

Make Your Publications Visible.

A Service of



Leibniz-Informationszentrum Wirtschaft Leibniz Information Centre

Runge, Julian; Wentzel, Daniel; Huh, Ji Young; Chaney, Allison

Article — Published Version

"Dark patterns" in online services: a motivating study and agenda for future research

Marketing Letters

# **Provided in Cooperation with:**

Springer Nature

Suggested Citation: Runge, Julian; Wentzel, Daniel; Huh, Ji Young; Chaney, Allison (2022): "Dark patterns" in online services: a motivating study and agenda for future research, Marketing Letters, ISSN 1573-059X, Springer US, New York, NY, Vol. 34, Iss. 1, pp. 155-160, https://doi.org/10.1007/s11002-022-09629-4

This Version is available at: https://hdl.handle.net/10419/310008

# Standard-Nutzungsbedingungen:

Die Dokumente auf EconStor dürfen zu eigenen wissenschaftlichen Zwecken und zum Privatgebrauch gespeichert und kopiert werden.

Sie dürfen die Dokumente nicht für öffentliche oder kommerzielle Zwecke vervielfältigen, öffentlich ausstellen, öffentlich zugänglich machen, vertreiben oder anderweitig nutzen.

Sofern die Verfasser die Dokumente unter Open-Content-Lizenzen (insbesondere CC-Lizenzen) zur Verfügung gestellt haben sollten, gelten abweichend von diesen Nutzungsbedingungen die in der dort genannten Lizenz gewährten Nutzungsrechte.



https://creativecommons.org/licenses/by/4.0/

## Terms of use:

Documents in EconStor may be saved and copied for your personal and scholarly purposes.

You are not to copy documents for public or commercial purposes, to exhibit the documents publicly, to make them publicly available on the internet, or to distribute or otherwise use the documents in public.

If the documents have been made available under an Open Content Licence (especially Creative Commons Licences), you may exercise further usage rights as specified in the indicated licence.



#### **IDEA CORNER**



# "Dark patterns" in online services: a motivating study and agenda for future research

Julian Runge<sup>1,2</sup> · Daniel Wentzel<sup>2</sup> · Ji Young Huh<sup>1</sup> · Allison Chaney<sup>1</sup>

Accepted: 2 April 2022 / Published online: 14 April 2022 © The Author(s) 2022

#### Abstract

Some companies offering online services employ tactics that make it hard for customers to quit their accounts. These tactics are commonly referred to as "dark patterns" and may include hiding the cancelation procedure, asking customers to go through an excessive number of steps to complete the cancelation, or simply not letting customers quit their accounts straight away. Arguably, dark patterns are the result of misaligned incentives between companies and customers as companies can still benefit from their customers' data even if they no longer use the companies' services. Against this background, the authors conduct an observational survey of the state of current market practice and call for future research that enhances our understanding of dark patterns, their organizational antecedents, customers' psychological responses to these tactics, and the wider consequences of dark patterns for firms and markets.

**Keywords** Dark patterns · Online services · Platform economy · Privacy

The advent of digital communication channels has significantly lowered the barriers for canceling services. Rather than having to write a letter or visit a physical store to complete a cancelation process, customers can exit a service agreement by completing a few clicks online. Such lowered barriers typically apply to pure online

 □ Daniel Wentzel wentzel@time.rwth-aachen.de

> Julian Runge julian.runge@duke.edu

> Ji Young Huh jiyoung.huh@duke.edu

Allison Chaney allison.chaney@duke.edu

- Fuqua School of Business School, Duke University, 100 Fuqua Drive, Durham, NC 27708, USA
- School of Business and Economics, RWTH Aachen University, Templergraben 55, 52062 Aachen, Germany



players (e.g., Netflix) as well as companies that sell a physical product or service but also have a digital presence (e.g., New York Times). In response, companies frequently make it difficult for customers to actually quit their services. They may hide the cancelation procedure in their website or simply not let customers quit their accounts straight away, offering a "grace period" instead. Such tactics are typically referred to as "dark patterns" (Gray et al., 2018).

To examine the prevalence of these tactics, we conducted an observational study comparing the steps needed for joining vs. quitting online services. We first selected 40 well-known platforms across a variety of industries (see Table 1). We examined 31 of these platforms on their desktop website and 14 on their mobile app, based on the more commonly observed use context. For sign-up and cancelation procedures, we recorded the number of clicks required for completion, number of clicks actually spent, elapsed time, and noticeable characteristics throughout the procedures.

Our results highlight that many firms employ tactics that make deleting accounts much harder than creating accounts. Common tactics include requiring repetitive confirmation steps, suggesting deactivation rather than deletion, offering grace periods, or providing excessive details on reasons why one may not want to quit. These tactics significantly increase the effort needed for quitting an account. On average, creating an account required 18 actual clicks and took 1.7 min. In contrast, deleting the account required 27 actual clicks and took 4 min. Table 1 also compares the effort required for creating vs. deleting an account. Amazon, for example, has a cancelation-to-signup ratio of 220% on its app in terms of number of clicks required. This means that a user has to spend more than twice the clicks to cancel versus to create an account.

# 1 Why do companies use dark patterns?

An important question concerns why companies use dark patterns. One straightforward explanation is that companies believe that dissuading customers from leaving will increase the likelihood that they will re-engage in the future. Another explanation is that companies can still benefit from customers even if they are no longer active users. As long as they keep their accounts, companies have stronger legal grounds to keep using the data collected about a user. This data, in turn, can be leveraged for product development and targeting purposes (Wedel & Kannan, 2016). In fact, maintaining access to existing user data is gaining in relevance as it becomes harder for firms to collect data about users due to nascent privacy initiatives (Johnson et al., 2022).

