## Reselling Information

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What is the impact of resale on the price of information?

## Outline

(1) Example: The Problem
(2) Example: A Solution
(3) General Model

4 Discussion

This talk is mostly set in Exampleland. I am happy to remain there for as long as audiences like.

## benchmark: vanilla world without resale



Seller has information (e.g., knowledge of $\omega$ ).
Buyer's value for information $=1$; payoff of 0 until then.
Each link meets with probability $\lambda d t$ in period of length $d t$.
Each player discounts future at rate $r>0$.
Frequency of interaction per unit of effective time is $\lambda / r$.

Each buyer obtains info only from the seller.

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$\underbrace{p-p \int_{0}^{\infty} e^{-r t} e^{-\lambda t} \lambda d t}_{\text {Seller's Gain from Selling Today }}=\underbrace{(1-p)-(1-p) \int_{0}^{\infty} e^{-r t} e^{-\lambda t} \lambda d t}_{\text {Buyer's Gain from Buying Today }}$.

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$\Longrightarrow \mathrm{p}=\frac{1}{2}$.

Without resale, buyers and seller split the surplus.
Seller's payoff $\rightarrow \frac{1}{2} \times$ social surplus as $\lambda / r \rightarrow \infty$

## pricing with resale



Once a buyer obtains info, he can sell it to the other buyer at the next trading opportunity.

Key idea: information is replicable $\Rightarrow$ buyer can both consume and sell it.

## pricing with resale

Sale of information is publicly observed.
Payoff-relevant state is the set of informed players:

$$
s \in\left\{\{S\},\left\{S, B_{1}\right\},\left\{S, B_{2}\right\},\left\{S, B_{1}, B_{2}\right\}\right\} .
$$

Equilibrium $\equiv$ value functions $\mathrm{V}_{i}(\mathrm{~s})$ and prices $p_{i j}(s)$ where
(1) Value functions satisfy rational expectations given prices,

2 Prices satisfy symmetric Nash bargaining given value functions:

- Trade today iff trading today increases bilateral surplus.
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(1) Value functions satisfy rational expectations given prices,
(2) Prices satisfy symmetric Nash bargaining given value functions:

- Trade today iff trading today increases bilateral surplus.
- prices split the gains from trade equally.

Study both immediate agreement and seller's optimal equilibria.

$$
s=\left(\mathrm{S}, \mathrm{~B}_{1}\right)
$$

Proceed by backward induction: suppose $S$ and $B_{1}$ have information.
$B_{2}$ can buy information from either $S$ or $B_{1}: 2$ trading partners.
Prices $p_{\mathrm{S} 2}(\mathrm{~s})=\mathrm{p}_{12}(\mathrm{~s})$ and solve
$\underbrace{p-p \int_{0}^{\infty} e^{-r t} e^{-2 \lambda t} \lambda d t}_{\text {Seller's Gain from Trading Today }}=\underbrace{(1-p)-(1-p) \int_{0}^{\infty} e^{-r t} e^{-2 \lambda t} 2 \lambda d t}_{\text {Buyer's Gain from Trading Today }}$.

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which converges to 0 in a frictionless market $(\lambda / r \rightarrow \infty)$.

## key idea

For buyer, gain from trading today is cost of delay $\approx 0$.
For a seller, gain from trading today $\gg 0$ because she may lose buyer to other seller.

Equating these two gains implies prices must vanish.

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Equating these two gains implies prices must vanish.
Is this intuitive?

- Yes: Bertrand outcome expected if $\mathrm{B}_{2}$ met S and $\mathrm{B}_{1}$ simultaneously.
- No: $B_{2}$ meets only one at a time, faces costs from delay, and so Diamond Paradox may apply.

Slight bargaining power to the buyer averts the Diamond Paradox.

## two uninformed buyers remain

Let $\gamma \equiv \int_{0}^{\infty} e^{-r t} e^{-2 \lambda t} \lambda d t$, which converges to $\frac{1}{2}$ as $\lambda / r \rightarrow \infty$.

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Suppose $S$ meets a buyer.
Buyer's payoff:

- Trading today: $1-p(1)+\gamma p(2)$
- Waiting: $\gamma(1-p(1)+\gamma p(2))+\gamma(2 \gamma)(1-p(2))$


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- Trading today: $1-p(1)+\gamma p(2) \rightarrow 1-p(1)$.
- Waiting: $\gamma(1-p(1)+\gamma p(2))+\gamma(2 \gamma)(1-p(2)) \rightarrow 1-\frac{p(1)}{2}$.

