

**The bright side of the GDPR:
Welfare-improving privacy management**

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What this paper does (1/2)

Setting Consumers can decide whether to **opt in** to obtain **opt-in benefits** from a digital service monopolist that earns from opted-in data (**data-based revenue**).

Consumers are heterogeneous in terms of opt-in costs (**privacy costs**) and **valuations** for the product.

Two cases The two cases related to the opt-in decisions:

1. The monopolist forces consumers to opt in to purchase the product (no GDPR case);
2. Consumers can choose whether to opt in when they purchase the product (GDPR case).

The assumption implies that the monopolist cannot commit not to use data of consumers who opt out under no GDPR case (credibility issues).

What this paper does (2/2)

Setting Consumers can decide whether to **opt in** to obtain **opt-in benefits** from the monopolist, which earns from opted-in data (**data-based revenue**).

Results After the GDPR,

1. The equilibrium price increases due to (i) entries of privacy-conscious consumers; (ii) a decrease in opt-in consumers.
2. The equilibrium demand does not always increase. It shrinks when the level of data-based revenue is high (due to an *ex-ante* low price).
3. The profit increases if the data revenue is small.
4. Consumer welfare increases if the data-based revenue is small and the opt-in benefits are small.

Outline of the presentation

1. Background (2 pages)
2. The model (1 page)
3. Analysis (6 pages)
4. Extensions (2 pages)
5. Implications (1 page)
6. Conclusion (2 pages)

Background (1/2)

GDPR The European Union (EU)'s General Data Protection Regulation is a stringent law that governs **personal data protection**.   <https://gdpr.eu/>

Consumers can make a “freely given, specific, informed and unambiguous” consent to the processing of their personal data (Article 7, Recital 32).

Significant **penalties for non-compliance** (e.g., 746 million euro fine imposed by Luxembourg's privacy watchdog (CNPD) on Amazon in 2021 (in dispute)).

Pros and cons [pros] More user control over personal data and transparency; [cons] The complexity and compliance costs, especially, for smaller businesses.

Background (2/2)

Criticisms from the academia Many academic researches point out the negative sides of the GDPR.

Empirical (1) A decrease in the collected data (Schmitt et al., 2021; Congiu et al., 2022; Aridor et al., in press),

Empirical (2) dampening AI startups and data-based innovation (Bessen et al., 2020; Jia et al., 2021; Batikas et al., 2023), production of mobile apps (Janßen et al., 2022), and webpage views (Goldberg et al., 2022).

Theory Ineffective (Choi et al., 2019; Chen, 2022).

Question One may wonder if there is any salutary effect to the GDPR. Isn't privacy management beneficial for consumers? Can't such benefits be also good for firms?

[This paper](#) considers the (positive) effects of the GDPR.

The model

A digital business monopolist without marginal cost provides a product at price p .

Consumers are heterogeneous in valuation v and privacy cost c (independent and uniformly distributed on $[0, 1]$).

Options (i) buying with **S**haring data (opt-in); (ii) buying but **N**ot sharing data (opt-out); (iii) no purchasing.

Opt-in x (a common fixed benefit for opt-in consumers).

Demand D_S : The number of consumers who Share data;
 D_N : The number of consumers who do Not share data.

Utility **Opt-in**: $U_S \equiv v + (x - c) - p$; **Opt-out**: $U_N \equiv v - p$.

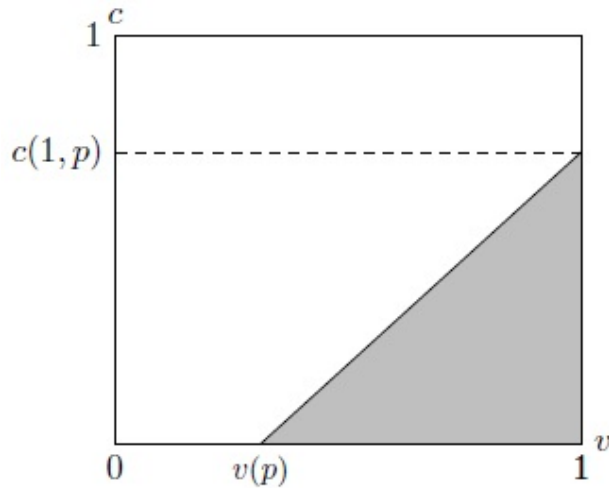
Profits $\Pi \equiv pD(\cdot) + \alpha D_S(\cdot)$;

α : gain from per-unit data; $D = D_S + D_N$.

