a poor decision-making strategy (Reb, 2008), participants in the
332 regret condition were told that they shortlisted their options "after a quick search" to elicit
333 anticipated regret. We also included anticipated regret manipulations that were adapted from Reb
334 and Connolly (2009), where participants in the high anticipated regret condition were told the
335 following:

336 "As you make your decision, keep in mind that there is no guarantee that the product
337 you pick will be right for you. You could find yourself with a car that you don't like,
338 regretting your decision and wishing that you have preferred differently."

339 Since past research has established that expected feedback on post-decisional outcomes
340 causes individuals to anticipate regret (Zeelenberg et al., 1996; Zeelenberg., 1999), participants
341 in the high anticipated regret condition were told to expect feedback on whether their preferred
342 car turned out to be inferior. They also jotted down how they would feel if they discovered that
343 the foregone car turned out to be a better option (Inman & Zeelenberg, 2002; Shih & Schau,
344 2011).

345 In contrast, participants in the low anticipated regret condition were told that they arrived at
346 the two options "after an extensive search." The instructions also did not mention any feedback
347 on their choices.

348 To pretest this anticipated regret manipulation, 64 participants (23 female, 41 male, ranging
349 from 20 to 67 years old) were recruited on Amazon Mechanical Turk. Participants were
350 randomly assigned to low (vs. high) anticipated regret conditions. Subsequently, they indicated

351 how they felt while deciding on a 7-point scale (1= *completely disagree*, 7 = *completely agree*)
352 using the following statements: "I want to make a justified decision," "There is a strong
353 possibility that I'll regret my decision," "I'm afraid that I'll regret my decision," "I might blame
354 myself for making this decision" and "I'm worried about making a choice" (Connolly, Reb, &
355 Kausel, 2013; Simonson, 1992; Reb, 2008). These anticipated regret measures were averaged to
356 create a composite score ($\alpha = .99$). As predicted, participants in the high anticipated regret
357 condition ($M = 4.94$, $SD = 1.24$) reported more anticipated regret than in the low anticipated
358 regret condition ($M = 4.27$, $SD = 1.68$), $t(62) = -1.82$, $p = .07$, $d = -.45$. We did not include a
359 measured manipulation check for deliberation as it could interfere with our manipulation.

360 After reviewing the description of both cars, participants were randomly assigned to the no vs.
361 deliberation conditions. Those in the deliberation condition listed the pros and cons of both
362 options. Unlike Study 1, the product descriptions highlighted three product attributes rather than
363 pros and cons to ensure that participants had to expend cognitive effort during deliberation.
364 Participants in the no deliberation condition simply moved on to the next part of the experiment
365 (Carmon et al., 2003). Next, all participants indicated WTP and attractiveness for both options.
366 Similar to Study 1, participants indicated their WTP for both options using the adapted Becker-
367 DeGroot-Marschak method (Wertenbroch & Skiera, 2002; Becker, DeGroot, & Marschak,
368 1964). They also rated the attractiveness of both cars on a 7-point scale (1 = *not at all attractive*,
369 7 = *extremely attractive*) instead of a 100-point scale (0 = *not at all attractive*, 100 = *extremely*
370 *attractive*) of Study 1.

371 Participants then had to choose between the two options. To check for demand effects,
372 participants were also asked to state the purpose of our study. Finally, demographic information
373 was collected. All participants were debriefed and thanked for their participation. In particular,

374 we explained to participants in the high anticipated regret conditions that no feedback on choice
375 would be provided for the sake of time.

376 **5.2 Results**

377 **5.2.1 The preferred option.** ANOVA revealed a significant interaction effect of anticipated
378 regret and deliberation on $WTP_{\text{preferred}}$, $F(1, 158) = 7.46$, $p < .001$, consistent with our hypothesis.
379 When anticipated regret is high, participants who deliberated ($M_{\text{highAR-deliberate}} = £4378.68$, $SD =$
380 $£843.23$) were willing to pay more for their preferred option than those who did not deliberate
381 ($M_{\text{highAR-no-deliberate}} = £3883.13$, $SD = £1286.09$, $F(1,155) = 2.85$, $p = .09$). When anticipated regret
382 was low, participants who deliberated were willing to pay significantly less than those who did
383 not deliberate ($M_{\text{lowAR-deliberate}} = £3497.83$, $SD = £1684.34$ vs. $M_{\text{lowAR-no-deliberate}} = £4140.76$, $SD =$
384 $£1273.83$, $F(1,155) = 4.72$, $p = .03$). Viewed from the other angle, amongst those that deliberated,
385 participants in the high anticipated regret condition ($M_{\text{highAR-deliberate}} = £4378.68$, $SD = £843.24$)
386 were willing to pay significantly more than their counterparts in the low anticipated regret
387 condition ($M_{\text{lowAR-deliberate}} = £3497.83$, $SD = £1684.34$), $F(1, 155) = 9.23$, $p < .001$). These
388 findings replicate Study 1, suggesting that deliberating under high anticipated regret inflates
389 WTP for the preferred option. Results of the other measures are presented in Appendix E.

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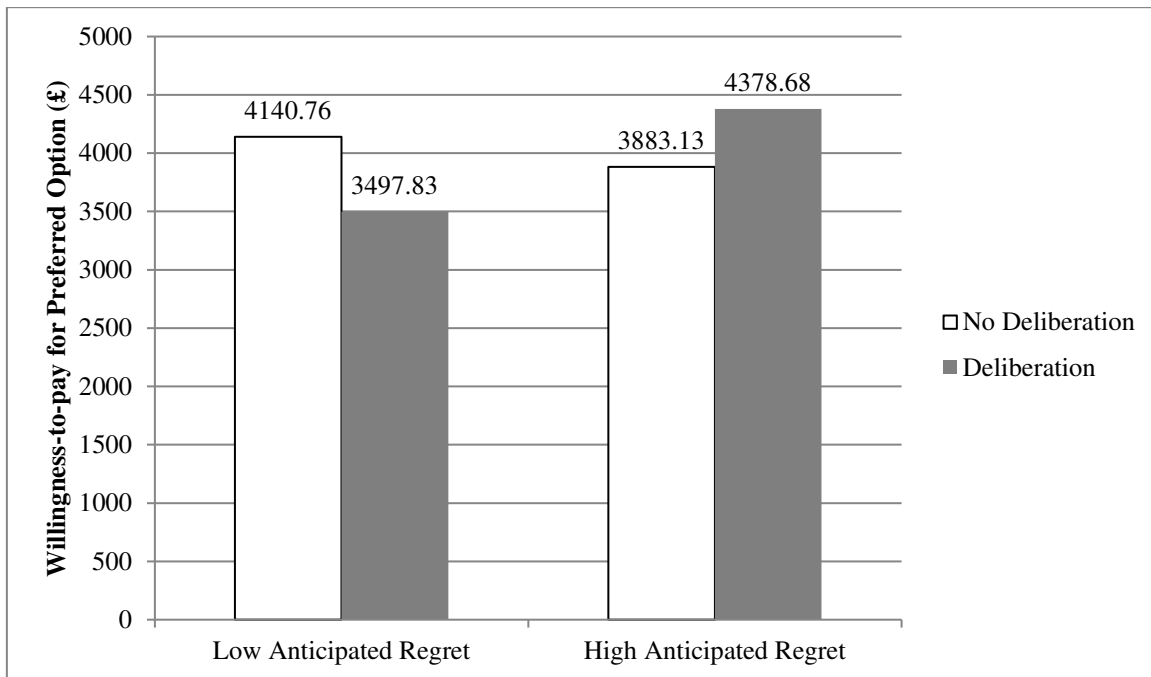
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397 **Figure 4**398 *2-way ANOVA results of Study 2*

399

400 **5.2.2 The foregone option.** ANOVA examining the effects of anticipated regret and
 401 deliberation on WTP_{foregone} revealed a significant main effect of anticipated regret, $F(1, 158) =$
 402 $7.76, p < .001$. Participants in the high anticipated regret condition ($M_{\text{highAR}} = \text{£}3738.50, SD =$
 403 $\text{£}1114.69$) were willing to pay significantly more for the foregone option than their counterparts
 404 in the low anticipated regret condition ($M_{\text{lowAR}} = \text{£}3175.47, SD = \text{£}1423.25$). No other effects
 405 were significant. More critically, there was no significant interaction effects of anticipated regret
 406 and deliberation on WTP_{foregone} , replicating Study 1.

