Data Driven Mergers and Synergistic Information

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Very preliminary, do not circulate.

Mergers fail, claimed efficiencies at the time of merger review are often not realized, or if they are realized, they are not passed through to consumers. Is this because firms claim that the merger will yield efficiency gains in the hope of convincing authorities? Is it because firms haven't done the homework and incorrectly evaluated the extent of synergies? Or is it because synergies exist "on average" only, hence that there is a probability that ex-post synergies may not exist?

These questions make sense in a world where firms are unsure of the extend of synergies at the time they decide to merge. In such an environment, more precise information about the level of synergies that will follow a merger is valuable not only for the firms but also for the regulator. One way for such an information can be generated is by collaborating in a soft-way in order to learn whether a full merger is beneficial. While there is a value to such information acquisition there are also costs: the information changes the competitive positions of the firms if the merger does not go through, but also changes the desire of a regulator – who is aware of this information or can infer it from the decisions of firms to merge – to allow the merger.

While our model could be applicable to collaborations like joint ventures, we will cast it in the context of data sharing and the complementarity of data and algorithms that two firms have developed. For instance...[Examples here].

Arrow famously pointed out the difficulty of inducing such collaborations among competitors, especially if what is shared is an idea that can be replicated at no cost. But even if there is a cost to replication, providing assets to competitors enhances their ability to compete, hence sharing is costly for the firm that shares its assets. Our contribution is to show that this competitive

^{*}We would like to thank.

disadvantage is balanced by more efficient merger decisions, which is at the benefit of the firms, and sometimes of consumers.

Let us think for a minute of Google and a small firm A that has developed a new product. Google does not have, yet, a competing product, nor has accumulated like A did data on users of such a product. Hence A has a significant competitive advantage on Google for this product, at least a market leadership in the short term. The product value to consumers can be enhanced by leveraging the data that Google has accumulated into the algorithm developed by firm A, but this is not a certainty: the synergies between the data and algorithms of Google and A are yet unknown, even if both firms have a good understanding of the likelihood of these synergies.

If Google obtains part of the data accumulated by A, it could develop its own product/algorithm and compete with A, weakening the competitive position of A if Google and A compete head-to-head. We assume that who develops and markets the product is not neutral: a product developed by Google has the stamp "Google" on it, in particular worries that consumers may have about privacy or the fact that the data collected by Google when they use this product will have effects on their web-surfing experience. Before developing a competiting product, Google will have to explore the value it can bring to customers: this value is increasing in the level of data shared by A and the level of synergies θ . Hence the more data A shares with Google, the weaker its competitive position. Because there is a cost to exploration, Google will engage in exploration only if sharing is large enough, and sharing becomes therefor an investment that A does in order for Google and A to learn about their synergies.

Then, if synergies are low, a merger is not beneficial and Google and A compete head-to-head, a worse situation for A than in the absence of sharing. But if synergies are high, a merger becomes beneeficial and the new "Google product" is sold a monopoly price, a better situation for A than in the absence of no sharing. Google may need to give a transfer to A ex-ante to induce sharaing. We characterize the optimal sharing level and show that while sharing will reduce the extned of inefficient mergers, it may not be able to do so perfectly because after sharing the surplus when there is competition is lower than in the ex-ante stage, hence the total net surplus from a merger is higher ex-post than ex-ante. [[Do we have a good definition of efficiency?]]

These initial results are obtained in the absence of an antitrust oversight. If an antitrust authority must approve a merger, new effects arise. In particular, following sharing of data,

and having itself a more precise information about the synergies between Google and A, the

regulator should be more reluctant to autorise the merger because head-to-head competition

would be more intense than in the absence of sharing. This suggests that the firms will be more

reluctant to share information. We show that this intuition is deceptive. The cost of exploration

(the ability to learn synergies from the data shared) is indeed key. This cost shapes the optimal

level of information sharing in the absence of the regulator, in particular where this benchmark

level is inferior to the ratio of the value to consumers when A sells to the maximum value to

consumers when Google sells the product. The presence of a regulator will reduce the level of

sharing if, and only if, the no-regulator-sharing is inferior to this ratio.

Extensions: TBD

1 Concrete examples

• Microsoft/Discord

• pre merger information sharing

Altice/OTL The FCA found that Altice and SFR engaged in an extensive exchange of com-

mercially sensitive information (including individualised trade data and future forecasts)

Commission fines Altice €125 million for breaching EU rules and controlling PT Portugal

before obtaining merger approval Altice received detailed commercially sensitive informa-

tion about PT Portugal outside the framework of any confidentiality agreement.

Gun-jumping examples

• Acquisition failures:

ebay/skype: lack of complementarity

google/motorola: android bugs on device

sprint/nextel lack of common culture

Tesla/Apple

• Regulator forbids merger:

Aurobindo/sandoz

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 Profit sharing mechanisms between two firms: Politics, Science and the Remarkable Race for a Coronavirus Vaccine.