Hence, cancelation processes create misaligned incentives between customers and firms. That is, companies may have an explicit interest in preventing their customers from quitting and resort to dark patterns to this effect. Should these tactics prove successful, this may entail substantial costs for consumers in the form of

<sup>&</sup>lt;sup>1</sup> Several platforms were examined on both websites and mobile apps, yielding a total number of 45 observations.



 Table 1
 Platforms across a variety of industries

Platform			Sign-up			Cancelation			Cancelation-to-signup ratio		
Amazon	Platform	Format	spent	clicks	clicks	spent	clicks	clicks	spent	clicks	# of clicks (spent)
Amazon   Website   2.5   15   19   6.5   16   26   260%   107%   137	Airbnb	Website	2.1	16	18	1.3	8	8	63%	50%	44%
Asana	Amazon	App	1.0	10	10	6.5	22	56	653%	220%	560%
BBC   Website   1.7   18   18   0.8   6   6   47%   33%   339   Bumble   App   2.5   30   37   0.4   6   6   6   17%   20%   169   Doordash   App   1.6   9   9   4.9   13   27   314%   144%   300   300   Espedia   Website   0.6   5   6   3.1   14   18   500%   280%   300   Espedia   Website   1.3   5   7   4.5   10   27   346%   200%   386   Facebook   App   2.7   22   23   3.0   11   23   110%   50%   100   Facebook   App   2.7   22   23   3.0   11   23   110%   50%   100   Facebook   Website   1.4   19   26   3.0   8   33   214%   42%   127   Fox News   Website   2.3   2.7   41   0.5   3   3   20%   11%   7%   7%   Gmail   App   3.4   22   24   1.3   10   10   38%   45%   42%   Gmail   Website   1.4   10   12   2.0   11   11   146%   110%   92%   Grubhub   App   1.6   10   18   9.6   30   45   619%   300%   250   Holds.com   Website   1.0   6   7   21.0   16   124   2100%   267%   177   Lyft   App   1.9   18   19   2.9   19   34   151%   106%   179   Medium   Website   1.3   14   18   1.3   6   6   95%   43%   339   MSN   Website   1.3   14   18   1.3   6   6   95%   43%   339   MSN   Website   1.3   8   8   4.0   21   30   316%   263%   375   App   2.7   52   55   5   3.7   32   42   197%   139%   142   100   10	Amazon	Website	2.5	15	19	6.5	16	26	260%	107%	137%
Bumble	Asana	Website	2.2	18	22	3.2	5	39	145%	28%	177%
Doordash   App   1.6   9   9   4.9   13   27   314%   144%   300     Etsy   Website   1.3   5   7   4.5   10   27   346%   220%   300     Expedia   Website   1.3   5   7   4.5   10   27   346%   200%   300     Facebook   App   2.7   22   23   3.0   11   23   110%   50%   100     Facebook   Website   1.4   19   26   3.0   8   33   214%   42%   127     Fox News   Website   2.3   27   41   0.5   3   3   20%   11%   7%     Gmail   App   3.4   22   24   1.3   10   10   38%   45%   42%     Gmail   Website   1.4   10   12   2.0   11   11   146%   110%   7%     Grubibub   App   1.6   10   18   9.6   30   45   619%   300%   250     Hinge   App   2.7   52   59   0.5   5   6   17%   10%   109     Hotels.com   Website   1.0   6   7   21.0   16   124   2100%   267%   1771     Lyft   App   1.9   18   19   2.9   19   34   151%   106%   179     Medium   Website   1.3   14   18   1.3   6   6   595%   43%   339     MSN   Website   1.3   14   18   1.3   6   6   595%   43%   339     MSN   Website   1.3   14   18   1.3   6   6   595%   43%   339     Netflix   Website   3.3   18   19   5.0   6   27   152%   33%   142     New York Times   Website   1.3   8   8   4.0   21   30   316%   263%   375     Open Table   Website   1.8   17   22   4.2   39   57   237%   229%   229%     Overleaf   Website   0.6   3   4   1.0   6   6   165%   200%   450     Resy   Website   1.7   13   15   8.6   10   47   515%   77%   313     Sangchat   App   2.0   21   23   5.5   11   27   276%   52%   117     Spotify   App   1.1   13   15   8.6   10   47   515%   77%   313     Spotify   Website   1.4   19   23   3.3   15   24   238%   79%   104     SquareSpace   Website   1.4   19   23   3.3   15   24   238%   79%   104     SquareSpace   Website   1.7   13   15   5.4   16   43   193%   145%   168     Tildow   Website   1.0   11   11   3.5   9   34   337%   438   48%     Vimeo   Website   1.6   7   8   1.4   8   8   86%   110%   171     Yelp   App   1.1   12   14   3.5   21   35   328%   175%   250     Velp   App   1.1   12   14   3.5   21   35   328%   175%	BBC	Website	1.7	18	18	0.8	6	6	47%	33%	33%
Etsy Website 0.6 5 6 3.1 14 18 500% 280% 300 Expedia Website 1.3 5 7 4.5 10 27 346% 200% 386 Facebook App 2.7 22 23 3.0 11 23 110% 50% 100 Facebook Website 1.4 19 26 3.0 8 33 214% 42% 120 Fox News Website 2.3 27 41 0.5 3 3 20% 111% 7% Gmail App 3.4 22 24 1.3 10 10 38% 45% 42% Gmail Website 1.4 10 12 2.0 11 11 146% 110% 92% Grubhub App 1.6 10 18 9.6 30 45 619% 300% 250 Hinge App 2.7 52 59 0.5 5 6 17% 100% 100 Hotels.com Website 1.0 6 7 21.0 16 124 2100% 267% 1771 Lyft App 1.9 18 19 2.9 19 34 151% 106% 179 Medium Website 1.3 14 18 1.3 6 6 95% 43% 33% MSN Website 1.9 23 25 3.7 32 42 197% 139% 168% Netflix Website 3.3 18 19 5.0 6 27 152% 33% 142 New York Times Website 1.3 8 8 8 4.0 21 30 316% 263% 375 Open Table Website 1.8 17 22 4.2 39 57 237% 229% 259 Overleaf Website 1.8 17 22 4.2 39 57 237% 229% 259 Overleaf Website 1.9 21 21 1.8 11 14 95% 5.2 269 0.6 3 3.7 32 42 197% 139% 168% Open Table Website 1.3 18 19 5.0 6 27 152% 33% 142 New York Times Website 1.3 8 8 8 4.0 21 30 316% 263% 375 Open Table Website 1.8 17 22 4.2 39 57 237% 229% 259 Overleaf Website 1.9 21 21 1.8 11 14 95% 5.2 263% 1375 Open Table Website 1.9 21 21 1.8 11 14 95% 5.2 263% 1375 Sephora Website 1.7 13 16 16.0 12 75 932% 92% 469 Sephora Website 1.7 13 16 16.0 12 75 932% 92% 469 Sephora Website 1.7 13 16 16.0 12 75 932% 92% 469 Sephora Website 1.7 13 15 8.6 10 47 515% 77% 131 Spotify App 1.3 13 14 14 2.2 17 27 176% 1319% 193 Spotify Website 1.4 19 23 3.3 15 24 238% 79% 104 SquareSpace Website 1.4 19 23 3.3 15 24 238% 79% 104 SquareSpace Website 1.0 11 11 3.5 9 34 33 33% 48% 28% 309 Trillo Website 1.0 11 11 3.5 9 34 33 33% 48% 48% 48% 48% 49% 41 41 41 41 41 41 41 41 41 41 41 41 41	Bumble	App	2.5	30	37	0.4	6	6	17%	20%	16%
Expedia         Website         1.3         5         7         4.5         10         27         346%         200%         386'           Facebook         App         2.7         22         23         3.0         11         23         110%         50%         100'           Facebook         Website         1.4         19         26         3.0         8         33         214%         42%         127'           Fox News         Website         2.3         27         41         0.5         3         3         20%         111'         11         45%         42%         127'           Gmail         App         3.4         22         24         1.3         10         10         38%         45%         42%           Grubhub         App         1.6         10         18         9.6         30         45         619%         300%         250'           Hinge         App         2.7         52         59         0.5         5         6         17%         10%         10%           Hotels.com         Website         1.0         6         7         21.0         16         124         200% <t< td=""><td>Doordash</td><td>App</td><td>1.6</td><td>9</td><td>9</td><td>4.9</td><td>13</td><td>27</td><td>314%</td><td>144%</td><td>300%</td></t<>	Doordash	App	1.6	9	9	4.9	13	27	314%	144%	300%
Facebook	Etsy	Website	0.6	5	6	3.1	14	18	500%	280%	300%
