What Makes a Dark Pattern... Dark?

Design Attributes, Normative Considerations, and Measurement Methods

Arunesh Mathur, Jonathan Mayer, Mihir Kshirsagar





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Dark pattern taxonomies

TYPES OF DARK PATTERN

Trick questions

While filling in a form you respond to a question that tricks you into giving an answer you d intend. When glanced upon quickly the question appears to ask one thing, but when read asks another thing entirely.

Sneak into Basket

You attempt to purchase something, but somewhere in the purchasing journey the site sn additional item into your basket, often through the use of an opt-out radio button or check prior page.

Roach Motel

You get into a situation very easily, but then you find it is hard to get out of it (e.g. a premiu subscription).

Privacy Zuckering

You are tricked into publicly sharing more information about yourself than you really inter Named after Facebook CEO Mark Zuckerberg.

Price Comparison Prevention

The retailer makes it hard for you to compare the price of an item with another item, so yo make an informed decision.

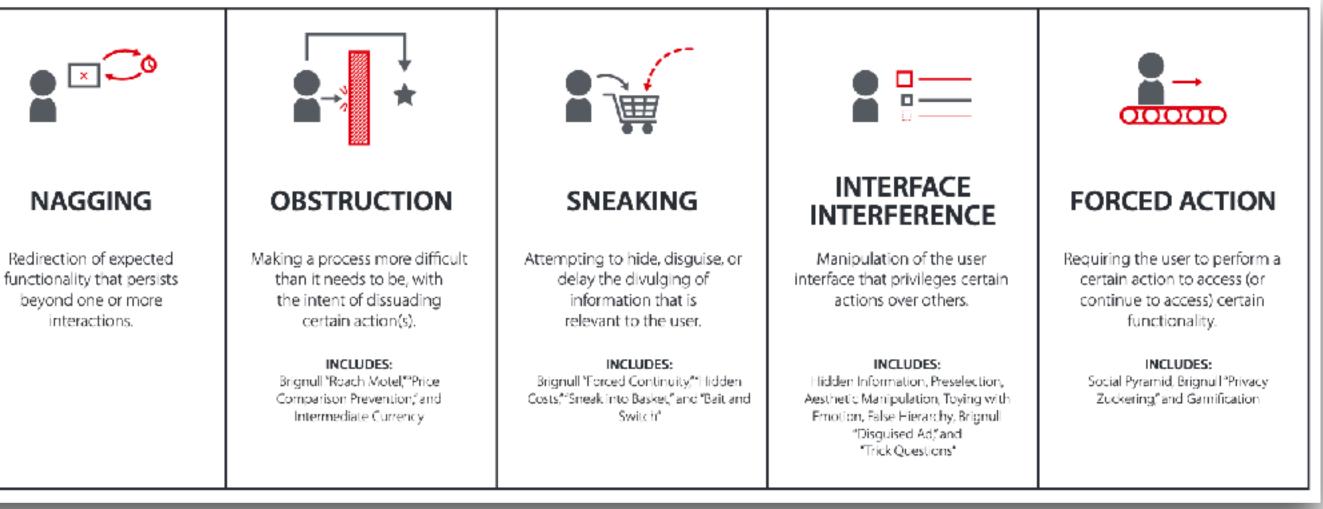
Misdirection

The design purposefully focuses your attention on one thing in order to distract you attent another.

Hidden Costs

You get to the last step of the checkout process, only to discover some unexpected charge appeared, e.g. delivery charges, tax, etc.

Brignull, https://darkpatterns.org



Gray et al., The Dark (Patterns) Side of UX Design, 2018

Other taxonomies: Conti & Sobiesk (2010), Zagal et al (2013), Greenberg et al (2014), Bösch et al (2016), Mathur et al (2019)



Motivating questions

- 1. What makes a user interface design a dark pattern? 2. What makes a dark pattern normatively problematic?
- 3. How can researchers help policymakers decide when to intervene?