407 **5.3 Discussion**

408 Study 2 replicates Study 1 with a different anticipated regret manipulation without incentives.
 409 Consistent with our predictions, we show that deliberating under high anticipated regret
 410 increases WTP for the preferred option compared to those that did not deliberate and those that
 411 deliberated in situations of low anticipated regret. By spreading alternatives and bolstering an

412 emerging preference, deliberating while anticipating regret increases the price consumers are
413 willing to pay for their preferred option.

414 **6. Study 3**

415 Studies 1 and 2 support our hypotheses that deliberation (vs. no deliberation) increases
416 WTP_{preferred} in high (vs. low) anticipated regret. However, it could be argued that participants
417 might not fully anticipate regret as they did not learn the outcomes of their choices at the end of
418 the experiment. Study 3 addresses this limitation by providing participants with negative
419 feedback of their choice at the end of the experiment. Moreover, Study 3 introduces a money-
420 back guarantee to evaluate the robustness of our findings. Consumers are less willing to pay a
421 premium when they are uncertain of how the purchase will turn out (Vigla et al., 2019). While
422 PWYW retailers could reduce such uncertainties by allowing consumers to pay after the service
423 experience (Vigla, 2019), this solution might not always be applicable. In such cases, retailers
424 might adopt other quality cues such as money-back guarantees to reduce consumers' perceived
425 risk (Suwelack et al., 2011). By offering a money-back guarantee, we test if deliberation and
426 anticipated regret still increase WTP for the preferred option when quality cues are present.

427 **6.1 Method**

428 Two hundred and seventeen participants (137 females, 15 to 76 years old) were recruited
429 online and were awarded US\$2 for their participation. To test if the effects of anticipated regret
430 and deliberation were moderated by the presence of a moneyback guarantee, a 2 (anticipated
431 regret: low vs. high) x 2 (deliberation: no deliberation vs. deliberation) x 2 (money-back
432 guarantee: no money-back guarantee vs. money-back guarantee) between-subjects design was
433 adopted.

434 Like in Study 2, the task required participants to evaluate two options on WTP and
435 attractiveness and then choose between them. The money-back guarantee and anticipated regret
436 were manipulated in the product description. In the money-back guarantee condition, participants
437 were told that one of the cars came with a six-month money-back guarantee. This guarantee was
438 not mentioned in the no-money-back guarantee condition.

439 In the high anticipated regret conditions, the possibility of regret was repeatedly highlighted,
440 and the two second-hand cars were shortlisted after "a quick search." While participants only
441 expected feedback on their choices in Study 2, we provided actual feedback on the preferred cars
442 at the end of Study 3. After choosing between the two cars, participants in the high anticipated
443 regret conditions were told that their mechanic revealed that their preferred car is "fraught with
444 problems" and that they could have been better off if they had preferred otherwise. The negative
445 feedback was provided regardless of which car they chose. Conversely, in the low anticipated
446 regret condition, the cars were shortlisted after "an extensive search," and the possibility of regret
447 was never mentioned. After reviewing the product descriptions, participants were presented with
448 the deliberation manipulations. The deliberation manipulation was exactly the same as Studies 1
449 and 2.

450 Similar to our previous studies, participants were asked to indicate their WTP using the
451 adapted Becker-DeGroot-Marschak method (Wertenbroch & Skiera, 2002; Becker, DeGroot, &
452 Marschak, 1964) as well as the attractiveness of both cars on a 7-point scale (1 = *not at all*
453 *attractive*, 7 = *extremely attractive*) before making a choice. They were then given feedback on
454 their preferred car. All participants then filled in a regret manipulation check by indicating the
455 extent they feel regret on a 7-point Likert scale (1 = *not at all*, 7 = *very much*; Itzchakov & Van
456 Harreveld, 2018). We used a regret measure as participants are experiencing regret after

457 receiving feedback on their choice. Finally, all participants provided demographic information
458 before being debriefed and paid.

459 **6.2 Results**

460 Participants in the high anticipated regret condition ($M = 4.75$, $SD = 1.62$) felt significantly
461 more regret than their counterparts in the low anticipated regret condition ($M = 2.17$, $SD = 1.38$),
462 $t(215) = -12.60$, $p < .001$. These results confirm that the manipulations were successful in
463 evoking regret.

464 **6.2.1 The preferred option.** ANOVA was conducted to examine the effects of anticipated
465 regret, deliberation, and money-back guarantee on the $WTP_{\text{preferred}}$. There was no significant
466 three-way interaction effect on $WTP_{\text{preferred}}$, $F(1, 209) = .73$, $p = .40$. Thus, offering a money-
467 back guarantee did not significantly influence the effects of anticipated regret and deliberation on
468 WTP for the preferred option.

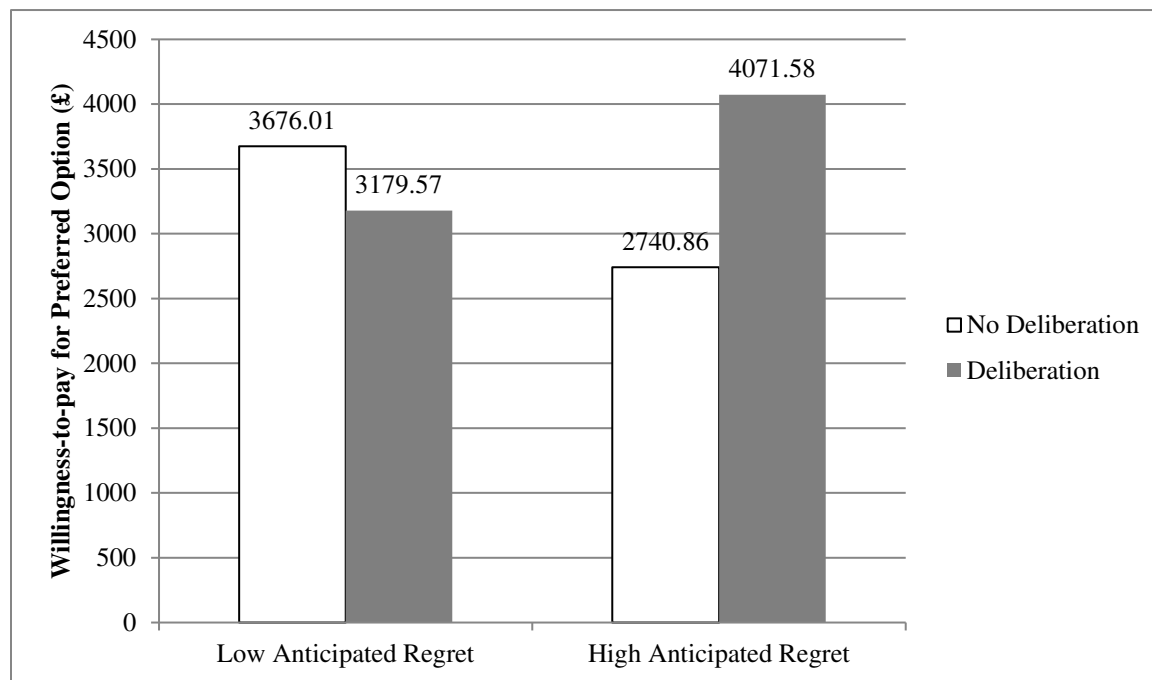
469 In line with our hypothesis, ANOVA also revealed a significant interaction effect of
470 anticipated regret and deliberation on $WTP_{\text{preferred}}$, $F(1, 209) = 11.63$, $p < .001$. In the high
471 anticipated regret conditions, participants who deliberated ($M_{\text{highAR-deliberate}} = £4071.58$, $SD =$
472 $£253.69$) were willing to pay significantly more for their preferred option than those who did not
473 deliberate ($M_{\text{highAR-no-deliberate}} = £2740.86$, $SD = £272.70$), $F(1, 209) = 12.77$, $p < .001$. The effects
474 of deliberation on $WTP_{\text{preferred}}$ were attenuated in the low anticipated regret conditions, $F(1, 209)$
475 $= 1.66$, $p = .20$.