Facebook         Website         1.4         19         26         3.0         8         33         214%         42%         127*           Fox News         Website         2.3         27         41         0.5         3         3         20%         11%         7%           Gmail         App         3.4         22         24         1.3         10         10         38%         45%         429           Gmail         Website         1.4         10         12         2.0         11         11         146%         110%         92           Grubhub         App         1.6         10         18         9.6         30         45         619%         300%         25           Hinge         App         2.7         52         59         0.5         5         6         17%         10%         10%           Hotels.com         Website         1.0         6         7         21.0         16         124         2100%         267%         1771           Lyft         App         1.9         18         19         2.9         19         34         151%         106%         179           Medium<	Expedia	Website	1.3	5	7	4.5	10	27	346%	200%	386%
Fox News   Website   2.3   27   41   0.5   3   3   20%   11%   7%	Facebook	App	2.7	22	23	3.0	11	23	110%	50%	100%
Gmail         App         3.4         22         24         1.3         10         10         38%         45%         42°           Gmail         Website         1.4         10         12         2.0         11         11         146%         110%         92°           Grubhub         App         1.6         10         18         9.6         30         45         619%         300%         250°           Hinge         App         2.7         52         59         0.5         5         6         17%         10%         10°           Hotels.com         Website         1.0         6         7         21.0         16         124         2100%         267%         1771           Lyft         App         1.9         18         19         2.9         19         34         151%         106%         179           Mcdium         Website         1.9         23         25         3.7         32         42         197%         139%         168°           Netflix         Website         1.9         23         25         3.7         32         42         197%         139%         168° <td< td=""><td>Facebook</td><td>Website</td><td>1.4</td><td>19</td><td>26</td><td>3.0</td><td>8</td><td>33</td><td>214%</td><td>42%</td><td>127%</td></td<>	Facebook	Website	1.4	19	26	3.0	8	33	214%	42%	127%
Gmail         Website         1.4         10         12         2.0         11         11         146%         110%         92%           Grubhub         App         1.6         10         18         9.6         30         45         619%         300%         250°           Hinge         App         2.7         52         59         0.5         5         6         17%         10%         10%           Hotels.com         Website         1.0         6         7         21.0         16         124         2100%         267%         177           Lyft         App         1.9         18         19         2.9         19         34         151%         106%         179           Medium         Website         1.3         14         18         1.3         6         6         95%         43%         33°         38         MSN         Website         1.3         18         19         5.0         6         27         152%         33%         142°           New York Times         Website         1.3         8         8         4.0         21         30         316%         263%         375°	Fox News	Website	2.3	27	41	0.5	3	3	20%	11%	7%
Grubhub         App         1.6         10         18         9.6         30         45         619%         300%         250           Hinge         App         2.7         52         59         0.5         5         6         17%         10%         10%           Hotels.com         Website         1.0         6         7         21.0         16         124         2100%         267%         1771           Lyft         App         1.9         18         19         2.9         19         34         151%         106%         179           Medium         Website         1.3         14         18         1.3         6         6         95%         43%         339           MSN         Website         1.9         23         25         3.7         32         42         197%         139%         168           New York Times         Website         1.3         18         19         5.0         6         27         152%         33%         142           New York Times         Website         1.8         17         22         4.2         39         57         237%         229%         259	Gmail	App	3.4	22	24	1.3	10	10	38%	45%	42%
Hinge App 2.7 52 59 0.5 5 6 17% 10% 10% Hotels.com Website 1.0 6 7 21.0 16 124 2100% 267% 1771 Lyft App 1.9 18 19 2.9 19 34 151% 106% 179 Medium Website 1.3 14 18 1.3 6 6 6 95% 43% 33% MSN Website 1.9 23 25 3.7 32 42 197% 139% 168% Netflix Website 3.3 18 19 5.0 6 27 152% 33% 142 New York Times Website 1.3 8 8 4.0 21 30 316% 263% 375 Open Table Website 2.0 5 5 3.7 13 23 188% 260% 460% Outlook Website 1.8 17 22 4.2 39 57 237% 229% 259% Overleaf Website 0.6 3 4 1.0 6 6 165% 2000% 150% Redfin Website 0.7 4 4 4 0.9 4 4 131% 100% 100% Resy Website 1.7 13 16 16.0 12 75 932% 92% 469% Sephora Website 1.7 13 15 8.6 10 47 515% 77% 313 Snapchat App 2.0 21 23 5.5 11 27 276% 52% 117% Spotify App 1.3 13 14 2.2 17 27 176% 131% 193% Spotify Website 1.4 19 23 3.3 15 24 238% 79% 104% SquareSpace Website 1.6 10 10 1.1 8 10 67% 80% 100% Timer App 2.2 31 43 1.0 10 12 44% 32% 28% Trello Website 1.0 11 11 11 3.5 9 34 337% 82% 32% 28% Trello Website 1.0 11 11 11 3.5 9 34 337% 82% 32% 28% Trello Website 1.0 11 11 11 3.5 9 34 337% 82% 32% 28% Trello Website 1.0 11 11 11 3.5 9 34 337% 82% 32% 28% Trello Website 1.0 11 11 11 3.5 9 34 337% 82% 32% 28% Trello Website 1.1 5 7 1.0 6 6 90% 120% 86% Wordpress Website 1.1 5 7 1.0 6 6 90% 120% 86% Wordpress Website 1.1 12 14 3.5 21 35 328% 175% 250 Yelp Website 1.3 11 14 2.0 15 18 154% 136% 129%	Gmail	Website	1.4	10	12	2.0	11	11	146%	110%	92%
Hotels.com	Grubhub	App	1.6	10	18	9.6	30	45	619%	300%	250%
Lyft         App         1.9         18         19         2.9         19         34         151%         106%         179           Medium         Website         1.3         14         18         1.3         6         6         95%         43%         33%           MSN         Website         1.9         23         25         3.7         32         42         197%         139%         168           Netflix         Website         3.3         18         19         5.0         6         27         152%         33%         142           New York Times         Website         1.3         8         8         4.0         21         30         316%         263%         375           Open Table         Website         2.0         5         5         3.7         13         23         188%         260%         460           Outlook         Website         1.8         17         22         4.2         39         57         237%         229%         259           Overleaf         Website         1.9         21         21         1.8         11         14         95%         52%         67%	Hinge	App	2.7	52	59	0.5	5	6	17%	10%	10%
Medium         Website         1.3         14         18         1.3         6         6         95%         43%         33%           MSN         Website         1.9         23         25         3.7         32         42         197%         139%         168°           Netflix         Website         3.3         18         19         5.0         6         27         152%         33%         142°           New York Times         Website         1.3         8         8         4.0         21         30         316%         263%         375°           Open Table         Website         2.0         5         5         3.7         13         23         188%         260%         460°           Outlook         Website         1.8         17         22         4.2         39         57         237%         229%         259°           Overleaf         Website         1.8         17         22         4.2         39         57         237%         229%         259°           Overleaf         Website         1.9         21         21         1.8         11         14         95%         52%         67%     <	Hotels.com	Website	1.0	6	7	21.0	16	124	2100%	267%	1771%