A review of the dark patterns literature

- Reviewed the dark patterns literature from the HCI community, security and privacy community, and law journals
 - ➡ 20 academic publications compiled by searching the ACM Digital Library, Google Scholar, and arXiv
- Additionally included legislation and regulatory materials about dark patterns

DETOUR Act, CCPA, reports from the CNIL and the NCC

A review of the dark patterns literature

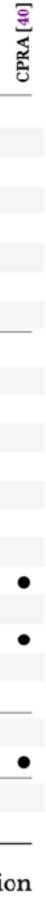
- Significant variation among the facets reflected in the dark pattern definitions
- Definitions diverge along several facets
- Conceptual inconsistency with the dark pattern types in the taxonomies

Charact

		Academic Publications														Government Materials			
		Brignull [3]	Conti & Sobiesk [9]	Zagal et al. [62]	Lewis [31]	Bösch et al. [4]	Gray et al. [21]	Mathur et al. [35]	Luguri & Strahilevitz [32]	Lacey & Caudwell [29]	Utz et al. [56]	Westin & Chiasson [59]	Waldman [57]	Day & Stemler [11]	Gray et al. [20]	Maier & Harr [34]	NCC [18]	CNIL [42]	DETOUR Act [58]
aracteristics of the User Interface	Coercive							•							•				
	Deceptive						٠	•							٠				
	Malicious		٠																
	Misleading					٠												•	
	Obnoxious														•				
	Seductive															•			
	Steering							•									٠		
	Trickery	٠											٠						
	Attack users		0																
Mechanisms of Effect on Users	Confuse users								0										
	Deceive users									٠									
	Exploit users		0																
	Manipulate users		0						•			٠	•						
	Mislead users															•			
	Steer users													٠					
	Subvert user intent	٠			•	•						٠	•	٠					
	Subvert user preferences					•		٠	•									•	•
	Trick users					٠						٠				•			
	Undermine user autonomy																		•
	Without user consent			٠															
	Without user knowledge																	•	
Role of User Interface Designers	Abuse of designer knowledge						•			•		•				•			
	Designer intent		•	٠			٠		٠						٠			٠	٠
Benefits and Harms	Benefit to service		٠					٠			٠				٠				
	Harm to users			٠			٠						٠				٠		

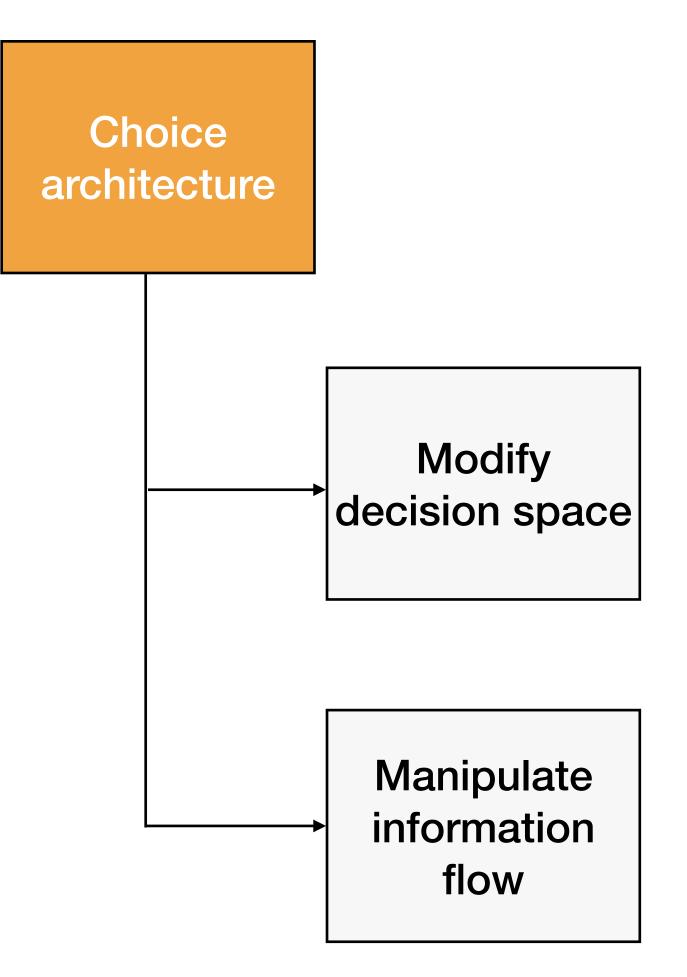
• Required element of "dark pattern" definition