476 Viewed from the other angle, participants who deliberated were willing to pay significantly
477 more in the high anticipated regret condition ($M_{\text{highAR-deliberate}} = £4071.58$, $SD = £253.69$) than

478 their counterparts in the low anticipated regret condition ($M_{lowAR-deliberate} = £3179.57$, $SD =$
 479 $£260.32$), $F(1,209) = 6.02$, $p = .02$.

480 **Figure 5**

481 *2-way ANOVA results of Study 3*



482

483 **6.2.2 The foregone option.** To test for the effects of anticipated regret and deliberation on

484 $WTP_{foregone}$, a 2(anticipated regret: low vs. high) x 2(deliberation: no deliberation vs.

485 deliberation) x 2(money-back guarantee: no money-back guarantee vs. money-back guarantee)

486 ANOVA was also conducted. The analysis only yielded a significant main effect of anticipated

487 regret, $F(1, 209) = 2.39$, $p = .02$, where participants in the high anticipated regret condition

488 ($M_{highAR} = £3535.92$, $SD = £1454.76$) were willing to pay significantly more for their foregone

489 option than those in the low anticipated regret condition ($M_{lowAR} = £3048.52$, $SD = £1724.48$).

490 The analysis revealed no other significant effects, $F_s < 1$. Results on the other measures are

491 presented in Appendix F.

492 **6.4 Discussion**

493 Consistent with our hypothesis, Study 3 replicates the main finding that deliberating under
494 anticipated regret increases the price consumers are willing to pay for their preferred option.
495 More importantly, we show that this effect occurs when consumers receive feedback on their
496 choice. We also show that this effect replicates when money-back guarantees are offered.

497 **7. Meta-analysis of 11 Studies**

498 **7.1 Meta-analysis procedure**

499 We tested the effect of deliberating while anticipating regret in a series of 11 different studies
500 with 930 participants. The characteristics of these studies are presented in Table 1. Since we
501 examine the effects of deliberating while anticipating regret on WTP, we focus on the contrast
502 between deliberating and no deliberation in situations of high anticipated regret (Hypothesis 1).
503 Deliberation was manipulated as in the previous studies. Anticipated regret was manipulated
504 either by highlighting the possibility of regret or providing expected feedback on the foregone
505 option. Our dependent measure, $WTP_{\text{preferred}}$ is identical across studies.

506 **Table 1.**

507 *Main characteristics of studies included in the meta-analysis.*

Study	High Anticipated Regret – Deliberation			High Anticipated Regret - No Deliberation			Purchase	Ownership Type	Hedonic vs. Utilitarian	Online vs. Lab Studies
	Mean	SD	N	Mean	SD	N				
Study 1	163.96	92.32	27	112.47	28.15	32	Tablets	Ownership	Utilitarian	Online
Study 2	4378.68	843.24	40	3883.13	1286.09	40	Second-hand cars	Ownership	Utilitarian	Online
Study 3	4071.58	1638.41	60	2761.44	2441.8	52	Second-hand cars	Ownership	Utilitarian	Online
Study 4	4005.02	1244.33	47	4071.77	1335.26	39	Second-hand cars	Ownership	Utilitarian	Online
Study 5	746.91	182.32	94	789.91	222.04	32	Studio apartment	Access		Lab
Study 6	57.7	15.97	45	56.54	13.83	54	Bali villa	Access	Hedonic	Lab
Study 7	45.97	18.86	33	42.67	17.42	33	Bali villa	Access	Hedonic	Online
Study 8	39.38	21.27	28	36.18	21.71	21	Bali villa Rental	Access	Hedonic	Online
Study 9	45.08	20.32	41	42.54	21.04	41	apartment	Access	Utilitarian	Online
Study 10	62.07	30.18	33	65.41	33.37	44	Bali villa	Access	Hedonic	Online
Study 11	391.22	75.79	51	395.26	58.77	43	Bali villa	Access	Hedonic	Lab

508

509

510 We followed Cumming's recommendations in our meta-analytic approach (Cumming, 2014)
511 and used R metafor package to conduct a random-effects model meta-analysis following
512 restricted maximum-likelihood estimation (Viechtbauer, 2010). The effect size and its 95%
513 confidence interval were computed for both deliberating in situations of high anticipated regret,
514 and no deliberation in conditions of high anticipated regret by taking the mean differences and
515 dividing them by the pooled standardized differences (Cohen's d). The difference was obtained
516 by subtracting the $WTP_{\text{preferred}}$ in the no-deliberation-high-anticipated-regret condition from the
517 deliberation-high-anticipated-regret condition. Hence, a positive effect indicates an increase in
518 valuation as a consequence of deliberating while anticipating regret. We report the Z -value
519 testing the null hypothesis that the mean effect $\mu = 0$ (Rosenthal, 1979). In addition, we used the
520 random-effects model to test the homogeneity of the effect sizes across studies by means of the
521 Q , I^2 , and T^2 statistics. The Q statistic computes the total variability of the effect sizes between
522 studies, weighted by the precision with which each effect size is measured. It is compared
523 against a chi-square distribution to test for heterogeneity in the effect sizes across studies. The I^2
524 and T^2 statistics are derived from Q . I^2 measures the degree of variability in effect sizes across
525 studies, correcting for the included studies. An I^2 statistic of 25% suggests low levels of
526 heterogeneity, while 50% suggests moderate degrees of heterogeneity, and 75% suggests high
527 levels of heterogeneity. The T^2 statistic is an estimate of τ^2 , which reflects the variance of true
528 effect size.