Medium         Website         1.3         14         18         1.3         6         6         95%         43%         33°           MSN         Website         1.9         23         25         3.7         32         42         197%         139%         168°           Netflix         Website         3.3         18         19         5.0         6         27         152%         33%         142°           New York Times         Website         1.3         8         8         4.0         21         30         316%         263%         375°           Open Table         Website         2.0         5         5         3.7         13         23         188%         260%         460°           Outlook         Website         1.8         17         22         4.2         39         57         237%         229%         259°           Overleaf         Website         1.8         17         22         4.2         39         57         237%         229%         259°           Overleaf         Website         1.9         21         21         1.8         11         14         95%         52%         67°     <	Lyft	App	1.9	18	19	2.9	19	34	151%	106%	179%
Netflix         Website         3.3         18         19         5.0         6         27         152%         33%         142°           New York Times         Website         1.3         8         8         4.0         21         30         316%         263%         375°           Open Table         Website         2.0         5         5         3.7         13         23         188%         260%         460°           Outlook         Website         1.8         17         22         4.2         39         57         237%         229%         259°           Overleaf         Website         0.6         3         4         1.0         6         6         165%         200%         150°           ProtonMail         Website         1.9         21         21         1.8         11         14         95%         52%         67°           Redfin         Website         0.7         4         4         0.9         4         4         131%         100%         100%           Resy         Website         1.7         13         16         16.0         12         75         932%         92%         469°     <	Medium	Website	1.3	14	18	1.3	6	6	95%	43%	33%
New York Times         Website         1.3         8         8         4.0         21         30         316%         263%         375'           Open Table         Website         2.0         5         5         3.7         13         23         188%         260%         460'           Outlook         Website         1.8         17         22         4.2         39         57         237%         229%         259'           Overleaf         Website         0.6         3         4         1.0         6         6         165%         200%         150'           ProtonMail         Website         1.9         21         21         1.8         11         14         95%         52%         67%           Redfin         Website         0.7         4         4         0.9         4         4         131%         100%         100%           Resy         Website         1.7         13         16         16.0         12         75         932%         92%         469*           Sephora         Website         1.7         13         15         8.6         10         47         515%         77%         313*	MSN	Website	1.9	23	25	3.7	32	42	197%	139%	168%
Open Table         Website         2.0         5         5         3.7         13         23         188%         260%         460           Outlook         Website         1.8         17         22         4.2         39         57         237%         229%         259%           Overleaf         Website         0.6         3         4         1.0         6         6         165%         200%         150%           ProtonMail         Website         1.9         21         21         1.8         11         14         95%         52%         67%           Redfin         Website         0.7         4         4         0.9         4         4         131%         100%         100%           Resy         Website         1.7         13         16         16.0         12         75         932%         92%         469%           Sephora         Website         1.7         13         16         16.0         12         75         932%         92%         469%           Sephora         Website         1.7         13         15         8.6         10         47         515%         77%         313*	Netflix	Website	3.3	18	19	5.0	6	27	152%	33%	142%
Outlook         Website         1.8         17         22         4.2         39         57         237%         229%         259           Overleaf         Website         0.6         3         4         1.0         6         6         165%         200%         150           ProtonMail         Website         1.9         21         21         1.8         11         14         95%         52%         67%           Redfin         Website         0.7         4         4         0.9         4         4         131%         100%         100%           Resy         Website         1.7         13         16         16.0         12         75         932%         92%         469           Sephora         Website         1.4         6         7         11.0         9         48         786%         150%         686           Slack         Website         1.7         13         15         8.6         10         47         515%         77%         313*           Snapchat         App         2.0         21         23         5.5         11         27         276%         52%         117*	New York Times	Website	1.3	8	8	4.0	21	30	316%	263%	375%
Outlook         Website         1.8         17         22         4.2         39         57         237%         229%         259%           Overleaf         Website         0.6         3         4         1.0         6         6         165%         200%         150%           ProtonMail         Website         1.9         21         21         1.8         11         14         95%         52%         67%           Redfin         Website         0.7         4         4         0.9         4         4         131%         100%         100%           Resy         Website         1.7         13         16         16.0         12         75         932%         92%         469           Sephora         Website         1.4         6         7         11.0         9         48         786%         150%         686           Slack         Website         1.7         13         15         8.6         10         47         515%         77%         313*           Snapchat         App         2.0         21         23         5.5         11         27         276%         52%         117*	Open Table	Website	2.0	5	5	3.7	13	23	188%	260%	460%
Overleaf         Website         0.6         3         4         1.0         6         6         165%         200%         150°           ProtonMail         Website         1.9         21         21         1.8         11         14         95%         52%         67°           Redfin         Website         0.7         4         4         0.9         4         4         131%         100%         100°           Resy         Website         1.7         13         16         16.0         12         75         932%         92%         469°           Sephora         Website         1.4         6         7         11.0         9         48         786%         150%         686°           Slack         Website         1.7         13         15         8.6         10         47         515%         77%         313°           Snapchat         App         2.0         21         23         5.5         11         27         276%         52%         117°           Spotify         App         1.3         13         14         2.2         17         27         176%         131%         193°	-	Website	1.8	17	22		39	57	237%	229%	259%