Alternative element of "dark pattern" definition



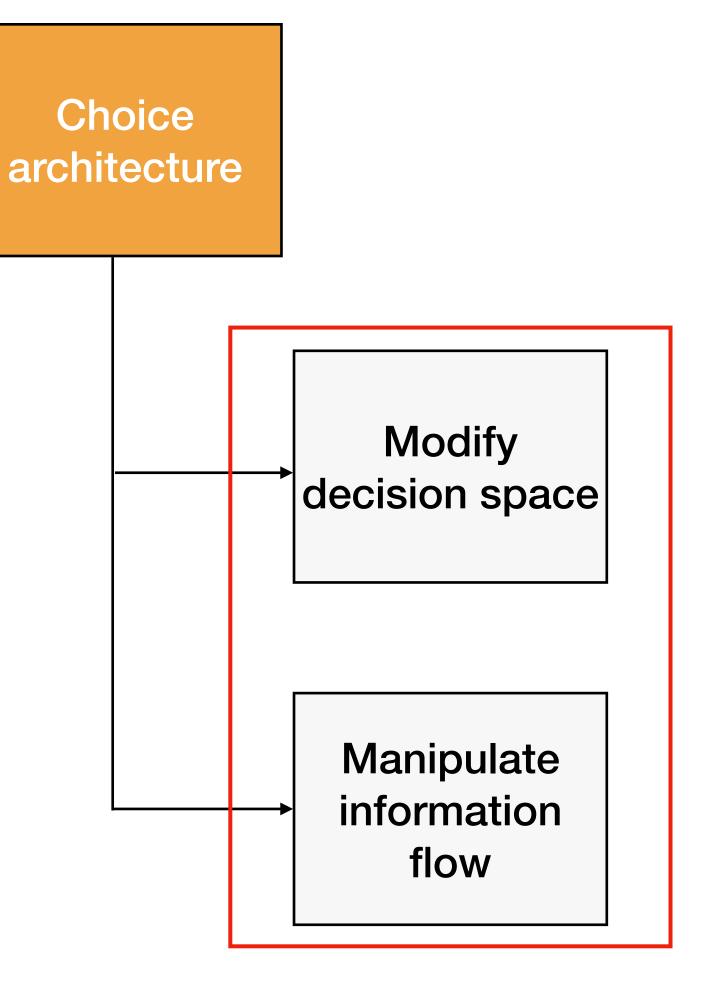
Choice architecture





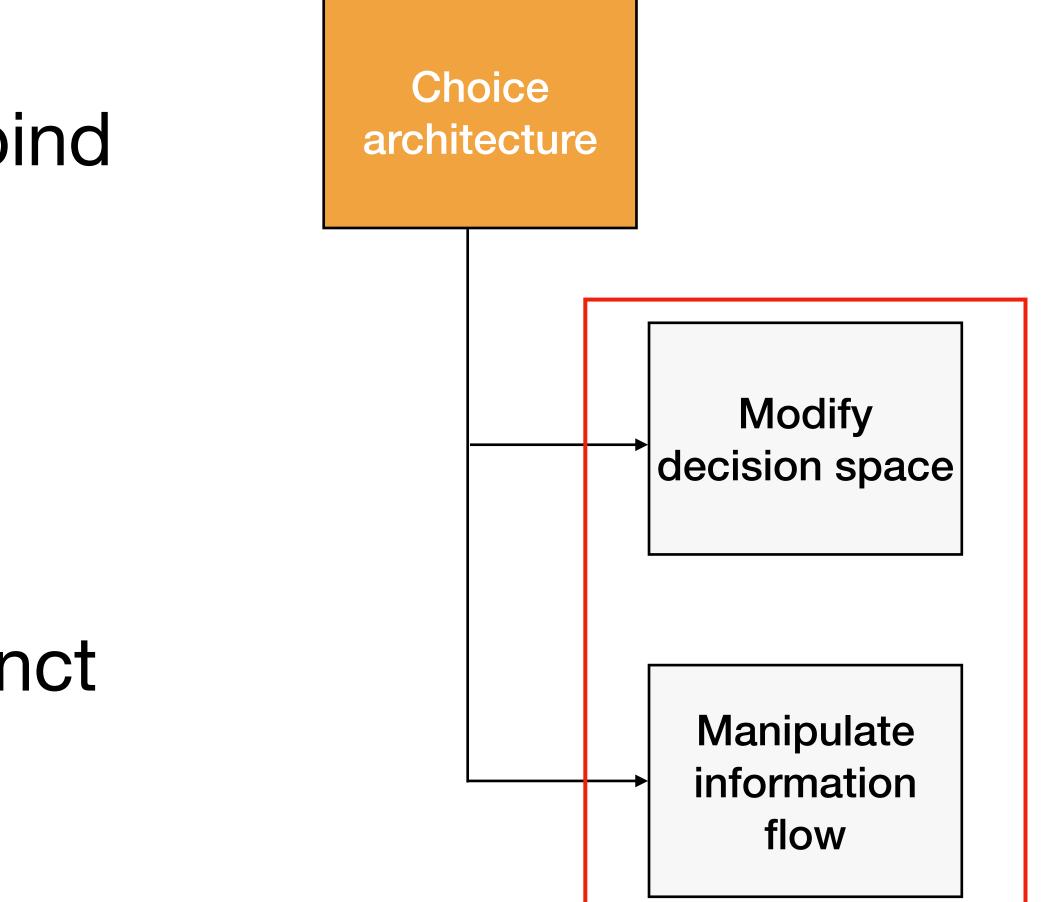


 Instead, interrelated themes bind the current dark patterns scholarship together





- Instead, interrelated themes bind the current dark patterns scholarship together
- Parallel to Solove's seminal observation that privacy is a Wittgensteinian family of distinct concepts





Descriptive → normative considerations

- We argue that researchers should focus on the normative considerations that motivate the descriptive themes
- Choice architecture research in other disciplines (e.g., behavioral psychology/economics & philosophy) has surfaced various normative considerations

Individual welfare

Collective welfare

Regulatory compliance

Individual autonomy