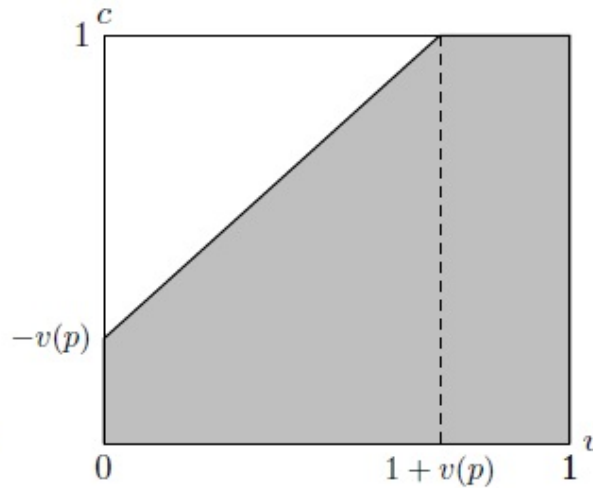
Two scenarios **No GDPR**: p ; **GDPR**: $p \rightarrow$ opt-in decisions.

Analysis (1/6)

No GDPR $U_S = v + (x - c) - p \geq 0 \Rightarrow c \leq c(v, p) = v - \underbrace{(p - x)}_{\equiv v(p)}.$



(a) Case 1a: $0 < v(p) < 1$



(b) Case 1b: $-1 < v(p) \leq 0$

Case (1a) iff $\alpha < \alpha_1 \equiv \max\{(1 - 2x)/2, 0\}.$

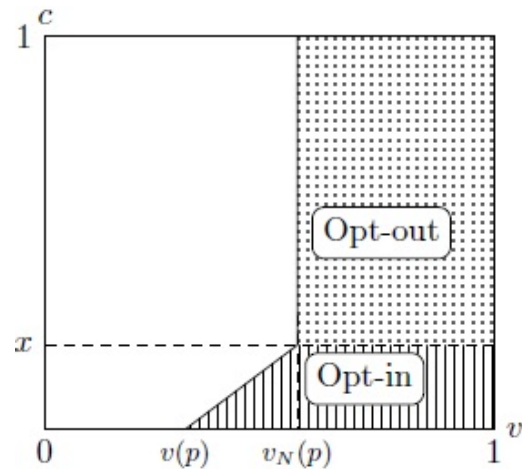
Lemma 1 $x \uparrow \Rightarrow p \uparrow; \alpha \uparrow \Rightarrow p \downarrow;$

$x, \alpha \uparrow \Rightarrow D, \Pi, CS \uparrow, CS$: **consumer surplus.**

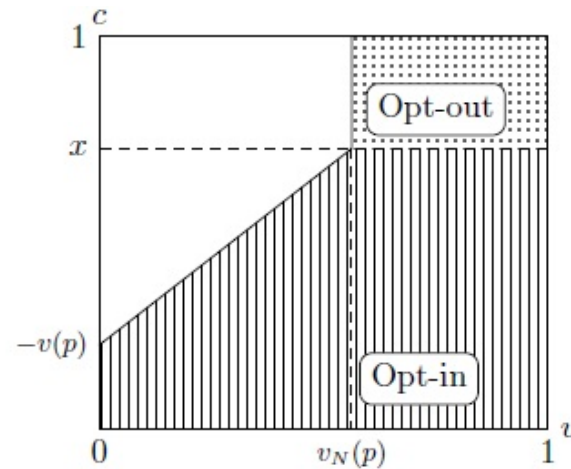
Analysis (2/6)

GDPR **Opt-in:** $c \leq x$ and $U_S \equiv v + (x - c) - p \geq 0$; $v(p) = p - x$.