ProtonMail         Website         1.9         21         21         1.8         11         14         95%         52%         67%           Redfin         Website         0.7         4         4         0.9         4         4         131%         100%         100%           Resy         Website         1.7         13         16         16.0         12         75         932%         92%         469           Sephora         Website         1.7         13         16         16.0         12         75         932%         92%         469           Sephora         Website         1.7         13         16         16.0         12         75         932%         92%         469           Slack         Website         1.4         6         7         11.0         9         48         786%         150%         686           Slack         Website         1.7         13         15         8.6         10         47         515%         77%         313*           Snapchat         App         2.0         21         23         5.5         11         27         276%         52%         117*			0.6	3		1.0	6	6			150%
Redfin         Website         0.7         4         4         0.9         4         4         131%         100%         100%           Resy         Website         1.7         13         16         16.0         12         75         932%         92%         469           Sephora         Website         1.4         6         7         11.0         9         48         786%         150%         686           Slack         Website         1.7         13         15         8.6         10         47         515%         77%         313*           Snapchat         App         2.0         21         23         5.5         11         27         276%         52%         117*           Spotify         App         1.3         13         14         2.2         17         27         176%         131%         193*           Spotify         Website         1.4         19         23         3.3         15         24         238%         79%         104*           SquareSpace         Website         2.8         11         26         5.4         16         43         195%         145%         165*	ProtonMail	Website	1.9	21	21	1.8	11	14		52%	67%
Resy         Website         1.7         13         16         16.0         12         75         932%         92%         469           Sephora         Website         1.4         6         7         11.0         9         48         786%         150%         686           Slack         Website         1.7         13         15         8.6         10         47         515%         77%         313'           Snapchat         App         2.0         21         23         5.5         11         27         276%         52%         117'           Spotify         App         1.3         13         14         2.2         17         27         176%         131%         193'           Spotify         Website         1.4         19         23         3.3         15         24         238%         79%         104'           SquareSpace         Website         2.8         11         26         5.4         16         43         195%         145%         165'           TikTok         App         1.6         10         10         1.1         8         10         67%         80%         100'								4			100%
Sephora         Website         1.4         6         7         11.0         9         48         786%         150%         686           Slack         Website         1.7         13         15         8.6         10         47         515%         77%         313           Snapchat         App         2.0         21         23         5.5         11         27         276%         52%         117*           Spotify         App         1.3         13         14         2.2         17         27         176%         131%         193*           Spotify         Website         1.4         19         23         3.3         15         24         238%         79%         104*           SquareSpace         Website         2.8         11         26         5.4         16         43         195%         145%         165*           TikTok         App         1.6         10         10         1.1         8         10         67%         80%         100*           Tinder         App         2.2         31         43         1.0         10         12         44%         32%         28%	Resv	Website	1.7	13	16	16.0	12	75	932%	92%	469%
Slack         Website         1.7         13         15         8.6         10         47         515%         77%         313'           Snapchat         App         2.0         21         23         5.5         11         27         276%         52%         117'           Spotify         App         1.3         13         14         2.2         17         27         176%         131%         193'           Spotify         Website         1.4         19         23         3.3         15         24         238%         79%         104'           SquareSpace         Website         2.8         11         26         5.4         16         43         195%         145%         165'           TikTok         App         1.6         10         10         1.1         8         10         67%         80%         100'           Tinder         App         2.2         31         43         1.0         10         12         44%         32%         28'           Trello         Website         1.0         11         11         3.5         9         34         337'%         82%         309'		Website	1.4	6	7		9	48	786%	150%	686%
Snapchat         App         2.0         21         23         5.5         11         27         276%         52%         117           Spotify         App         1.3         13         14         2.2         17         27         176%         131%         193%           Spotify         Website         1.4         19         23         3.3         15         24         238%         79%         104%           SquareSpace         Website         2.8         11         26         5.4         16         43         195%         145%         165%           TikTok         App         1.6         10         10         1.1         8         10         67%         80%         100%           Tinder         App         2.2         31         43         1.0         10         12         44%         32%         28%           Trello         Website         1.0         11         11         3.5         9         34         337%         82%         309%           Twitter         App         1.7         21         25         1.4         9         12         83%         43%         48%	-		1.7	13	15		10	47			313%
Spotify         App         1.3         13         14         2.2         17         27         176%         131%         193*           Spotify         Website         1.4         19         23         3.3         15         24         238%         79%         104*           SquareSpace         Website         2.8         11         26         5.4         16         43         195%         145%         165*           TikTok         App         1.6         10         10         1.1         8         10         67%         80%         100*           Tinder         App         2.2         31         43         1.0         10         12         44%         32%         28*           Trello         Website         1.0         11         11         3.5         9         34         337%         82%         309*           Twitter         App         1.7         21         25         1.4         9         12         83%         43%         48*           Vimeo         Website         1.1         5         7         1.0         6         6         90%         120%         86*           Wor											117%