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Manage options

Individual welfare

Collective welfare

Regulatory compliance

Individual autonomy

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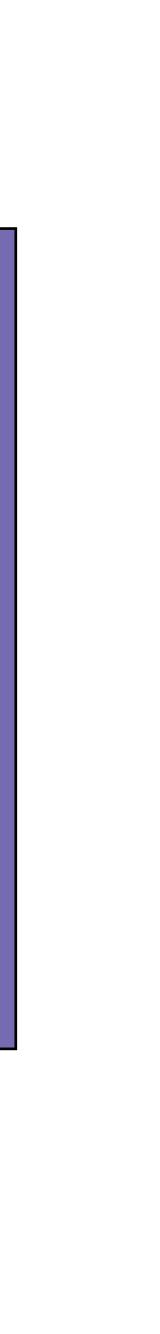
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• Financial loss

Manage options

• Loss of privacy • Cognitive burden



Individual welfare

Collective welfare

Regulatory compliance

Individual autonomy

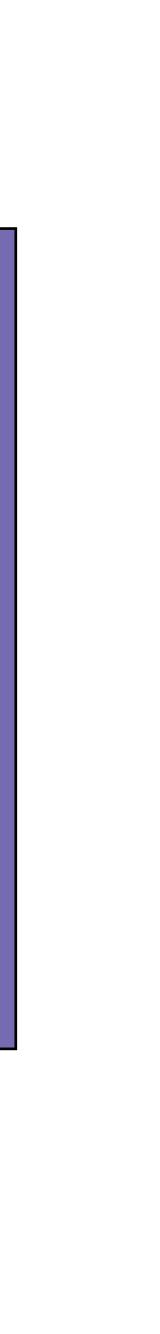
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Market competition • Trust in the market

Before you continue...

Manage options



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Individual autonomy

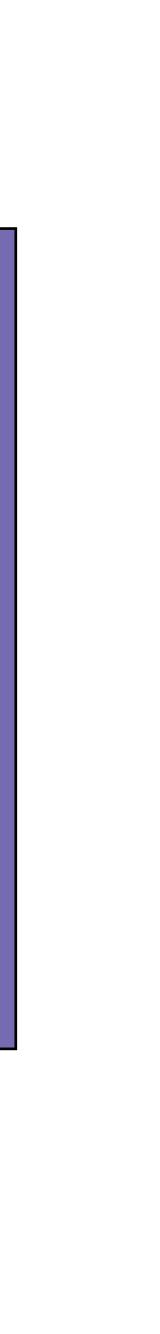
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Undermine CCPA • Undermine GDPR

Before you continue...