Opt-out: $c > x$ and $U_N \equiv v - p \geq 0$; $v_N(p) \equiv p$



(a) Case 2a: $0 < v(p) < 1$



(b) Case 2b: $-1 < v(p) \leq 0$

Case (2a) iff $\alpha < \alpha_2 \equiv \max\{(2 - 4x + x^2)/(2x), 0\}$.

Lemma 2 $x \uparrow \Rightarrow p \downarrow$ **iff** $\alpha_2 > \alpha \geq x$; $x \uparrow \Rightarrow D, D_S \uparrow$;

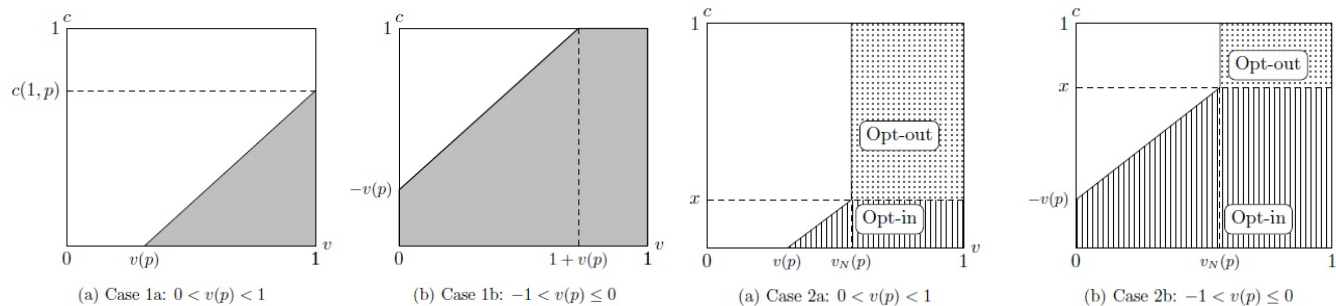
$x \uparrow \Rightarrow D_N \uparrow$ **iff** $\alpha_2 > \alpha > (2 + 2x - 3x^2)/(2(1 - 2x))$;

$\alpha \uparrow \Rightarrow p \downarrow$; $\alpha \uparrow \Rightarrow D_S, D_N \uparrow$; $x, \alpha \uparrow \Rightarrow \Pi, CS \uparrow$.

Analysis (3/6)

Lemma 3 Classifying the two scenarios into the followings:

1. $x \leq 1/2$, $\alpha < \alpha_1$: Cases (1a) and (2a);
2. $1/2 < x \leq 2 - \sqrt{2}$, $\alpha_1 \leq \alpha < \alpha_2$: Cases (1b) and (2a);
3. $2 - \sqrt{2} < x \leq 1$, $\alpha_2 \leq \alpha$: Cases (1b) and (2b).



Proposition 1 After the GDPR, the price increases.

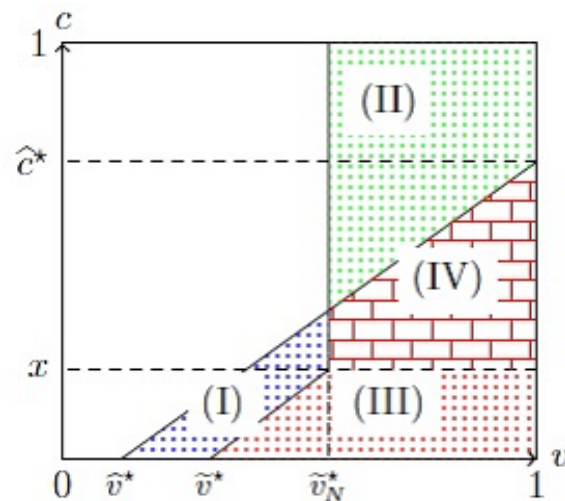
- (i) Entries of privacy-conscious consumers;
- (ii) A decrease in opt-in consumers

(Schmitt et al., 2021, and others).

