

Competition Through Recommendations

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Roadmap

Introduction

Setup

Simple recommendations

Value recommendations

Informative recommendations

Competition

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Introduction

Motivation

- ▶ Historical problem: How to *foster* trust on the internet?


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1997

QUARTER 2



Seller Feedback Introduced

We introduce Feedback Forum, allowing our members to rate their transactions and create a virtual community of openness and confidence.

Introduction

Motivation

- ▶ Historical problem: How to *foster* trust on the internet?
 - ▶ Simple (lowest price first) lists \Rightarrow reputation and recommender systems.
 - ▶ Improved profits and higher consumer trust.
 - ▶ Reputation \Longleftrightarrow feedback \Longleftrightarrow value

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- ▶ *Fostering*: Recommender systems more informative of value.

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- ▶ Today: A dreading sense of *enshittification*.
 - ▶ Recommender systems showing poorer results.

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- ▶ Today: A dreading sense of *enshittification*.
 - ▶ Recommender systems showing poorer results.
 - ▶ Fear recommender systems form part of platforms' systemic risk.
 - ▶ DSA 27: transparency and modification of recommender systems parameters.

Introduction

Approach

- ▶ Study the evolution of rec.sys. in a two-sided market.
- ▶ Platform decides how well recommender system informs of value.

Questions

- ▶ Do monopolist inherently create uninformative rec.sys.?
- ▶ Does competition promote informative rec.sys.?
- ▶ How do rec.sys. redistribute surplus?
- ▶ Discuss the role of regulation.

Preview of results

Mechanism

- ▶ More informative rec.sys. induces price competition creating a screening effect.
- ▶ Platform's tradeoff: volume — per transaction revenue

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Implications

- ▶ Result 1: Monopolist platform prefers rec.sys. more informative than value.
- ▶ Result 2: Competition can promote more informative rec.sys.
- ▶ Result 3: Informative rec.sys. inordinately benefit highest quality firms.
- ▶ Result 4: Transparency can discourage informative rec.sys.

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Model (I)

Consumers

- ▶ Unit mass each demanding a single unit of product.
- ▶ Heterogeneous inertia of joining platform, c_i IID $U[0, 1]$.
- ▶ Utility $u_i(\alpha_j, p_j) = \alpha_j - p_j$, α_j quality of firm j and p it's price.
- ▶ Mass of consumers joining platform: n .

Drop the j subscript.

Model (II)

Firms

- ▶ Unit mass of single product firms.
- ▶ Products are homogeneous with heterogeneous quality, α IID $U[0, 1]$.
- ▶ Only sell on platform, no direct sales.
- ▶ Fees: Ad valorem commission fee, r , to platform.
- ▶ Marginal cost = 0.
- ▶ $\pi(D(\alpha, p, \mathbf{p}_{-j}), p) = (1 - r)D(\alpha, p, \mathbf{p}_{-j})p$.
- ▶ Set of firms joining platform: N .

Model (III)

Platform

- ▶ Intermediates between consumers and firms.
- ▶ Provides recommendations through product listings.
- ▶ $\Pi = r \int_{\alpha_h \forall h \in N} D_h(\alpha_h, p_h, \mathbf{p}_{-h}) p_h d\alpha_h.$
- ▶ $D_h(\alpha_h, p_h, \mathbf{p}_{-h}) = n\lambda(\alpha_h, p_h, \mathbf{p}_{-h}).$
- ▶

$$\lambda(\alpha, p, \mathbf{p}_{-j}, \sigma) = \begin{cases} \frac{\alpha - p - \sigma}{\int_{\alpha_h \forall h \in N} \alpha_h - p_h - \sigma d\alpha_h} & \text{if } \alpha - p - \sigma \geq 0 \\ 0 & \text{otherwise,} \end{cases}$$

$$\sigma \in \mathbf{R}_+.$$

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$$\sigma \in \mathbf{R}_+.$$

Note: relative value, positive utility.

Model (IV)

Timing

- ▶ Platform announces its recommender system.
- ▶ Firms decide to join the platform, setting prices.
(platform 'learns' firm quality)
- ▶ Consumers decide to join the platform, obtains recommendations and consume.

Find SPNE.