Manage options



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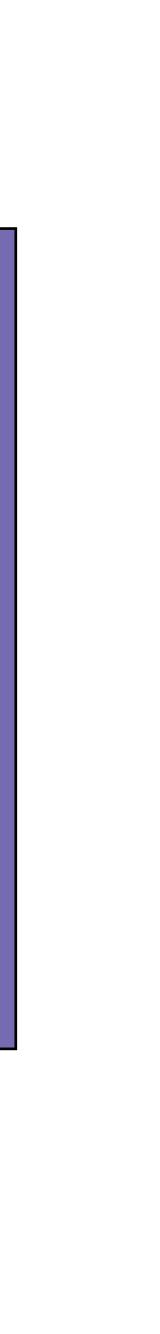
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OK

Before you continue...

Manage options

• Impede free and informed decision making



Normative lenses \rightarrow measurements

- view dark patterns
- Such analyses can help us move beyond ad hoc and

The four normative lenses offer us different perspectives to

HCI researchers can use established empirical methods to analyze dark patterns through these normative lenses

descriptive labels, and instead focus on assessing how, exactly, dark patterns raise specific normative concerns

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Step 1: Select a normative lens

Individual welfare

Collective welfare

Regulatory compliance

Step 1: Select a normative lens

Individual welfare Collective welfare

Regulatory compliance

Step 1: Select a normative lens

Individual welfare

Collective welfare

Step 2: Select a measurement method



Step 1: Select a normative lens

Individual welfare

Collective welfare

Step 2: Select a measurement method

➡ Lab experiment



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Individual welfare

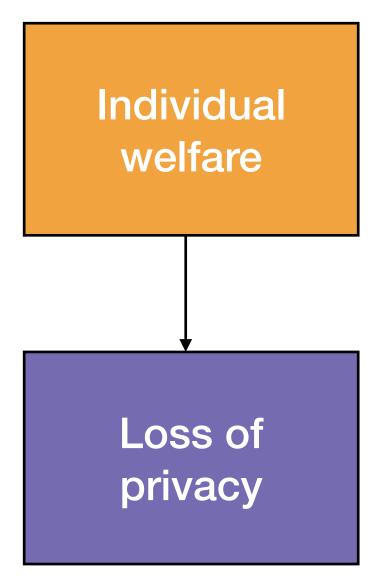
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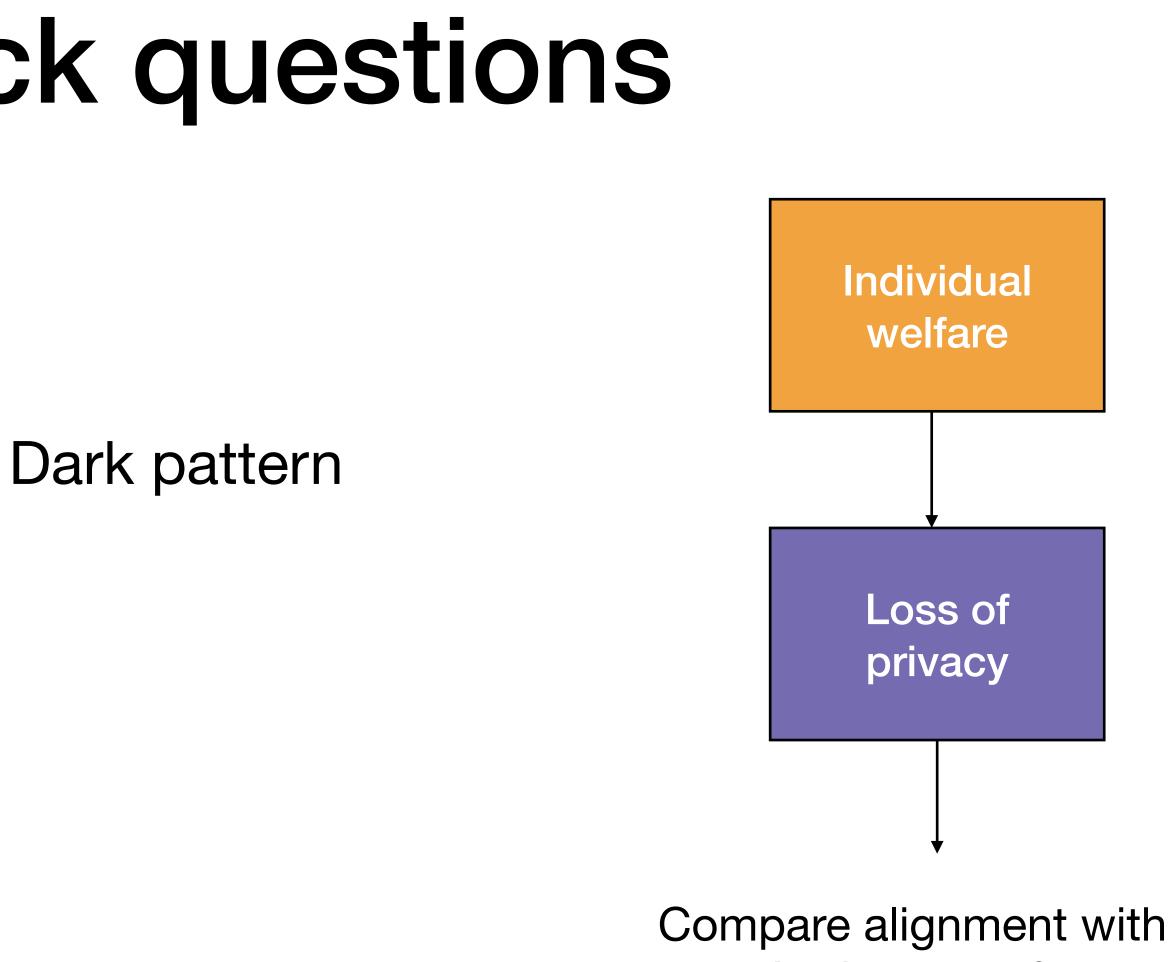
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users' privacy preferences