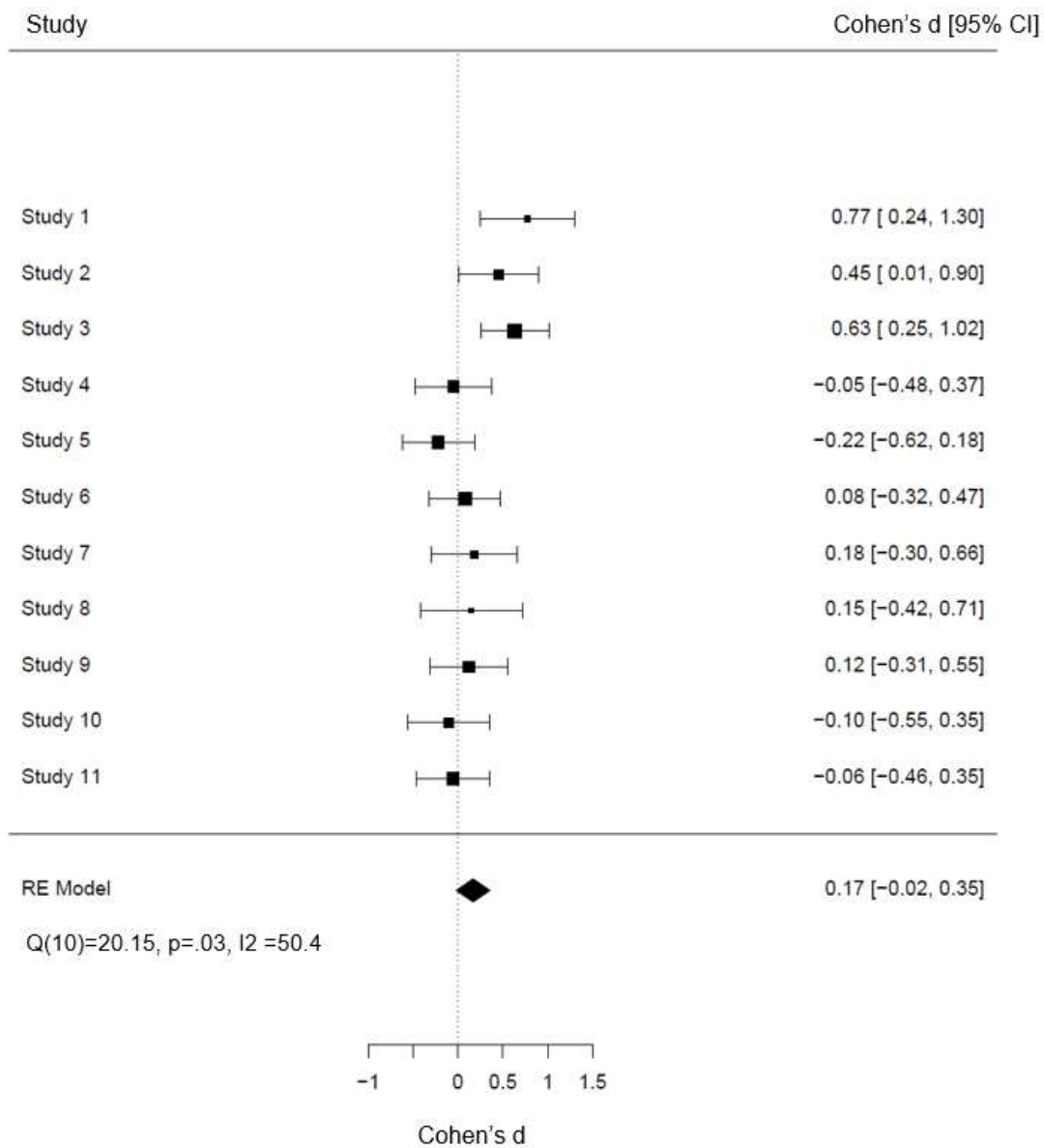
529 **7.2 Results**

530 The averaged corrected standardized mean difference for the effect of deliberating while
531 anticipating regret on WTP for the preferred option is $d = 0.17$, 95% $CI [-0.02, 0.35]$, $Z = 1.76$, p
532 $= .08$ (see Figure 6 for a Forest plot of the effect sizes and confidence interval). This result

533 suggests that deliberating while anticipating regret increases WTP for the preferred option. In
 534 addition, the Q statistic is significant, $Q(10) = 20.15$, $p < .03$, and the I^2 statistic is moderate
 535 (50.4%), suggesting that the dispersion observed in effect size is due to true effect sizes and not
 536 simply random dispersion. Thus, the effect sizes are heterogeneous across various studies.

537 **Figure 6**

538 *Forest plot for the effect of anticipated regret and deliberation on WTP for the preferred option.*



540 7.3 Moderation

541 To examine if the heterogeneity is due to moderators, we also coded a few potential
542 theoretical and methodological moderators such as ownership type (Bardhi & Eckhardt, 2017),
543 hedonic vs. utilitarian purchases (Dhar & Wertenbroch, 2000), and data collection methods (i.e.,
544 online vs. lab). We categorized ownership type based on Bardhi and Eckhardt's (2017) definition
545 of ownership vs. access. Ownership refers to a relationship between a person and a possession
546 where the owner has full property rights. Consumers often identify with their possessions, which
547 may become part of their extended self (Belk, 1988). Since the scenarios involved the purchase
548 of tablets or cars, allowing ownership of a material product, studies 1 to 4 were coded as
549 ownership. In contrast, access refers to temporary and circumstantial consumption where
550 consumers gain access to products or services through rental payment (Bardhi & Eckhardt,
551 2017). As studies 5 to 11 involved renting student accommodation or holiday stays, there was no
552 transfer of ownership, and participants paid to access these lodgings. Accordingly, studies 5 to
553 11 were coded as access.

554 We conducted a mixed-effect model meta-analysis using ownership type as a moderator,
555 using the same R metafor package (Viechtbauer, 2010). 82% of the total heterogeneity (r^2) can
556 be accounted for by including ownership type as a moderator. The test of moderators is also
557 significant ($QM = 7.94, p = 0.005$). The analysis with a Knapp and Hartung adjustment revealed
558 that the effect was significant for ownership ($d = .43, SE = .12, t = 3.59, p = .0003, CI [.20, .67]$),
559 but not for access ($d = .01, SE = .09, t = .06, p = .95, CI [-.17, .19]$). The test for residual
560 heterogeneity is not significant ($QE = 10.34, p = .32$), suggesting that other moderators might not
561 influence the willingness to pay (see Figure 7). These findings indicate that deliberation (vs. no

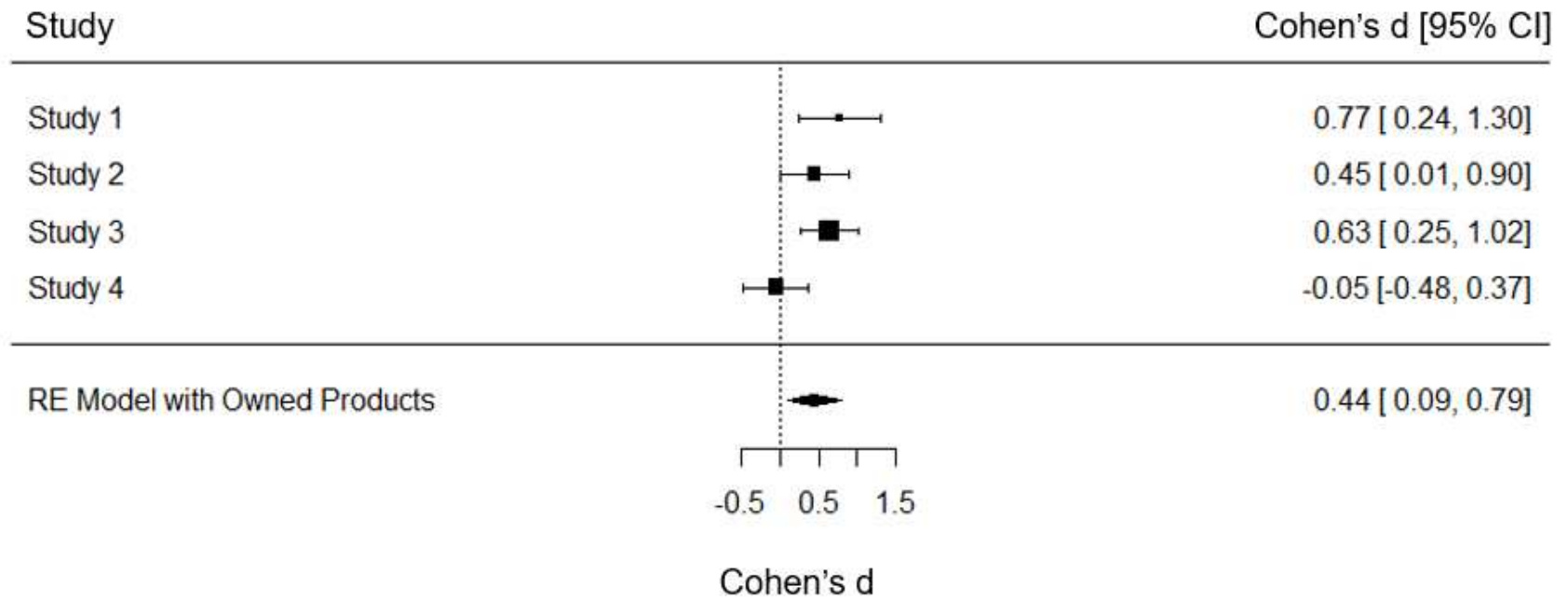
562 deliberation) increases WTP under high anticipated regret when individuals could own these
563 purchases and not when they are simply renting them.