The payoff from waiting is higher if $p(1)>0$.
Therefore, $\mathrm{p}(1) \rightarrow 0$ as $\lambda / r \rightarrow \infty$.

## discussion

The seller is a monopolist on information.

But neither he nor the first buyer cannot commit to selling information to the second buyer.
$\Longrightarrow$ the second buyer gets information for virtually free.

Little incentive for the first buyer to pay a lot for info:

- Resale price is low.
- Waiting to be the second buyer involves minimal delay.


## seller-optimal equilibrium

The seller-optimal equilibrium may involve delayed agreements.
Structure of equilibrium:

- Seller never sells info to $B_{2}$ before she sells info to $B_{1}$.
- Once seller sells info to $B_{1}$, then both compete to sell it to $B_{2}$.

In this equilibrium, every meeting between $S$ and $B_{2}$ has no trade before $B_{1}$ is informed.
$\Rightarrow B_{1}$ knows that he is always first buyer and so he pays $\frac{1}{2}$.

## not-trading must be credible

Is it credible for $S$ and $B_{2}$ to not trade?

whenever $\lambda / r>5$.

## summary

Seller-optimal equilibrium features delay.

Seller obtains bilateral bargaining price from at most 1 buyer in any eqm.

- Even if $n>2$, the seller does not obtain a non-trivial price from any buyer other than the first to whom she sells.
- Key idea: Once the seller sells information to any buyer, then in every equilibrium, prices $\rightarrow 0$ in the frequent-offer limit.

Clearly, seller can do better if she can prohibit resale. But are there non-contractual solutions?

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## preview

One way to view previous results is that it identifies what happens in Markov Perfect Equilibria in which all trading decisions condition only on the payoff-relevant aspects of history.

Here, we are going to augment the game with "tokens" to encode a slight degree of history dependence.

To understand this, let us begin with an interlude.


Led Zeppelin, Past, Present and Future

## what if information weren't replicable?

an interlude


Suppose the good were non-replicable:

- There is only a single copy of the good, of value 1 to each buyer.
- A buyer who possesses it can consume or re-sell it.

Once a buyer obtains the good, there is no reason to re-trade.
Equilibrium prices solve


Recall that $\gamma=\int_{0}^{\infty} e^{-r t} e^{-2 \lambda t} \lambda d t \rightarrow \frac{1}{2}$.
$\Rightarrow$ seller obtains the entire social surplus.

By being on the short side of the market, seller captures all of the buyer's gains from trade.

## selling tokens

interlude is over

We will exploit this idea.

Seller will sell a single token that is intrinsically worthless but will affect continuation play.

We will show that by doing so, she can capture the full intellectual property value of her information.

## a prepay scheme

Seller first sells a single token to either buyer.
If buyer $B_{i}$ buys token, then seller always sells info first to $B_{j}$.
Token $=$ Right to be the 2 nd buyer of info, who buys info at $\approx 0$.

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- Value of token $=p(1)-p(2) \approx 1 / 2$.
- Fewer tokens than buyers $\Rightarrow$ Seller captures full value of token.
- Seller obtains $\approx 1 / 2$ for the token and $\approx 1 / 2$ for info!

Problem Solved!
maybe that was a bit fast. -
let's do some algebra to convince ourselves.

Buyer's value from purchasing token is $V_{t}$ and price of token is $p_{t}$.

$$
V_{t}=-p_{t}+\frac{\lambda}{r+\lambda}(2 \gamma)(1-p(2))
$$

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Seller's Gain from Selling Token
Buyer's Gain from Buying Token

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As $\lambda / r \rightarrow \infty: \quad 0=\frac{1-p_{\mathrm{t}}}{2}-\frac{1-\mathrm{p}(1)}{2} \Longrightarrow \mathrm{p}_{\mathrm{t}} \rightarrow \mathrm{p}(1)=1 / 2$

## prepay scheme

Tokens play the role of encoding a minimal degree of history dependence:

- Tokens need not be "physical."
- Info Resale: Value of token $=$ Value of buying info for $\approx 0$ later.
- With $n$ buyers, seller sells $n-1$ tokens.
- Competition: Scarce tokens $\rightarrow$ S captures buyer's value for token.
- Scheme exploits competition + resale.

Could also implement solution by slicing / encrypting information into different bits, and selling each bit separately.

Solution solves the commitment problem by exploiting it.

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## environment without tokens

- A set of buyers $\mathcal{B} \equiv\left\{b_{1}, \ldots, b_{n}\right\}$; value of info for each player is $v$.
- A set of sellers $\mathcal{S} \equiv\left\{s_{1}, \ldots, s_{m}\right\}$, all with identical info.
- The set of agents is $\mathcal{A} \equiv \mathcal{B} \cup \mathcal{S}$.
- Each pair of agents have a "trading relationship."
- All players have discount rate $r$.