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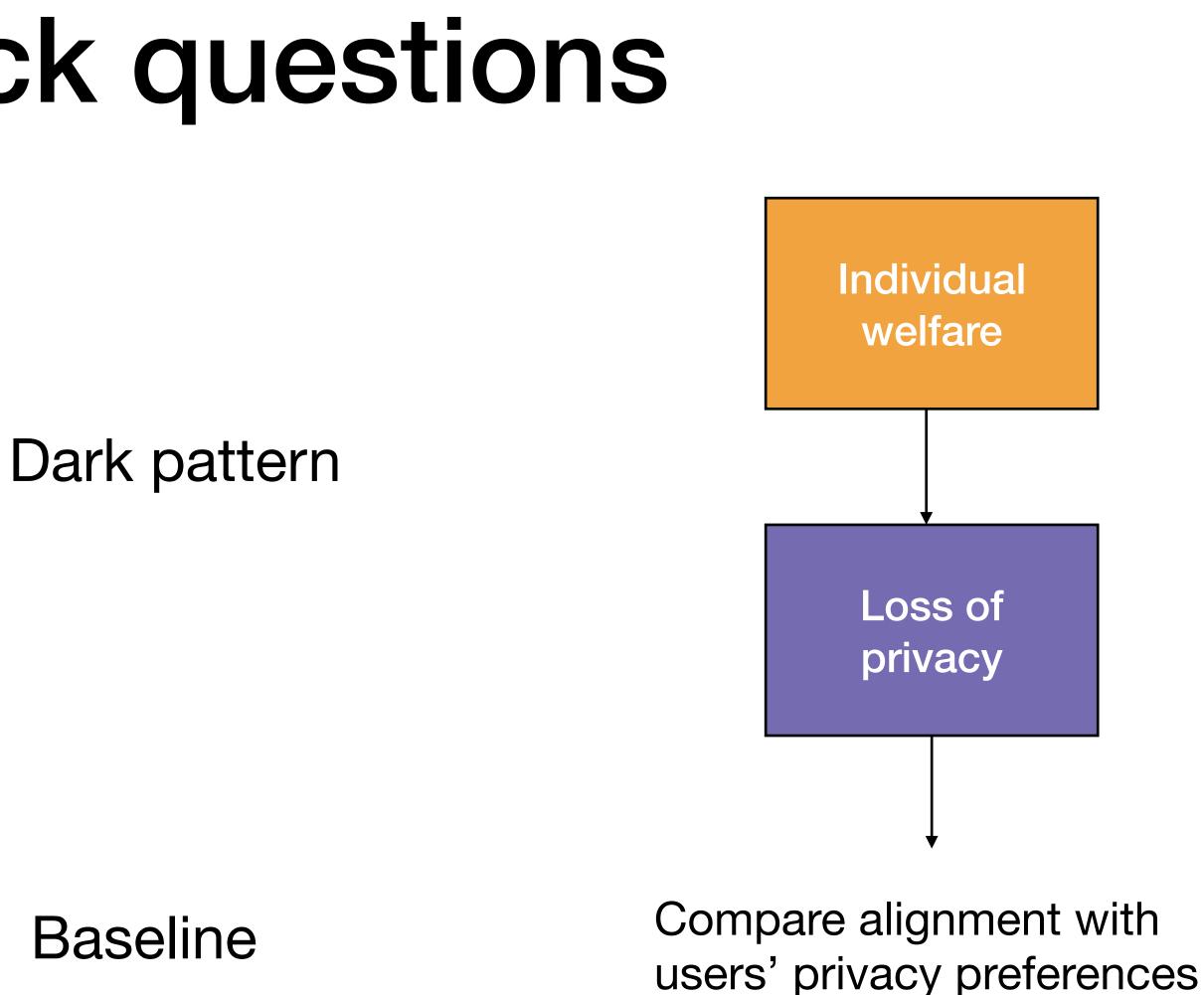
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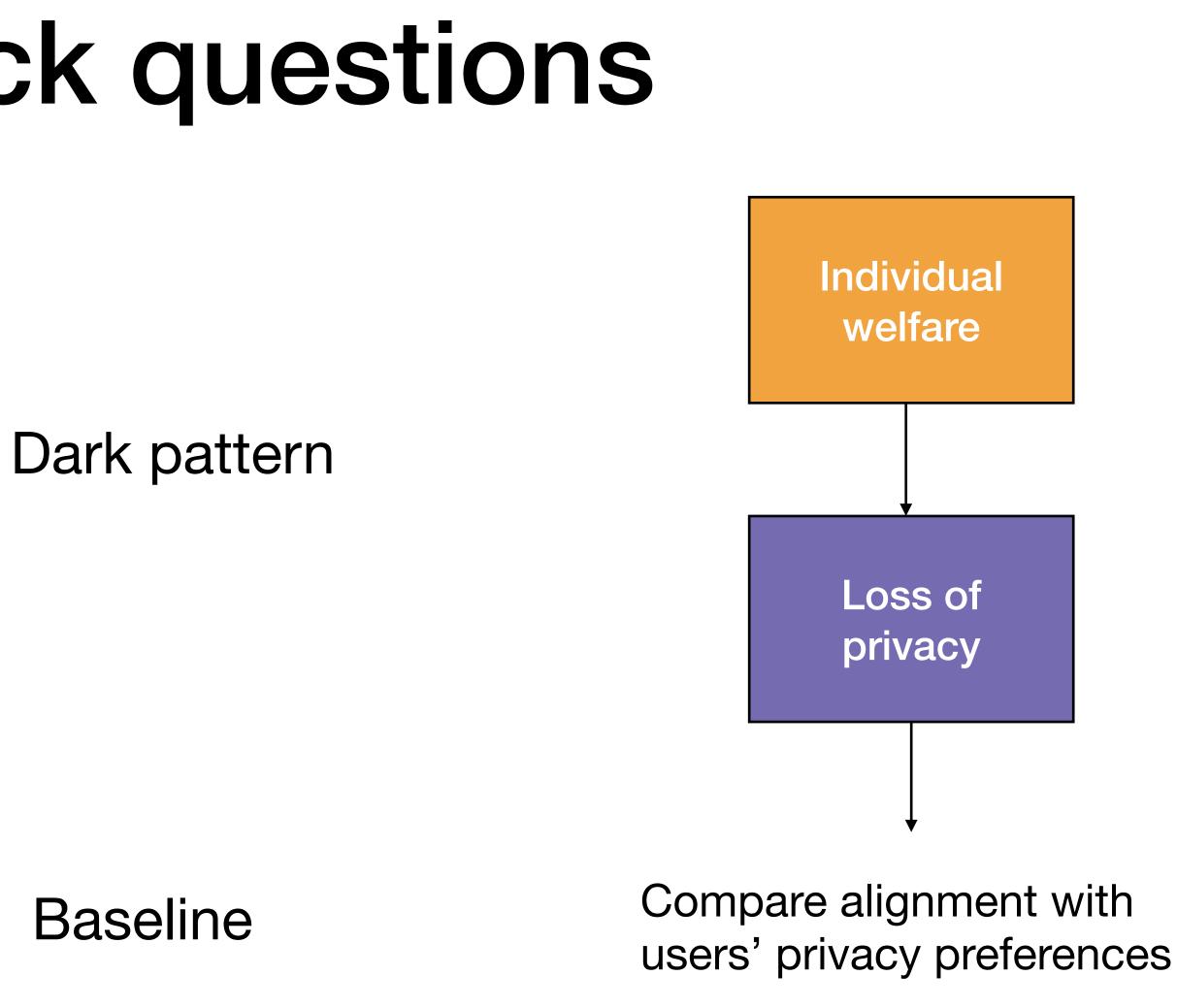
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Interpret a *sufficient* deviation from the baseline to conclude that trick questions is a dark pattern under the individual welfare lens