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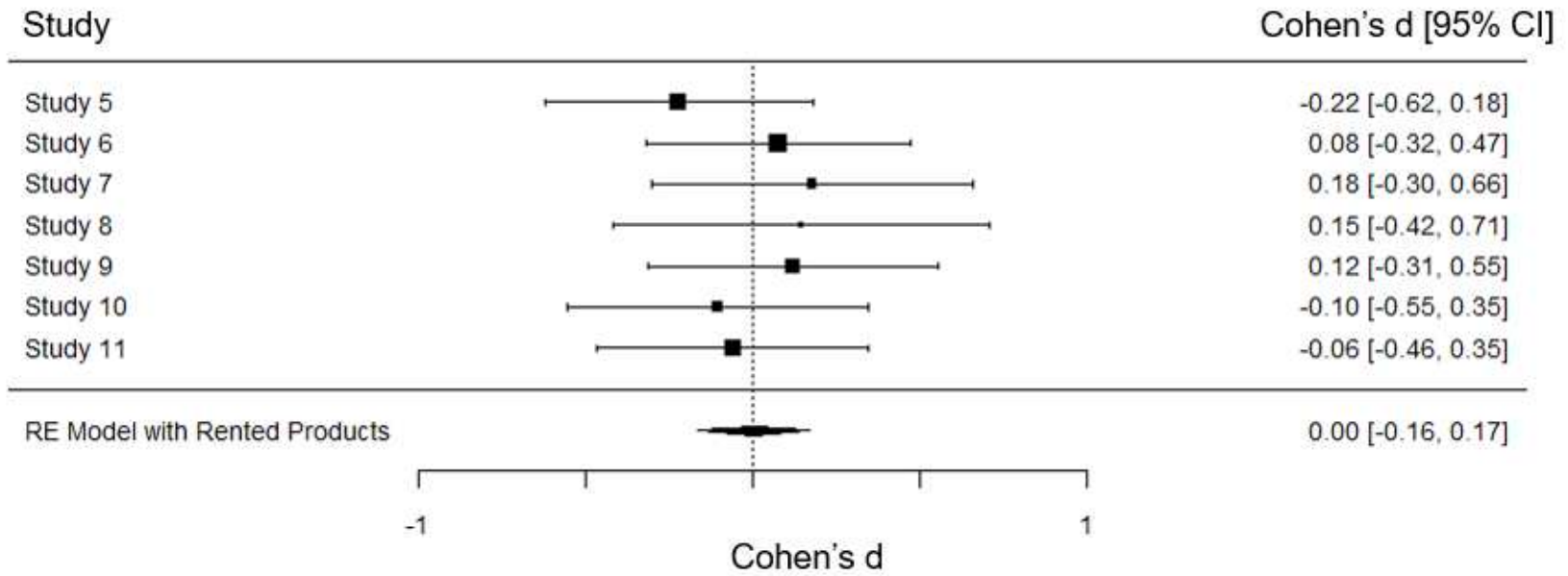
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566 **Figure 7**

567 *Forest plot for the effect of anticipated regret and deliberation on WTP for the preferred option for owned vs. access-based purchases.*



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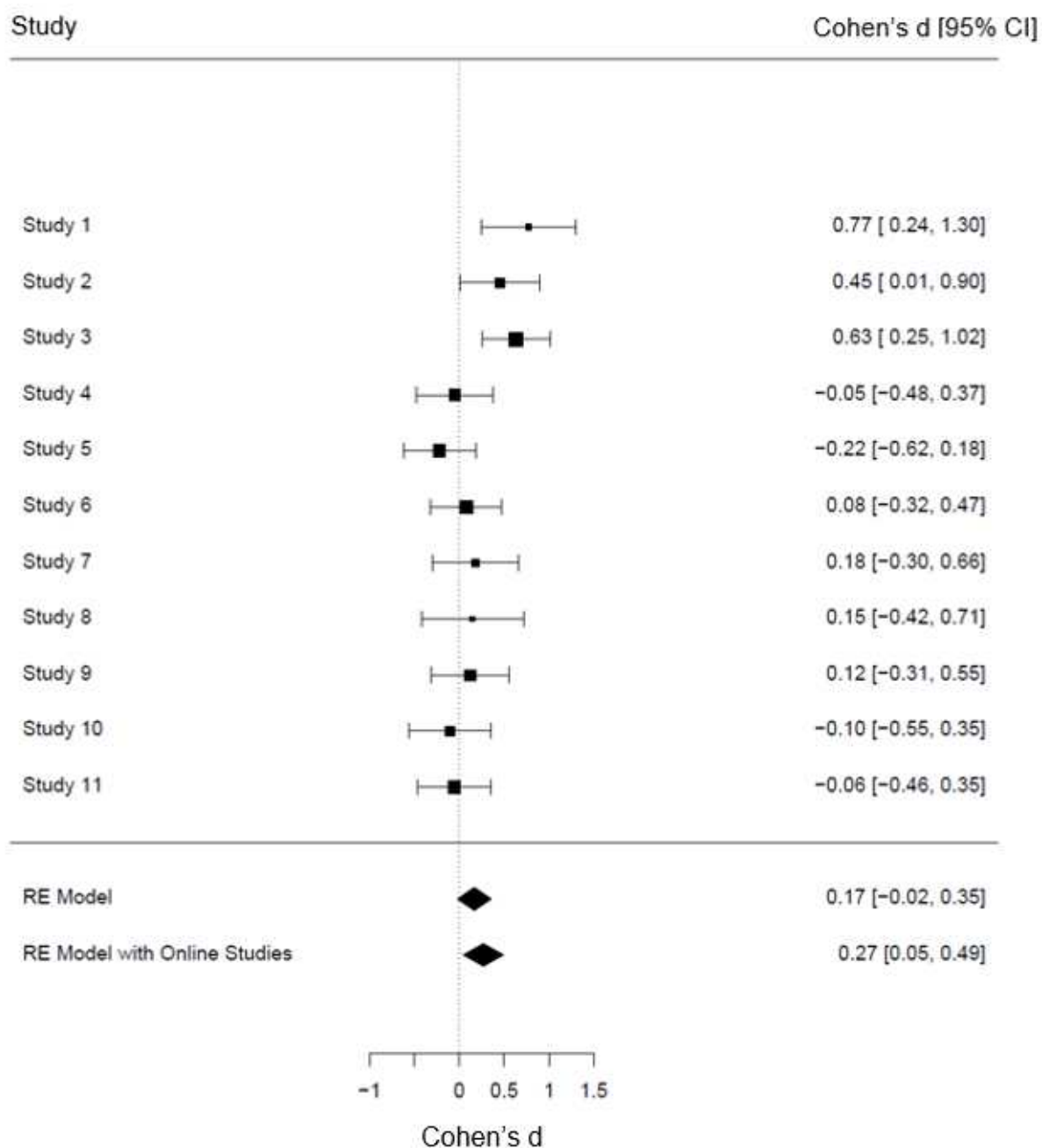