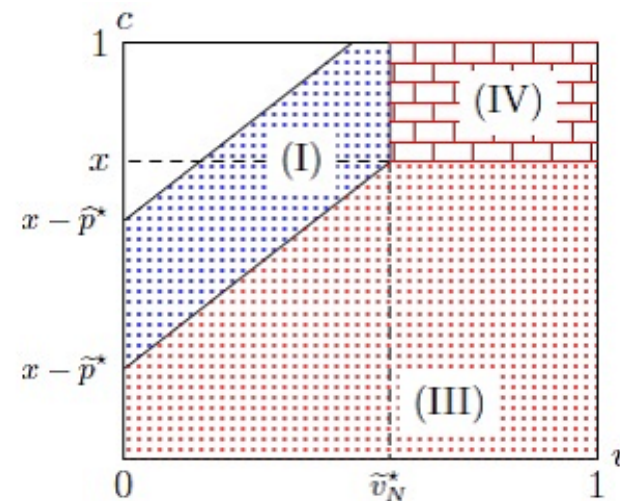
Analysis (4/6)

Proposition 2 The change in demand after the GDPR:

- The total demand D increases iff α is lower than a threshold;
- Consumers without privacy costs are less likely to buy;
- The opt-in demand decreases.



(a) Case 1: $\alpha < \alpha_1(x)$



(b) Case 2: $\alpha_1(x) \leq \alpha_2(x) \leq \alpha$

(I) Exit; (II) Entry (Opt-out); (III) Opt-in; (IV) Opt-out

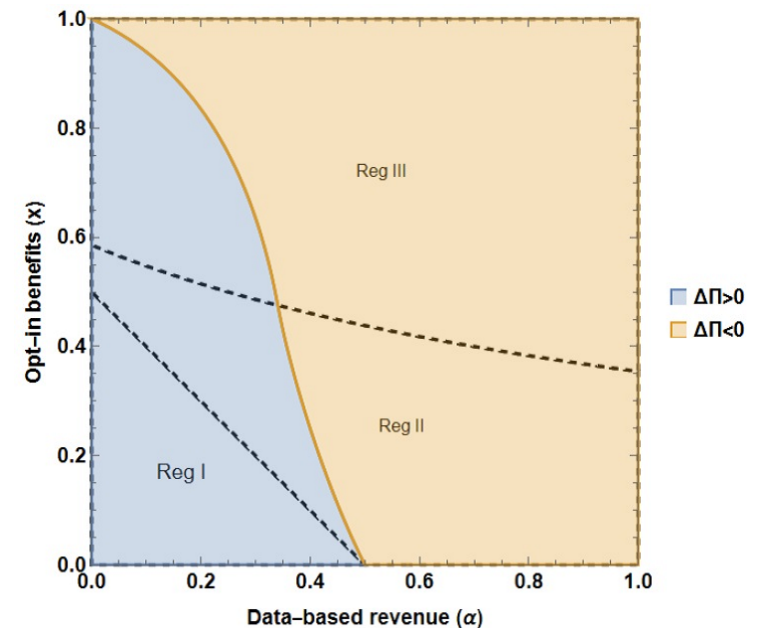
Analysis (5/6)

Proposition 3 The change in profits after the GDPR: The profit increases iff α is lower than a threshold.

Blue: $\Pi \uparrow$; **Orange:** $\Pi \downarrow$.

Low (High) α : Small (Large) losses from opt-out decisions;

Low (High) x : Large (Small) gains from entries of high cost consumers.



An increase in price partially offsets the losses.

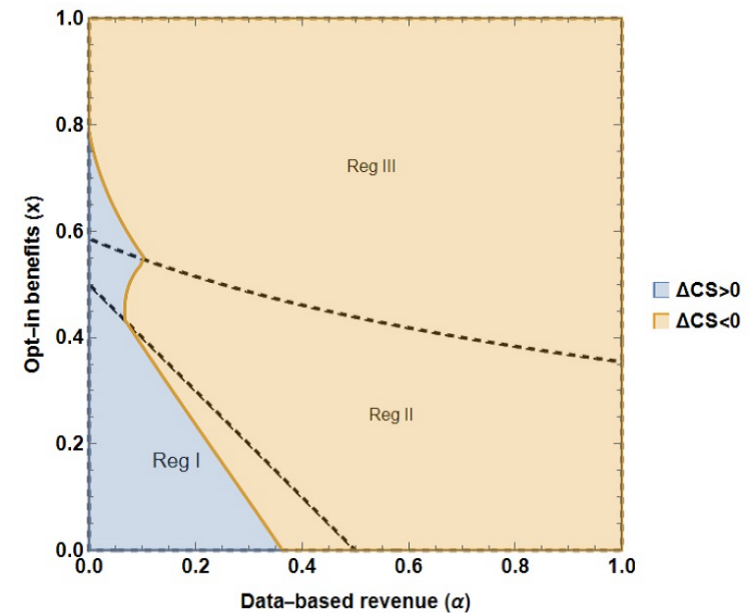
Analysis (5/6)

Proposition 4 The change in consumer surplus (CS) after the GDPR: The consumer surplus increases iff α and x are lower than thresholds.