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Simple recommendations

Lowest-price first

$$\lambda^s(p, \mathbf{p}_{-j}) = \frac{1}{\int_{\alpha_h \forall h \in N} 1 \, d\alpha_h}.$$

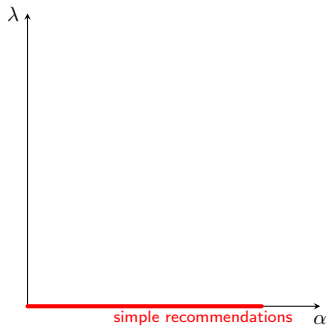
- Highly uninformative — Bertrand like competition.

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Equilibrium

- ▶ Consumers join the platform if $E[u^s] \geq c_i$.
- ▶ Firms set $p^s = 0$.
- ▶ $CS = \frac{1}{2}$, firm and platform make zero surplus.

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Value recommendations

Fixing $\sigma = 0$:

$$\lambda^v(\alpha, p, \mathbf{p}_{-j}) = \begin{cases} \frac{\alpha - p}{\int_{\alpha_h \forall h \in N} \alpha_h - p_h d\alpha_h} & \text{if } \alpha - p \geq 0 \\ 0 & \text{otherwise.} \end{cases}$$

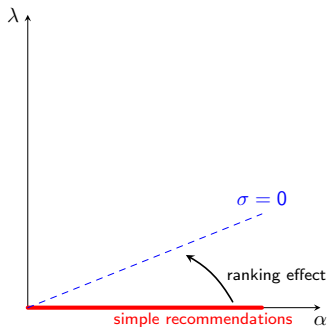
- λ^v highlights a **ranking effect**.

Value recommendations

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- ▶ λ^v highlights a **ranking effect**.
 - ▶ Higher relative value \Rightarrow higher on the list.
 - ▶ Platform can generate utility using informative recommendation rule.

Equilibrium

Consumers

- ▶ Always purchase if join the platform.
- ▶ $n^v = E[u^v] = \int_{\alpha_g \forall g \in N} \frac{\alpha_g - p_g}{\int_{\alpha_h \forall h \in N} \alpha_h - p_h d\alpha_h} (\alpha_g - p_g) d\alpha_g.$

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Firms

- ▶ $\pi^v = n^v \times \frac{a-p}{\int_{\alpha_h \forall h \in N} \alpha_h - p_h d\alpha_h} \times (1-r)p.$
- ▶ $p^v = \frac{\alpha}{2}.$

Surplus

- ▶ Platform and firm total profits: $\frac{1}{9}, > 0$.
- ▶ Consumer surplus: $\frac{1}{3}, < \frac{1}{2}$.
- ▶ Total surplus: $\frac{4}{9}, < \frac{1}{2}$.

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Remark

1. *Platform has an incentive to introduce value rec.sys.*
2. *Relying solely on consumer generated data makes consumers worse-off than simple lists.*

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Informative recommendations

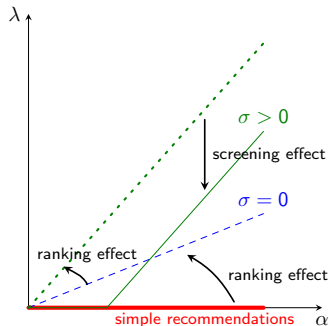
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 - ▶ Exacerbates **ranking effect**.
 - ▶ Creates **screening effect**.

Informative recommendations

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- ▶ Higher σ emphasises value.
 - ▶ Exacerbates **ranking effect**.
 - ▶ Creates **screening effect**.
 - ▶ Some lower quality firms obtain no transactions.

Equilibrium (I)

Consumers

- ▶ Always purchase if join the platform.
- ▶ $n^m = E[u] = \int_{\alpha_g \forall g \in N} \frac{\alpha_g - p_g - \sigma}{\int_{\alpha_h \forall h \in N} \alpha_h - p_h - \sigma d\alpha_h} (\alpha_g - p_g) d\alpha_g.$

Firms

- ▶ $\pi = n^m \times \frac{a - p - \sigma}{\int_{\alpha_h \forall h \in N} \alpha_h - p_h - \sigma d\alpha_h} \times (1 - r)p.$
- ▶ $p^* = \frac{\alpha - \sigma}{2}.$
 - ▶ Set low prices to attract demand, low quality firms become unprofitable.
 - ▶ Only sufficiently high quality firms are active on the platform, $\bar{\alpha} = \sigma.$

Equilibrium (II)

Platform

$$\Pi = \int_{\sigma}^1 \lambda(\alpha_h, p_h^*, \mathbf{p}_{-h}, \sigma) (\alpha_h - p_h^* - \sigma) d\alpha_h r \int_{\sigma}^1 \lambda(\alpha_h, p_h^*, \mathbf{p}_{-h}, \sigma) p_h^* d\alpha_h$$

- Balance: Transaction volume and per transaction revenue.