In addition to ownership type, our studies also varied in purchase type. We categorized purchases (i.e., tablets, second-hand cars, and student accommodation) as utilitarian when they were instrumental and functional. Conversely, purchases (i.e., renting Bali villas) that provided more fun and pleasure were categorized as hedonic (see Table 1 for details). We ran a separate mixed-effect model meta-analysis using hedonic vs. utilitarian purchases as a moderator. 10.14% of the total heterogeneity (r^2) can be accounted for by including hedonic vs. utilitarian purchases as a moderator. The test of moderators is not significant ($QM = 1.69$, $p = 0.19$). The test for residual heterogeneity is significant ($QE = 16.76$, $p = .05$), suggesting that other moderators might influence the effects. Thus, there is no evidence that these purchases' hedonic vs. utilitarian nature moderated the effect of deliberation (vs. not) under high anticipated regret on WTP.

We also categorized studies in terms of data collection. Specifically, studies that were conducted on platforms such as SocialSci, Prolific Academic, Amazon Mechanical Turk were coded as online, while those conducted in the lab of a large European university were coded as lab studies. A separate mixed-effect model with data collection method as a moderator revealed that 38.74% of the total heterogeneity (r^2) could be accounted for by including online vs. lab studies as a moderator. The test of moderators was not significant ($QM = 3.25$, $p = 0.07$). The analysis with a Knapp and Hartung adjustment revealed that the effect was significant for online studies ($d = .27$, $SE = .10$, $t(9) = 2.62$, $p = .02$, $CI[.04, .50]$), but not for lab studies ($d = -.06$, $SE = .15$, $t(9) = -.43$, $p = .68$, $CI[-.42, .28]$). The test for residual heterogeneity is not significant ($QE = 14.29$, $p = .11$), suggesting that other moderators might not influence the effects. While these findings suggest that the effects were more robust in online than lab studies, the analysis should be interpreted with caution given the small number of lab studies conducted.

Figure 8.

Forest plot with of all studies vs. online studies



8. General Discussion

By allowing consumers to determine the price they are willing to pay, participative pricing strategies often require deliberation. Consumers need to deliberate over the benefits of paying the lowest price possible against the costs of appearing unfair and cheap (Gneezy et al., 2012;

Rabbanee et al., 2022). Consequently, such cognitive effort decreases purchase likelihood and sales, impeding the successful implementation of PWYW pricing (Wang et al., 2022). We propose a novel solution – anticipated regret. Across three studies and an internal meta-analysis, we show that deliberation increases the prices consumers are willing to pay for their preferred option when they anticipate regret. This effect persists across various anticipated regret manipulations, regardless of incentives and money-back guarantees, but seems most reliable for goods and not for services.

8.1 Theoretical contributions

Firstly, we contribute to participative pricing literature. As aforementioned, the deliberative effort required to decide a final price often fatigues consumers, reducing purchases (Wang et al., 2021; 2022). We show that deliberation could be beneficial when anticipated regret is high. Specifically, when consumers anticipate regret, deliberation increases the price consumers are prepared to pay for their preferred option. Since underpaying is an inherent risk in PWYW, deliberation and anticipated regret are novel factors that could aid the successful implementation of PWYW by boosting WTP. By doing so, we further the stream of research that has identified factors such as guilt (Kutner, 2015), prosocial concerns (Gneezy et al., 2012), reference prices (Johnson & Cui, 2013; Roy et al., 2021), payment timing (Viglia et al., 2019) that affect WTP in participative pricing. In particular, we extend the literature where the consumer's cognitive state is considered in participative pricing. While previous research has revealed that pick-your-price strategies, mental resources, and a high need-for-cognition could mitigate the issues of cognitive effort in PWYW pricing (Rathore et al., 2021; Wang et al., 2021; 2022), we identify another boundary condition - anticipated regret.

Secondly, we extend on the regret literature. While a considerable amount of theoretical (Bell, 1982; Loomes & Sugden, 1982; Savage, 1952) and empirical research (Connolly & Reb, 2003; Zeelenberg & Beattie, 1997) has examined the effects of regret on *choice*, this research has largely neglected to address how anticipated regret influences *valuation*. Our research attends to this research gap, by showing that anticipated regret and deliberation increase WTP for the preferred option.

Thirdly, we also broaden the scope of feelings in decision-making (e.g., Pham, 2007). Prior research showed that reliance on feelings during deliberation bolsters people's confidence in their preferences (Maglio & Reich, 2019; 2020). We show that relying on specific emotions such as anticipated regret during deliberation allows for the spreading of alternatives, increasing the price individuals are willing to pay for their preferred option. This is consistent with anticipated regret regulation strategies (Zeelenberg & Pieters, 2007). Extant research has shown that individuals try to avoid regret by making justifiable decisions (Connolly & Zeelenberg, 2002; Reb, 2008). For instance, individuals could base their decisions on previous experiences (Zeelenberg et al., 1996) or pick out branded global products (Simonson, 1992; Davvetas & Diamantopoulos, 2018). To minimize regret, individuals also engage in robust satisficing - ensuring a good enough outcome when things go awry (Schwartz, 2015). Individuals who anticipate regret collect more information and take significantly longer to reach a decision (Reb, 2008). Our research shows that individuals can construct their own choice when faced with anticipated regret and deliberation. Namely, we demonstrate a critical consequence of robust satisficing – increased WTP for the preferred option.

8.2 Managerial implications

Despite its increasing popularity, the successful implementation of participative pricing is fraught with challenges (Kim et al., 2009). As consumers tend to underpay, companies have incurred substantial losses experimenting with PWYW mechanisms (Viglia et al., 2019). Moreover, the cognitive effort involved in determining a price often deters consumers, reducing purchases and sales (Wang et al., 2022). Our findings suggest that managers can use deliberation inherent in participative pricing to boost WTP by highlighting anticipated regret. Since anticipated regret and deliberation increase WTP, its interactive effects could serve as a potential solution against underpaying in PAYW settings.

Managers could harness anticipated regret by introducing scarcity in their pricing strategies. Taking a page from the coupon redemption literature (Scheinbaum et al., 2019), limiting the time participative pricing is available could make consumers anticipate regret over non-usage. By encouraging deliberation in such situations of anticipated regret, managers could increase the price consumers are willing to pay. Our studies elicited anticipated regret by getting participants to expect feedback on their choices. In other words, participants anticipate regret as they know that they will find out if their foregone option turned out to be better. Managers could imitate this by getting consumers to sign up for post-purchase emails where they will inform consumers on how all their offerings have fared. Thus, consumers will expect to find out if their foregone option has performed better than their preferred option. Again, encouraging deliberation when consumers anticipate regret could increase the price they are willing to pay for their preferred options.

Extant research suggests that consumers often anticipate regret when purchasing generic over established brands (Simonson, 1992) and local over global brands (Davvetas & Diamantopoulous, 2018). Thus, managers of generic and local brands could utilize the anticipated regret consumers already feel towards their brands and encourage deliberation to

increase WTP. They could also provide comprehensive information that allows comparisons across their various offerings to promote deliberation and thus boost consumers' willingness to pay.