Blue: $CS \uparrow$; **Orange:** $CS \downarrow$.

Low (High) α : Small (Large) losses from opt-out decisions;

Low (High) x : Large (Small) gains from entries of high cost consumers.

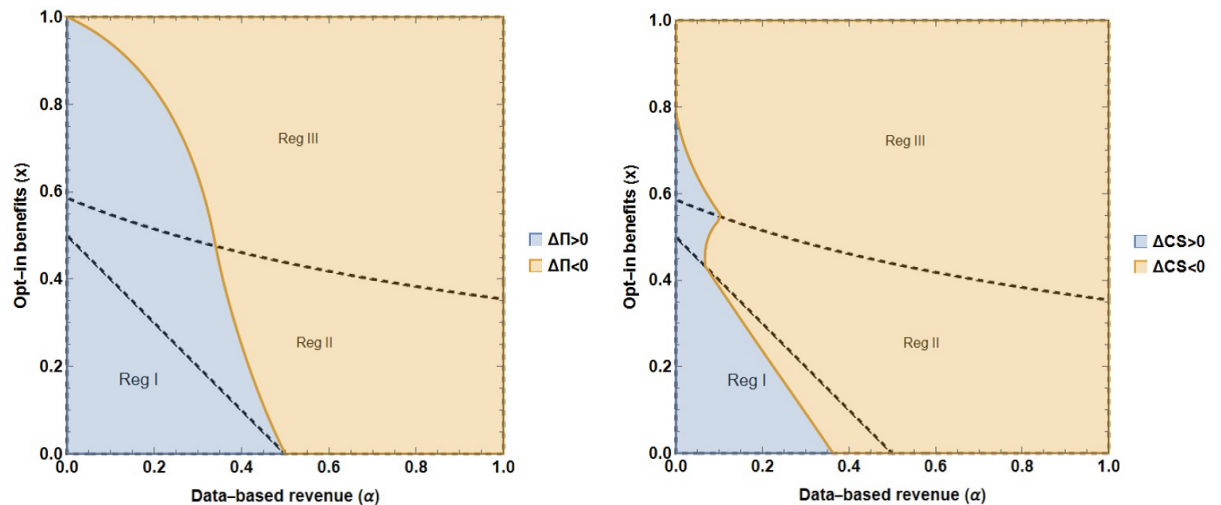


An increase in price worsens the consumer surplus.

Analysis (6/6)

Proposition 3 Π increases iff α is low.

Proposition 4 CS increases iff α and x are low.



Low/High α : Small/Large losses from opt-out decisions.

Low/High x : Large/Small gains from high-cost consumers.

An increase in price benefits the firm.

An increase in price worsens the consumer surplus.

Extensions (1/2)

Preference correlation Positive and negative correlations.

Positive correlation ($c = \phi v$): No demand expansion, harming the firm and benefiting consumers.

Negative correlation ($c = 1 - \phi v$): Entries of low v consumers; the demand becomes independent of x (indifferent consumers are opt-out consumers with low v).

Proposition 5 Under the positive correlation, $\Pi \downarrow$, $CS \uparrow$;
Under the negative correlation, $\Pi \uparrow$ if α is smaller than a threshold, $CS \uparrow$ if α is smaller than a threshold.

Extensions (2/2)

Data externality Positive and negative network benefits.

The key insights do not change.