Spotify         Website         1.4         19         23         3.3         15         24         238%         79%         104°           SquareSpace         Website         2.8         11         26         5.4         16         43         195%         145%         165°           TikTok         App         1.6         10         10         1.1         8         10         67%         80%         100°           Tinder         App         2.2         31         43         1.0         10         12         44%         32%         28°           Trello         Website         1.0         11         11         3.5         9         34         337%         82%         309°           Twitter         App         1.7         21         25         1.4         9         12         83%         43%         48°           Vimeo         Website         1.1         5         7         1.0         6         6         90%         120%         86°           Wordpress         Website         1.6         7         8         1.4         8         8         86%         114%         100°           Ya											193%
SquareSpace         Website         2.8         11         26         5.4         16         43         195%         145%         165′           TikTok         App         1.6         10         10         1.1         8         10         67%         80%         100′           Tinder         App         2.2         31         43         1.0         10         12         44%         32%         28°           Trello         Website         1.0         11         11         3.5         9         34         337%         82%         309°           Twitter         App         1.7         21         25         1.4         9         12         83%         43%         48°           Vimeo         Website         1.1         5         7         1.0         6         6         90%         120%         86°           Wordpress         Website         1.6         7         8         1.4         8         8         86%         114%         100°           Yahoo         Website         3.0         18         21         5.3         11         36         179%         61%         171°           Yelp											104%
TikTok App 1.6 10 10 1.1 8 10 67% 80% 100°  Tinder App 2.2 31 43 1.0 10 12 44% 32% 28°  Trello Website 1.0 11 11 3.5 9 34 337% 82% 309°  Twitter App 1.7 21 25 1.4 9 12 83% 43% 48°  Vimeo Website 1.1 5 7 1.0 6 6 90% 120% 86°  Wordpress Website 1.6 7 8 1.4 8 8 86% 114% 100°  Yahoo Website 3.0 18 21 5.3 11 36 179% 61% 171°  Yelp App 1.1 12 14 3.5 21 35 328% 175% 250°  Yelp Website 1.3 11 14 2.0 15 18 154% 136% 129°											165%
Tinder         App         2.2         31         43         1.0         10         12         44%         32%         28%           Trello         Website         1.0         11         11         3.5         9         34         337%         82%         309           Twitter         App         1.7         21         25         1.4         9         12         83%         43%         48%           Vimeo         Website         1.1         5         7         1.0         6         6         90%         120%         86%           Wordpress         Website         1.6         7         8         1.4         8         8         86%         114%         100°           Yahoo         Website         3.0         18         21         5.3         11         36         179%         61%         171°           Yelp         App         1.1         12         14         3.5         21         35         328%         175%         250°           Yelp         Website         1.3         11         14         2.0         15         18         154%         136%         129°											100%
Trello         Website         1.0         11         11         3.5         9         34         337%         82%         309           Twitter         App         1.7         21         25         1.4         9         12         83%         43%         48%           Vimeo         Website         1.1         5         7         1.0         6         6         90%         120%         86%           Wordpress         Website         1.6         7         8         1.4         8         8         86%         114%         100%           Yahoo         Website         3.0         18         21         5.3         11         36         179%         61%         171%           Yelp         App         1.1         12         14         3.5         21         35         328%         175%         250%           Yelp         Website         1.3         11         14         2.0         15         18         154%         136%         129%											28%
Twitter         App         1.7         21         25         1.4         9         12         83%         43%         48%           Vimeo         Website         1.1         5         7         1.0         6         6         90%         120%         86%           Wordpress         Website         1.6         7         8         1.4         8         8         86%         114%         100%           Yahoo         Website         3.0         18         21         5.3         11         36         179%         61%         171%           Yelp         App         1.1         12         14         3.5         21         35         328%         175%         250%           Yelp         Website         1.3         11         14         2.0         15         18         154%         136%         129%											309%
Vimeo         Website         1.1         5         7         1.0         6         6         90%         120%         86%           Wordpress         Website         1.6         7         8         1.4         8         8         86%         114%         100%           Yahoo         Website         3.0         18         21         5.3         11         36         179%         61%         171%           Yelp         App         1.1         12         14         3.5         21         35         328%         175%         250%           Yelp         Website         1.3         11         14         2.0         15         18         154%         136%         129%											48%
Wordpress         Website         1.6         7         8         1.4         8         8         86%         114%         100°           Yahoo         Website         3.0         18         21         5.3         11         36         179%         61%         171°           Yelp         App         1.1         12         14         3.5         21         35         328%         175%         250°           Yelp         Website         1.3         11         14         2.0         15         18         154%         136%         129°							-				86%
Yahoo         Website         3.0         18         21         5.3         11         36         179%         61%         171%           Yelp         App         1.1         12         14         3.5         21         35         328%         175%         250%           Yelp         Website         1.3         11         14         2.0         15         18         154%         136%         129%											100%
Yelp         App         1.1         12         14         3.5         21         35         328%         175%         250%           Yelp         Website         1.3         11         14         2.0         15         18         154%         136%         129%											171%
Yelp Website 1.3 11 14 2.0 15 18 154% 136% 1296											250%
	_										129%
1 Zanow   Website   1/2   4   2   2/1   13   28   1/1%   3/2%   2600	Zillow	Website	0.9	4	5	5.7	13	28	671%	325%	560%
											29%