Equilibrium (II)

Platform

$$\Pi = \frac{1 + 2\sigma}{3} r \frac{1 - \sigma}{3}.$$

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- ▶ Balance: Transaction volume and per transaction revenue.
- ▶ Raising σ :
 - ▶ Ranking effect — More transactions between consumers and better firms.
 - ▶ Screening effect — Only higher quality firms remain.
 - ▶ Price competition — each firm sets lower prices.

Equilibrium (II)

Platform

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- ▶ Balance: Transaction volume and per transaction revenue.
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Proposition

There exists a unique SPNE where a monopolist platform sets $\sigma^m = \frac{1}{4} > 0$.

Surplus

Suppose $\sigma \uparrow$:

- ▶ Redistribution of profits towards to highest quality firms.
- ▶ All other firms worse-off: lower prices, fewer (zero) transactions.
- ▶ Consumers face higher quality firms at lower prices (better-off).

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Note: protectionism, variety.

Surplus

Equilibrium

- ▶ Total profits $\frac{1}{8}, > \frac{1}{9}$.
- ▶ Consumer surplus: $\frac{1}{2}$, 'identical' to simple recommendations.
 - ▶ (*Postulation*) Better if: positive prices, risk aversion.
- ▶ Total surplus: $\frac{5}{8}, > \frac{1}{2}$.

Remark

1. Platform has an incentive to introduce rec.sys. more informative than value.
2. Platform preferred rec.sys. allows consumers to be better-off and generates surplus compared to simple recommendations.

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Remark

DSA Article 27: ability to modify main parameters.

Has no bite? Consumers already better off than when "left to their own devices".

Naivete

Recommender systems are complex:

- ▶ Consumers may not be able to fully rationalise their effects.
- ▶ For example: equilibrium effects on prices.

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Alternate environment:

Consumers do not rationalise equilibrium effect of σ on prices.

- ▶ To consumers, $p^c = \frac{\alpha}{2}$.

$$\lambda^c = \begin{cases} \frac{\frac{\alpha}{2} - \sigma}{\int_0^1 \frac{\alpha_h}{2} - \sigma d\alpha_h} & \text{if } \alpha - p \geq 0 \\ 0 & \text{otherwise} \end{cases}.$$

Consumers wrongly imagine all firms are active.

Naivete

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Proposition

When consumers are naive, $\sigma^N \rightarrow \frac{1}{4}$ from below.

- ▶ Consumers and platform are both worse-off than no naivete.

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Proposition

When consumers are naive, $\sigma^N \rightarrow \frac{1}{4}$ from below.

- ▶ Consumers and platform are both worse-off than no naivete.
- ▶ [DSA Article 27](#) on transparency:
Aligned with consumers' concerns.
Already in line with platform's preference.

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Competitor: simple recommendations

Setting

- ▶ Suppose there exist two platforms $k \in \{I, C\}$ incumbent and competitor, acting simultaneously.
- ▶ Consumers:
 - ▶ inertia IID drawn $c_{i,k} \sim U[0, 1]$.
 - ▶ Single home — only join platform which gives highest $E[u_k] - c_{ik}$.
- ▶ Firms: costless to join platforms, and may choose to multi-home.

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Note: Competitor has no decisions to make, incumbent announces σ .

Equilibrium (I)

Consumers

- ▶ Join platform with highest expected utility.
- ▶ Buy recommended product.

$$n_k = \begin{cases} E[u_k] - \frac{E[u_{-k}]^2}{2} & \text{if } E[u_k] \geq E[u_{-k}] \\ E[u_k](1 - E[u_{-k}] + \frac{E[u_k]}{2}) & \text{if } E[u_k] < E[u_{-k}]. \end{cases}$$

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Firms

- ▶ Positive profit on incumbent, zero profit on competitor.
Set $p^* = \frac{\alpha - \sigma}{2}$ on incumbent, $p = 0$ on competitor.