Positive network benefits (θD_S): Add θD_S to the utility functions.

$$U_S = v + (x - c) + \theta D_S - p;$$

$$U_N = v + \theta D_S - p;$$

$$U_O = 0.$$

Negative network benefits ($\gamma c D_S$): Add $\gamma c D_S$ to consumers who do not opt in.

$$U_S = v + (x - c) - p;$$

$$U_N = v - \gamma c D_S - p,$$

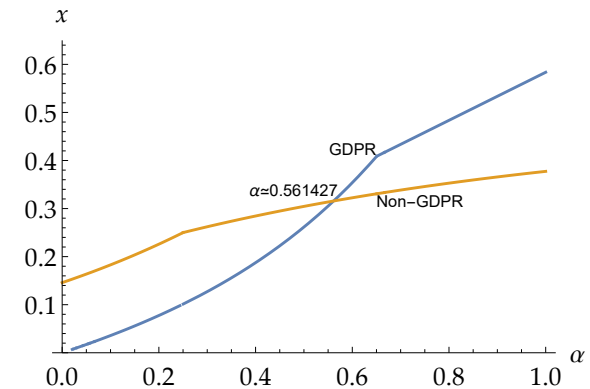
$$U_O = -\gamma c D_S.$$

Implications

Data revenue The profitability of data is a key factor:

- Firms with low data revenues sufficiently increase demands, improving welfare.
Such firms should provide clear privacy management systems to consumers.
- Firms with high data revenues do not sufficiently increase demands, harming welfare.

What such firms should do? If we endogenize the choice of optimal benefits, x , under investment costs x^2 , the monopolist should make more efforts to improve the benefits.

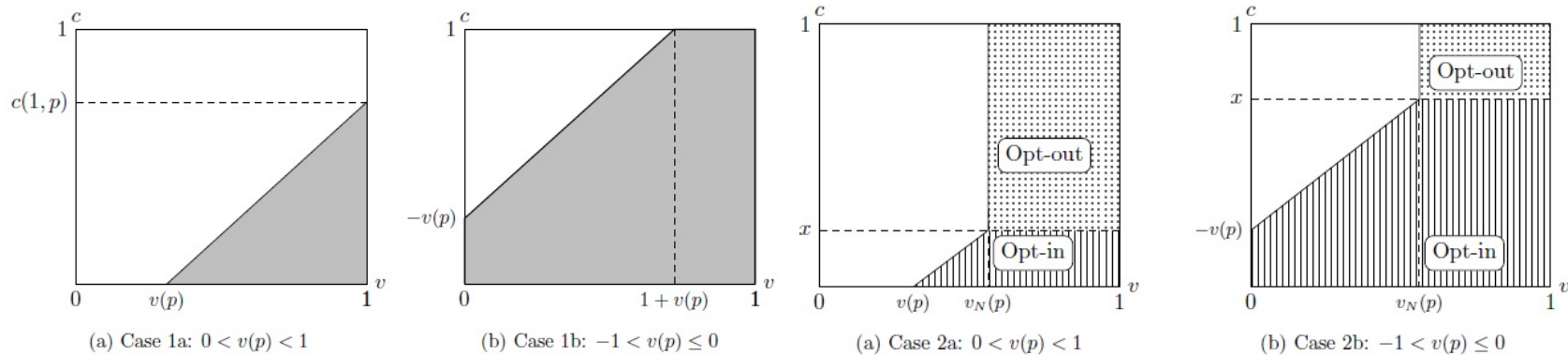


♣ The discussion is not included yet.

Conclusion (1/2)

Setting Consumers can decide whether to **opt in** to obtain **opt-in benefits** from a digital service monopolist that earns from opted-in data (**data-based revenue**).

Consumers are heterogeneous in term of opt-in costs (**privacy costs**) and **valuations** for the product.



Conclusion (2/2)

Results After the GDPR,

1. The equilibrium price increases (privacy-conscious consumers; a decrease in opt-in consumers).
2. The equilibrium demand can shrink when the level of data-based revenue is high.
3. The profit increases if the data revenue is small.
4. The consumer surplus increases if the data revenue is small and the opt-in benefits are small.

Result (E1) When privacy costs and valuations have positive correlation, $\Pi \downarrow$, $CS \uparrow$;

Result (E2) When privacy costs and valuations have positive correlation, $\Pi \uparrow$ if α is smaller than a threshold, $CS \uparrow$ if α is smaller than a threshold.