unwanted targeting (Gray et al., 2018) or revelation of their private information in undesired ways (Waldman, 2020).

# 2 Needed future research on dark patterns

While there has been some initial research on dark patterns in computer science and legal studies, these studies are largely descriptive in nature, mostly documenting the existence of these practices (Gray et al., 2018; Luguri & Strahilevitz, 2021). There is, however, no research that clarifies how consumers respond to dark patterns or examines the consequences of these tactics for consumers, companies, and society at large. In the following, we outline a number of research questions that revolve around company-related antecedents, consumer-level responses, and market-related consequences.

## 2.1 Companies

To gain a fuller understanding of dark patterns, research will need to identify the organizational antecedents driving the use of such patterns. For instance, are companies that exhibit a particular culture (e.g., a culture focused on competitiveness, permissiveness, or "Us-versus-Them" mentality), that are affected by specific industry constraints (e.g., industries characterized by high competitive pressure), or that pursue specific marketing strategies (e.g., aggressive growth) more likely to rely on dark patterns? In this respect, it is interesting to note that our study shows that some companies that are typically known for their strong focus on customer experience are also the ones relying heavily on dark patterns (e.g., Amazon, Spotify, Slack), suggesting a somewhat ambivalent understanding of customer orientation. Interestingly, Table 1 also reveals that some companies actually make canceling easier than subscribing (e.g., Airbnb, Gmail, Tinder). While this may reflect mere operational differences, it may also be possible that these companies consider canceling as part of a holistic customer experience and would thus attempt to create a seamless process.