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 - ▶ Multi-homing decreases incumbent demand.

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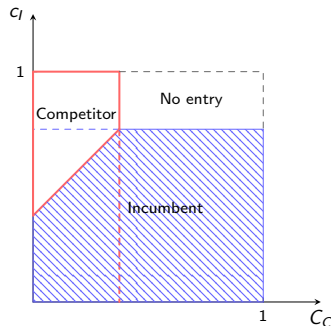
Equilibrium (II)

Proposition

When the competitor adopts simple recommendations, $\sigma_I = \frac{2}{9} < \sigma^m$.

Remark

1. Competition does not necessarily lead to more informative recommendations.
2. Consumer surplus increases — driven by ‘new’ consumers accessing the competitor **not** recommendations.



Competitor: informative recommendations (I)

Both platforms use informative recommendations: (backwards)

- ▶ Consumers join platform with highest expected utility and buy.
- ▶ Firms choose which platform to join and on either set $p^* = \frac{\alpha - \sigma}{2}$.
- ▶ Platforms simultaneously maximise profits, selecting σ_I and σ_C .

Search for symmetric equilibrium.

(essentially a symmetric problem, here asymmetric equilibria fail to be stable.)

Competitor: informative recommendations (II)

Proposition

When both platforms adopt informative rec. sys., there exists a unique symmetric equilibrium:

1. $\sigma^c = 0.379 > \sigma^m$.
2. *Firms multi-home if $\alpha \geq \sigma^c$ and are inactive otherwise.*

Competitor: informative recommendations (II)

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 2. *Firms multi-home if $\alpha \geq \sigma^c$ and are inactive otherwise.*
- ▶ Informative competition drives informative recommendations.
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 - ▶ Issues with symmetric equilibrium?

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- ▶ Issues with symmetric equilibrium?

DMA: data sharing // level playing field between platforms → competition between firms on each platform.

Fostering–Enshittification

Fostering Phase

- ▶ Monopoly (eBay): from simple lists to value rec sys.
- ▶ Consumer awareness leads to more informative rec.sys.
- ▶ Competition: rec.sys. become more informative of value.

Fostering–Enshittification

Fostering Phase

- ▶ Monopoly (eBay): from simple lists to value rec sys.
- ▶ Consumer awareness leads to more informative rec.sys.
- ▶ Competition: rec.sys. become more informative of value.

Enshittification Phase

- ▶ Rise of gatekeepers \Rightarrow less informative of value.
- ▶ More complex recommendation mechanisms \Rightarrow less informative of value.
(less transparent)

Enshittification bad, but better than leaving consumers to fend for themselves.

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More results (I): marginal cost

In the monopoly setting, suppose instead:

- ▶ Firms face a positive marginal cost e .

Firms:

- ▶ Optimal pricing strategy $\frac{\alpha - \sigma + e}{2}$.
- ▶ Only firms with $\alpha > \sigma + e$ are active — marginal costs drives screening.

More results (I): marginal cost

In the monopoly setting, suppose instead:

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Firms:

- ▶ Optimal pricing strategy $\frac{\alpha - \sigma + e}{2}$.
- ▶ Only firms with $\alpha > \sigma + e$ are active — marginal costs drives screening.

Platform:

- ▶ Firms set higher prices \rightarrow platforms fee increases.
- ▶ Tradeoff between per transaction revenue and volume becomes less stark.
- ▶ Obtain volume: prefer more informative recommendations, $\sigma > \sigma^m$.

All effects serve to improve CS.

More results (II): per unit fees

In the monopoly setting, suppose instead:

- ▶ The platform sets per-unit fees, b , rather than ad-valorem fees.
- ▶ Announces its fee b alongside σ .

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In equilibrium:

- ▶ Firms optimal pricing strategy is $\frac{\alpha - \sigma + b}{2}$.
- ▶ Platform profit is increasing in σ , and they prefer $\sigma = 1 - b$ such that only the highest quality firm is active.
- ▶ Optimal $b^* = \frac{1+2\sigma}{2} = \frac{3}{4}$ and $\sigma = \frac{1}{4}$.

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- ▶ Optimal $b^* = \frac{1+2\sigma}{2} = \frac{3}{4}$ and $\sigma = \frac{1}{4}$.

Platform extracts full profits. Consumers only interact with highest quality firm and $CS = \frac{1}{4}$.