## discrete-time

Trading opportunities occur at time periods $0, \Delta, 2 \Delta, \ldots$.

In each period, a "link" is recognized.

Each link is recognized with uniform probability.

Results consider limiting behavior as $\Delta \rightarrow 0$.

## solution concept

Set of informed players is payoff-relevant state space.

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Value function satisfies rational expectations: $\mathrm{V}_{i}: \mathcal{M} \rightarrow \mathfrak{R}$.

Trading functions satisfy Nash Bargaining:

- $\alpha_{i j}: \mathcal{M} \rightarrow\{\mathbf{N}, \mathbf{l}$ 组 $\}$,
- $p_{i j}: \mathcal{M} \rightarrow \mathfrak{R}$.


## nash bargaining

Trading functions satisfies Nash Bargaining if for all $M \in \mathcal{M}, i \in M$, and $j \in \mathcal{A} \backslash M$,
$\left.\alpha_{i j}(M)=\mathbf{I}\right\} \Leftrightarrow \underbrace{V_{i}(M \cup\{j\})+v+V_{\mathfrak{j}}(M \cup\{j\})}_{\text {Joint Surplus with Trade }} \geqslant \underbrace{V_{i}(M)+V_{\mathfrak{j}}(M)}_{\text {Joint Surplus with No Trade }}$

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and $p_{i j}(M)$ is set to divide the change in surplus equally:

$$
\begin{aligned}
& (1-w) \times(\underbrace{p_{i j}(M)+V_{i}(M \cup\{j\})-V_{i}(M)}_{\text {Change in Seller's Surplus }}) \\
& =w \times(\underbrace{v-p_{i j}(M)+V_{j}(M \cup\{j\})-V_{j}(M)}_{\text {Change in Buyer's Surplus }}) .
\end{aligned}
$$

## equilibrium

An equilibrium is a triple ( $\mathrm{V}, \alpha, \mathrm{p}$ ) such that V satisfies rational expectations given $(\alpha, p)$, and $(\alpha, p)$ satisfy Nash Bargaining given $V$.

## Proposition

For every $\Delta>0$, an equilibrium exists.

## a statement about all equilibria

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The proof proceeds by induction on $|\mathrm{M}|$.
Base Step: Suppose $|M|=|\mathcal{A}|-1$.
Then we know that every equilibrium involves immediate agreement and prices converging to 0 .

## induction hypothesis

Suppose result is true when $|M|=k+1$. We consider $|M|=k$.

- If there are at least two active buyers, a buyer $i$ 's disagreement value must converge to $v$ since she can always wait.


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- If there is only one active buyer-seller pair, and limiting price is $p>0$, then trade cannot happen when buyer $i$ meets any other seller.
- But joint surplus from disagreement is $v-p$.
- Joint surplus from agreement is $v$.
- $\Rightarrow$ contradiction.


## seller-optimal equilibria

Proposition. In the seller-optimal equilibrium, with a single seller, she obtains a price of $\approx w v$ from first buyer, and $\approx 0$ from any other buyer.

Prior result establishes that prices converge to 0 once there are two sellers, so only opportunity to gain is by holding up the first buyer.

## results with tokens

Suppose there is a single seller initially and $n$ buyers.

We allow the seller to sell $n-1$ tokens as "prepayment".

Proposition. $\exists \bar{\Delta}$ such that if $\Delta<\bar{\Delta}$, a prepay equilibrium exists. As $\Delta \rightarrow 0$, the price paid for each token and the first sale of the information good all converge to $w v$.

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Potentially relevant for thinking about trading for information, incentives to acquire expertise, etc.

Classical narrative attributes underinvestment in information $b / c$ info is a public good (non-rivalrous + non-excludable).

But in our setting, a market for info can exclude buyers.

Our analysis focuses on different channel:

$$
\text { Commitment problems } \rightarrow \text { Low seller payoffs. }
$$

But commitment problem can be exploited to solve the resale problem.

## related literature

Hinting at problem: Arrow (1962).

Appropriability Problem: Anton \& Yao (1994); Beccara \& Razin (2007); Horner \& Skrzypacz (2014).

Resale problem: Polanski $(2007,2019)$, Manea (2020).

Intermediation / bargaining: Condorelli, Galeotti, \& Renou (2016), Manea (2018), Elliot \& Talamas (2019).

Thank you.