Step 1: Select a normative lens

Individual welfare

Collective welfare

Regulatory compliance

Step 1: Select a normative lens

Individual welfare

Collective welfare

Regulatory compliance

Step 1: Select a normative lens

Individual welfare

Collective welfare

Step 2: Select a measurement method

➡ Survey

Regulatory compliance

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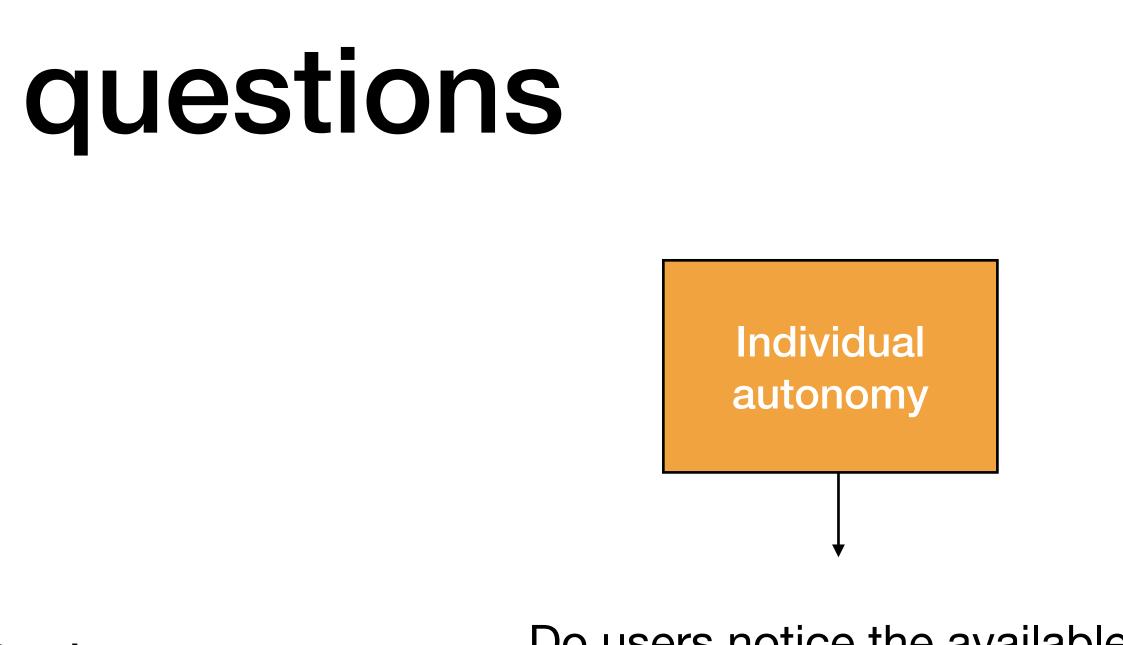
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Individual autonomy

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Dark pattern

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Do users notice the available options in the user interface?

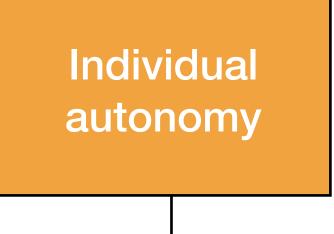
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Dark pattern

Do users notice the available options in the user interface?

Interpret if only a small proportion of users recognize the full range of options as evidence that trick questions is a dark pattern under the individual autonomy lens



What makes a dark pattern... dark?

- We reviewed the dark patterns literature in HCI and related areas of computer science, identify two themes that describe dark patterns
- We described a set of four normative lenses that could guide future dark patterns research
- We propose that HCI researchers use methods that align with those normative perspectives to demonstrate when a user interface becomes "dark"



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