Past research has shown that uncertainty about the purchase is one of the impediments to profitability in participative pricing strategies. Thus, retailers need to provide quality assurances such as payment after consumption (Vigla et al., 2019) or money-back guarantees (Suwelack et al., 2011) to increase the price consumers are willing to pay. Given that money-back guarantees do not significantly affect how deliberation and anticipated regret affect WTP, retailers might not need to use such promotional tools to boost the price premium.

Furthermore, the meta-analysis also reveals that the effect of deliberation and anticipated regret on WTP is stronger for owned products than access-based services. Correspondingly, using deliberation and anticipated regret to boost the price consumers are willing to pay might be applicable for managers selling products that consumers can own rather than those who rent out services (e.g., holiday accommodation).

8.3 Limitations and further research

Future work could address several issues. Firstly, our tasks did not explicitly state the participative pricing strategy adopted in the hypothetical stores. Instead, we simply asked participants their WTP for both options. While this might increase the generalizability of our findings, especially in a PWYW context, future research can examine our effects in specific participative pricing contexts. For instance, would anticipated regret and deliberation still increase WTP in the pick-your-price context since there is less uncertainty about what prices

to offer (Rathore et al., 2022)? Secondly, our studies focused on choice situations where participants could choose between two options. Future research could examine if deliberation and anticipated regret could boost WTP single option situations where regret stems from the possibility of under/overpaying (Balseiro et al., 2019) or missing out on limited stock (Gabler, 2013).

Moreover, valuation could have subsequent implications on behavior beyond perceived attractiveness and willingness to pay it. By showing that anticipated regret affects valuation, our studies go beyond mere preferences. They show that individuals also find the option more attractive and are more willing to pay for it. High valuations may also translate into greater willingness to wait for the option if it is unavailable or increase desire for relevant add-ons. Such behaviors could prove beneficial to marketers. By encouraging deliberation while anticipating regret, retailers could increase valuation and facilitate purchases for subsequent add-on products. In addition, individuals could be more forgiving of inventory problems as they are more willing to wait in such scenarios. These intriguing possibilities could be topics for future investigation.

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Appendix

Appendix A: Pretest 1 – Printers for Study 1

We recruited 28 (21 male, ranging from 20 to 64 years old) participants on Amazon Mechanical Turk to rate ten tablets on willingness-to-pay and attractiveness. Identical to Study 1, pictures and product information on the tablets adapted from the popular electronics review site, CNET.com. The tablets were presented in random order to prevent order effects.

Results.

From these ten tablets, we selected two tablets that were closest in WTP and attractiveness for Study 1. A t-test confirmed that there is no significant difference between the tablets in attractiveness ($M_{tablet1} = 3.07$, $SD = 1.41$ vs. $M_{tablet2} = 2.86$, $SD = 0.85$; $t(27) = .47$; $d = .14$) and willingness-to-pay ($M_{tablet1} = 278.39$, $SD = 135.61$ vs. $M_{tablet2} = 246.14$, $SD = 110.13$; $t(27) = 1.11$, $p = .28$; $d = .21$)

Appendix B: Anticipated Regret Manipulations Validation Test

Method

As pre-registered (https://aspredicted.org/WLG_Q13), 100 participants were recruited on Amazon Mechanical Turk for a one-factor (low anticipated regret vs. high anticipated regret) between-subjects experiment. Following the pre-registered plan, we discarded the responses of three participants who failed the attention check (final sample, $n = 97$, $M_{age} = 39.27$,

ANTICIPATED REGRET & DELIBERATION

48

40.2% female). Similar to Study 1, these participants were asked to imagine that they needed to purchase a printer and shown two options along with pictures and descriptions adapted from online information. The presentation of the printers was counterbalanced to prevent order effects. Participants were randomly assigned to one of the following conditions:

Low Anticipated Regret Condition.

Imagine yourself in the following scenario.

With the Covid pandemic, you find yourself working from home more often.

You need a compact printer.

After an **extensive search** online, you find the following printers within your \$50 to \$70 budget:

Canon PIXMA TS3350 Multifunction WiFi Printer

About this item

- Compact and connected - Enjoy multifunctionality and smooth wireless connectivity. Print, scan and connect to the cloud via the Canon Print app or get printing with AirPrint (iOS) and Mopria (Android)
- Print more - Enjoy the convenience of fine cartridges and extend time between ink top-ups with optional XL replacements
- Simple set-up - With wireless connectivity at the touch of a button, intuitive 1.5" Mono LCD and even easier set-up, it's never been simpler to get started
- Maximise savings - Save money and minimise waste thanks to cost-effective printing. Enjoy up to 50% cost savings when you use optional XL ink cartridges and save on paper with auto 2-sided printing
- Creative capability - stock up with 5"x5" square, stickable and magnetic media and try out the creative options of easy-photo print Editor and creative park



HP 5AR83B DeskJet 2710 All-in-one Printer with Wireless Printing

About this item

- Print, scan and copy
- Save up to 70 Percent on ink (HP 305 inks) with HP Instant Ink and never run out of ink; ordered by your printer, delivered to your door, 2 months trial included
- With HP Smart app, print and scan from virtually anywhere: Print documents, photos from the cloud, social media, scan with your smartphone camera
- Get better range and faster, more reliable connections using dual-band Wi-Fi with self-reset. Get started fast with simple setup that guides you through each step, using HP Smart app



High Anticipated Regret Condition.

Imagine yourself in the following scenario.

With the Covid pandemic, you find yourself working from home more often.

You need a compact printer.

After a **quick search** online, you find the following printers that are within your \$50 to \$70 budget:

ANTICIPATED REGRET & DELIBERATION

49

Canon PIXMA TS3350 Multifunction WiFi Printer

About this item

- Compact and connected - Enjoy multifunctionality and smooth wireless connectivity. Print, scan and connect to the cloud via the Canon Print app or get printing with AirPrint (iOS) and Mopria (Android).
- Print more - Enjoy the convenience of fine cartridges and extend time between ink top-ups with optional XL replacements.
- Simple set-up - With wireless connectivity at the touch of a button, intuitive 1.5" Mono LCD and even easier set-up, it's never been simpler to get started.
- Maximise savings - Save money and minimise waste thanks to cost-effective printing. Enjoy up to 50% cost savings when you use optional XL ink cartridges and save on paper with auto 2-sided printing.
- Creative capability - stock up with 5"x5" square, stickable and magnetic media and try out the creative options of easy-photo print Editor and creative park.



HP 5AR83B DeskJet 2710 All-in-one Printer with Wireless Printing

About this item

- Print, scan and copy
- Save up to 70 Percent on ink (HP 305 inks) with HP Instant Ink and never run out of ink; ordered by your printer, delivered to your door, 2 months trial included.
- With HP Smart app, print and scan from virtually anywhere: Print documents, photos from the cloud, social media, scan with your smartphone camera.
- Get better range and faster, more reliable connections using dual-band Wi-Fi with self-reset. Get started fast with simple setup that guides you through each step, using HP Smart app.



As you make your decision, keep in mind that there is **no guarantee that the product you pick will be right for you.**

You could find yourself with a product that you don't like, **regretting your decision and wishing that you have chosen differently**

After choosing between the printers, participants in the high anticipated regret conditions also jotted down how they would have felt if they found that their foregone option was better.