More results (III): Asymmetric competition (I)

In the competition setting, suppose instead:

- ▶ There is asymmetric consumer inertia across platforms:
 - ▶ The distribution of inertia to join competitor first order stochastic dominate the inertia to join incumbent. (more costly to join competitor.)
 - ▶ Crudely suppose: $c_{i,I} \sim U[0, 1]$ and $c_{i,C} \sim$ triangular distribution peak 1.

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Proposition

There exists a unique equilibrium where $\sigma_C = 0.475 > \sigma_I = 0.319$.

Closely relates to how a new competitor (TikTok) wants to gain market share through better algorithms (against Instagram).

More results (IV): Asymmetric competition (II)

In the competition setting, suppose instead:

- ▶ Platforms announce their recommender system sequentially.
- ▶ Allow the incumbent to be more 'flexible' and move second.

More results (IV): Asymmetric competition (II)

In the competition setting, suppose instead:

- ▶ Platforms announce their recommender system sequentially.
- ▶ Allow the incumbent to be more 'flexible' and move second.

Firms: optimal price $p = \frac{\alpha - \sigma_k}{2}$.

- ▶ $\alpha \geq \max\{\sigma_C, \sigma_I\}$ multi-home.
- ▶ $\alpha \in [\sigma_C, \sigma_I)$ single-home.
- ▶ $\alpha < \min\{\sigma_C, \sigma_I\}$ inactive.

More results (IV): Asymmetric competition (II)

In the competition setting, suppose instead:

- ▶ Platforms announce their recommender system sequentially.
- ▶ Allow the incumbent to be more 'flexible' and move second.

Firms: optimal price $p = \frac{\alpha - \sigma_k}{2}$.

- ▶ $\alpha \geq \max\{\sigma_C, \sigma_I\}$ multi-home.
- ▶ $\alpha \in [\sigma_C, \sigma_I)$ single-home.
- ▶ $\alpha < \min\{\sigma_C, \sigma_I\}$ inactive.

Proposition

There exists a unique equilibrium where $\sigma_I = 0.360 > \sigma_C = 0.311$, $\Pi_I > \Pi_C$.

Even with asymmetric data, competition can stimulate informative recommendations

More results (V): Multi-homing consumers

In the competition setting, suppose instead consumers search across platforms:

- ▶ Consumers join platform giving highest $E[u_k] - c_{i,k}$.
- ▶ They see a firm, if value is too low go to next platform.

Note: search is 'costly' in that inertia is positive.

More results (V): Multi-homing consumers

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Proposition

There exists a symmetric equilibrium where $\sigma < \sigma^m$.

This is unique under uniform distribution.

Remark

When consumers search, competition lowers consumer surplus.

More results: Robustness

Monopoly

- ▶ General distributions: Relative informativeness of rec.sys. hold if
 - ▶ Distribution of high-quality firms not too heavy.
 - ▶ Distribution of consumer inertia not too low.
- ▶ Negative consumption utility
- ▶ General recommender function

Competition

- ▶ Costly firm entry onto second platform.
 - ▶ Top firms join both platforms; Next group join one platform at random; Last group join less informative platform.
 - ▶ The rest exit.

Roadmap

Introduction

Setup

Simple recommendations

Value recommendations

Informative recommendations

Competition

Extensions

Conclusion

Related Literature

Closest (?) theory papers:

- ▶ Platforms competition: Damiano and Hao, 2008
- ▶ Non-price strategies: Jeon and Rochet, 2010; Nocke and Strausz, 2023; Casner and Teh, Forthcoming
- ▶ Competition among search engines: De Corniere, 2016

Related empirical evidence:

- ▶ Recommender systems build trust: Chen and He, 2011
- ▶ Value drives reputation: Luca, 2016
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- ▶ Competing rec.sys.? [Please let me know.](#)

Summary

- ▶ Capture how recommender systems evolved over time (1997 – 2024).
- ▶ Rise of Gatekeepers can explain enshittification.
- ▶ Consumers are not necessarily worse-off despite Gatekeepers
- ▶ DSA 27 seems redundant.
Already in platforms interest to be transparent.
Difficult for consumers to do better than platform.
- ▶ Regulating gatekeepers not only facilitate competition between platforms but between firms on platforms.

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Questions? Comments?
Thanks for the invite.
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