## 2.2 Consumers

Our study shows that companies use different tactics to prevent customers from quitting (see also Gray et al., 2018). Thus, future research may not only want to classify these tactics but may also link them to consumers' decision-making processes. First, consumers may not complete a cancelation process because they do not want to invest the effort necessary for doing so. Arguably, this response aligns with tactics that make canceling a cumbersome process (e.g., hiding the cancelation procedure). Second, consumers may believe that quitting may be a mistake after all, especially when they feel they have little to lose by remaining loyal (e.g., when the services are free to use). Possibly, this kind of reaction may be triggered by tactics destined to increase anticipated regret (e.g., by pointing out what customers lose by canceling;



Zeelenberg & Pieters, 2007). Third, customers may choose to stay with the company because this "feels right" on a gut level. That is, customers may feel that it is best to stay with a firm simply because the "stay" option is highlighted in bright colors and thus easier to process (Novemsky et al., 2007). Research of this kind may also allow assessing the effect of individual differences across consumers. For instance, one may argue that consumers' responses to dark patterns are contingent on their digital literacy, socioeconomic status, or specific disadoption intent (Lehmann & Parker, 2017).

## 2.3 Consequences

In terms of market-level responses, research will need to examine the consequences of dark patterns. That is, are consumers more likely to stay loyal after having been exposed to dark patterns? Answering this question will not only require controlled lab studies but also field experiments testing the real-life responses to dark patterns. Importantly, consumer-related effects may extend beyond these immediate stay/leave decisions. From a long-term perspective, it may be interesting to examine if consumers that have been prevented from quitting actually re-engage with the company or whether they will show reactance because they feel they are being held hostage.

Moreover, research may link consumer responses to more downstream consequences. For instance, will the reliance on dark patterns lead to greater profitability because a company has a larger customer base or access to more customer data? As such, recent studies document that smaller platforms are more impacted by privacy regulations than larger "walled gardens" with substantial existing customer databases (Peukert et al., 2022). Or could it be the case that dark patterns will undermine profitability by negatively affecting a company's image or undermining customer trust? Arguably, these effects are not mutually exclusive and future research may establish under which conditions positive or negative effects are more likely to occur.

#### 3 Conclusion

Our exploratory study highlights that dark patterns are still used by companies to prevent customers from quitting. Understanding the nature, effects, and costs of these patterns should be a key subject for researchers as such knowledge will help to better align the incentives of consumers, companies, and society at large.

**Funding** Open Access funding enabled and organized by Projekt DEAL.

#### **Declarations**

Ethics approval Not applicable (no data collected).



**Conflict of interest** The authors declare no competing interests.

Open Access This article is licensed under a Creative Commons Attribution 4.0 International License, which permits use, sharing, adaptation, distribution and reproduction in any medium or format, as long as you give appropriate credit to the original author(s) and the source, provide a link to the Creative Commons licence, and indicate if changes were made. The images or other third party material in this article are included in the article's Creative Commons licence, unless indicated otherwise in a credit line to the material. If material is not included in the article's Creative Commons licence and your intended use is not permitted by statutory regulation or exceeds the permitted use, you will need to obtain permission directly from the copyright holder. To view a copy of this licence, visit http://creativecommons.org/licenses/by/4.0/.

### References

- Gray, C. M. et al. (2018). The dark (patterns) side of UX design. In Conference on human factors in computing systems Proceedings 2018-April: 1–14. https://doi.org/10.1145/3173574.3174108
- Johnson, G., Runge, J., & Seufert, E. (2022). Privacy-centric digital advertising: implications for research. Customer Needs & Solutions, forthcoming. https://doi.org/10.1007/s40547-022-00125-4
- Lehmann, D. R., & Parker, J. R. (2017). Disadoption. *Academy of Marketing Science Review*, 7(1), 36–51. https://doi.org/10.1007/s13162-017-0093-8.
- Luguri, J., & Strahilevitz, L. J. (2021). Shining a light on dark patterns. *Journal of Legal Analysis*, 13(1), 43–109. https://doi.org/10.1093/jla/laaa006.
- Novemsky, N., Dhar, R., Schwarz, N., & Simonson, I. (2007). Preference fluency in choice. *Journal of Marketing Research*, 44(3), 347–356. https://doi.org/10.1509/jmkr.44.3.347.
- Peukert, C., Bechtold, S., Batikas, M., & Kretschmer, T. (2022). Regulatory spillovers and data governance: Evidence from the GDPR. *Marketing Science*, forthcoming. https://doi.org/10.1287/mksc. 2021 1339
- Waldman, A. E. (2020). Cognitive biases, dark patterns, and the 'privacy paradox.' *Current Opinion in Psychology*, 31, 105–109. https://doi.org/10.1016/j.copsyc.2019.08.025
- Wedel, M., & Kannan, P. K. (2016). Marketing analytics for data-rich environments. *Journal of Marketing*, 80(6), 97–121. https://doi.org/10.1509/jm.15.0413.
- Zeelenberg, M., & Pieters, R. (2007). A theory of regret regulation 1.0. *Journal of Consumer Psychology*, 17(1), 3–18. https://doi.org/10.1207/s15327663jcp1701\_3.

**Publisher's note** Springer Nature remains neutral with regard to jurisdictional claims in published maps and institutional affiliations.