We used this thought elicitation protocol in this pretest instead of anticipated regret scales to elicit anticipated regret to minimize demand effects. Prior research have shown that anticipated regret scales and thought elicitation successfully manipulate anticipated regret (e.g., Chen, Teng, Liu & Zhu, 2015; Shih & Schau, 2011; Zeelenberg et al., 1996; Inman & Zeelenberg 2002)

To assess anticipated regret, all participants responded to Tsiros & Mittal's (2000) anticipated regret scale, "Do you anticipate feelings of regret, think you will be disappointed with your decision, think you will be unhappy with your decision?" (1 = *not at all*, 7 = *Very likely*; $\alpha = .92$).

Results.

A t-test confirmed that participants in the high anticipated regret condition anticipated more regret than their counterparts in the low anticipated regret condition ($M_{highAR} = 4.13$, $SD = 1.48$ vs. $M_{lowAR} = 3.27$, $SD = 1.82$; $t(95) = -2.56$, $p = .012$, $d = -.52$)

Appendix C: Deliberation Validation Test

Method

172 participants were recruited on Prolific Academic for this one-factor (no deliberation vs. deliberation) between-subject design. Similar to Studies 2 and 3, all participants were asked to imagine that they were moving to the UK and were thinking of purchasing a car off a popular bidding site. Based on a guide price ranging from £3699 to £7899, they have narrowed their options down to two equally attractive cars with difficult trade-offs. Next, participants were randomly assigned into one of two conditions. In the deliberation condition, participants listed the pros and cons of both options. To ensure that the tasks were equivalent, participants in the no-deliberation condition listed the pros and cons of unrelated products, online calendars.

Results

We operationalized deliberation via the cognitive process dimension using LIWC 2007 (e.g., think, because, should, always, maybe; Pennebaker, Booth, & Francis, 2007). As intended, participants in the deliberation condition used more words related to cognitive process than their counterparts in the no-deliberation condition ($M_{deliberation} = 11.59$, $SD = 7.04$ vs. $M_{no-deliberation} = 5.45$, $SD = 5.35$; $F(1, 169) = 52.13$, $p < .001$, $\eta^2 = .24$), controlling for word count.

Appendix D: Study 1

Complete measures

Anticipated Regret.

- How upset will you feel if you made the wrong choice? (1 = “not at all”, 9 = “Extremely”)
- If you made the wrong choice, how much will you regret? (1 = “not at all”, 9 = “Extremely”)

Deliberation.

- List the pros and cons of the ASUS tablet.
- List the pros and cons of the Acer tablet.

Attractiveness.

- How attractive is the Acer tablet (0 = “Very unattractive”, 100 = “Very attractive”).
- How attractive is the ASUS tablet (0 = “Very unattractive”, 100 = “Very attractive”).

Willingness-to-pay (adapted Becker-DeGroot-Marschak (BDM) method; Wertenbroch & Skiera, 2002; Becker, DeGroot, & Marschak, 1964).

- Will you pay \$x for the ASUS tablet? (No vs. Yes)
- How much are you willing to pay for the ASUS tablet? (slider scale)
- Will you pay \$x for the Acer tablet? (No vs. Yes)
- How much are you willing to pay for the Acer tablet? (slider scale)

Choice.

- Please indicate again which tablet would you purchase?

Experienced Regret.

- To what extent do you feel regret? (1 = “not at all”, 9 = “Very much”)

Research purpose

- What do you think is the purpose of this study? _____

*Note that measures with solid bullet points were counterbalanced.

Results

Experienced regret. ANOVA revealed no significant main effects of deliberation and anticipated regret on experienced regret. The interaction effect was also non-significant, $F(1, 111) = 2.88, p = .09$. Amongst participants who did not deliberate, those in the high anticipated regret conditions experienced more regret than those in the low anticipated regret conditions ($M_{highAR} = 3.75, SD = 2.45$ vs. $M_{lowAR} = 2.68, SD = 2.11$; $F(1, 108) = 3.55, p = .06$).

Attractiveness. Based on their final choice, we coded WTP_{chosen} , $WTP_{foregone}$, attractiveness_{chosen}, attractiveness_{foregone} accordingly. Given that WTP and attractiveness are theoretically

correlated variables, a MANOVA was used to investigate the effects of anticipated regret and deliberation on WTP and attractiveness of the chosen option. We found a significant main effect of anticipated regret, *Wilk's lambda* = .70, $F(2, 107) = 23.48$, $p < .001$. Deliberation did not have a significant effect, $F < 1$. Crucially, MANOVA also revealed a significant interaction effect of anticipated regret and deliberation, *Wilk's lambda* = .94, $F(2, 107) = 3.72$, $p < .001$. ANOVA revealed no significant effects of anticipated regret and deliberation on attractiveness of the chosen option, all $F_s < 1$.

To examine the effects of anticipated regret and deliberation on WTP and attractiveness of the forgone option, a MANOVA was adopted. The analysis revealed a significant interaction effect of anticipated regret and deliberation on valuation, *Wilk's lambda* = .92, $F(2, 107) = 4.70$, $p = .01$. No other significant effects were found. ANOVA also revealed no significant effects of anticipated regret and deliberation on the attractiveness of the foregone option, $F < 1$.

Appendix E: Study 2

Complete measures

Anticipated Regret.

- Jot down how it will feel if you discover that the car you've foregone turned out to be better. _____

Deliberation.

- List the pros and cons of this car.

Attractiveness.

- To what extent do you find this car attractive? (1 = "not at all attractive", 7 = "extremely attractive").

Willingness-to-pay (adapted Becker-DeGroot-Marschak (BDM) method; Wertenbroch & Skiera, 2002; Becker, DeGroot, & Marschak, 1964).

- Will you pay \$x for this car? (No vs. Yes)
- How much are you willing to pay for this car? (slider scale)

Choice.

- Which car do you prefer? (Car 1, Car 2)

Research purpose.

- What do you think is the purpose of this study? _____

*Note that measures with solid bullet points were counterbalanced

Results

Attractiveness. ANOVA revealed no significant interaction effects of anticipated regret and deliberation on the attractiveness of the chosen option, $F(1,158) = 3.07, p = .08$. There was no significant effects of anticipated regret and deliberation on the attractiveness of the foregone option, $F < 1$.

Appendix F: Study 3

Complete measures

Deliberation.

- List the pros and cons of this car
*repeated for both options

Attractiveness.

- To what extent do you find this car attractive? (1 = “not at all attractive”, 7 = “extremely attractive”).
*repeated for both options

Willingness-to-pay (adpated Becker-DeGroot-Marschak (BDM) method; Wertenbroch & Skiera, 2002; Becker, DeGroot, & Marschak, 1964).

- Will you pay \$x for this car? (No vs. Yes)
- How much are you willing to pay for this car? (slider scale)
*repeated for both options

Choice.

- Which car do you prefer? (Car 1, Car 2)

Experienced Regret.

- To what extent do you feel regret? (1 = “not at all”, 9 = “Very much”)

Research purpose.

- What do you think is the purpose of this study? _____

Results

Attractiveness. ANOVA revealed a significant interaction effect of anticipated regret and deliberation on attractiveness of the chosen option, $F(1, 209) = 10.94, p < .001$. When anticipated regret was high, participants who deliberated ($M_{highAR-deliberate} = 4.75, SD = .22$) found their

chosen option significantly more attractive than their counterparts who did not deliberate ($M_{highAR-no-deliberate} = 3.76$, $SD = .24$, $t(213) = 3.07$, $p < .001$). Amongst those who deliberated, participants in the high anticipated regret condition ($M_{highAR-deliberate} = 4.75$, $SD = .22$) found their chosen option significantly more attractive than their counterparts in the low anticipated regret condition ($M_{lowAR-deliberate} = 4.12$, $SD = .22$, $t(213) = 2.01$, $p = .05$). An ANOVA also showed no significant effects on the attractiveness of the foregone option, $F_s < 1$.