2 Literature

2.1 Competition and mergers in the digital economy

Several reports have recently reconsidered competition policy for the digital era (Federico et al., 2019). While Scott Morton et al. (2019) and Shapiro (2019) call for a tightening of merger policy to fight abuses of dominant position, Cabral (2021) make a cautionary call not to discourage innovation. In this hot debate, data stands out as the cornerstone of competition in the digital economy, as the success of digital companies is largely built upon the collection, use, sharing and sale of huge amounts of consumer data (Varian, 1989; Bergemann and Bonatti, 2015). Data is a competitive asset (Hagiu and Wright, 2020), and because of the non-rival nature of information, firms are reluctant to share data with their competitors. As Jones and Tonetti (2020) argue, companies rather try to prevent competitors from accessing their data in order to keep a strong data competitive advantage over a market. By securing exclusive access to high quality relevant data, companies such as Facebook and Google have managed to dominate digital markets.

The literature thus sees information sharing between companies as a way to promote competition in digital markets (Martens et al., 2020). Tirole (2020) and Crémer et al. (2019) among others suggest to ensure fair and equal access to information between firms following FRAND licensing terms. By doing so, firms would equally access data and compete on a level playing field.

In a race to data dominance, digital companies have engaged in an important merger wave. Mergers are now data driven, and recent articles have analyzed how acquiring a firm's data set has recently become a motivation for mergers and acquisitions (Stucke and Grunes, 2016). For instance, the European Commission investigated whether information synergies were possible in the acquisition of WhatsApp by Facebook (Argentesi et al., 2019). More recently, the European

¹Practices of information sharing have been well analyzed in economics (Vives, 1984; Gal-Or, 1986), and it is acknowledged that sharing information can have pro or anti competitive effects, in particular depending on the nature of competition (cournot vs bertrand).

²This suggestions also echoes Admati and Pfleiderer (2000) who analyze the importance of the disclosure of financial information by firms.

³Facebook lied to the Commission by claiming that data sets owned by the two companies were impossible to merge, and the Commission eventually fined Facebook for concealing the potential for information synergies

Commission gave its green light for Google to acquire Fitbit - a fitness company specialized wearable devices that collect health related individual data - under the condition that data from both companies would not be merged, as it would result in information synergies that may end up harming consumers. Additionally, Microsoft has recently been pointed out for willing to acquire the large consumer base of Discord, and the related consumer data.⁴

2.2 Mergers and synergies

Synergies resulting from mergers and acquisitions have been extensively studied in the literature.⁵ Chatterjee (1986) distinguishes three types of synergies: financial, operational, and collusive. He shows that collusive synergies are associated with the highest value from a merger, while operational are associated with the lowest values. Nevertheless, Mukherjee et al. (2004) report that operational synergies are given by firms as the main reason to merge. Gupta and Gerchak (2002) quantify operational synergies and highlight the importance of production characteristics of the acquirer and of the target for synergies to arise. Larsson and Finkelstein (1999) highlight the importance of common culture between two companies for a merger to succeed. They show that synergy realization is a function of the similarity and complementarity of the two merging businesses, and of the extent of interaction and coordination during the organizational integration process. Madura and Ngo (2008) shows that the valuation of synergies by companies and markets is based on synergies measured in recent takeover in the same industry.

The above literature does not consider information synergies, probably because data has become essential for many business models only recently. With respect to the recent transformations of most industries for which data is close to become an essential facility, the study of information synergies has become an important question to tackle. Moreover, our approach can be seen as a natural followup of the above literature as information synergies naturally arise depending on the complementarity of data sources. Daley and Green (2020) show that firms want to acquire information before acquiring a startup, but that it is in general inefficient. We will show that with respect to information synergies, a firm has incentives to learn the potential

of the merger (Commission fines Facebook €110 million for providing misleading information about WhatsApp takeover, last accessed 04/12/2021).

⁴Microsoft/Discord

⁵Damodaran (2005) reviews different types of synergies considered in the literature and assesses what issues can emerge from misperceptions of the benefits from different synergies.

for complementarity before engaging a data driven merger.

2.3 Information synergies

To the best of our knowledge, the literature does not analyze information synergies as a motivation for firms to engage in a merger. Nevertheless, the literature on information theory has for long acknowledged the importance of information synergies. A recent trend of the literature has focused in particular on quantifying unique, redundant, and synergistic information when considering two data sets. For instance, Bertschinger et al. (2014), Griffith and Koch (2014), and Olbrich et al. (2015) discuss how information synergies can arise when merging two data sets. This literature is the theoretical starting point of our interest for information synergies during mergers. Moreover, Sootla et al. (2017) empirically measure the synergistic coefficient of two data sets. This last paper will support several hypothesis that we use in our model. In particular, it justifies our approach where synergies are learnt when data sets are merged.

2.4 Sale of information, sale of technology

This paper is closely related to the literature on the sale of technology. d'Aspremont et al. (2000) focus on a problem in which a seller can disclose verifiable knowledge that is used for contracting. Anton and Yao (2002) analyze how an inventor can disclose part of its innovation to a prospective buyer in order to reveal its quality. We adopt the common view that shared information can be used by the receiver to compete with the sender, following the well known Arrow information paradox. However, our paper differs from the literature on licensing as we consider both firms endowed with data, and we are interested in the synergistic value from combining both data sets.

2.5 Mergers vs competition

Our paper also relates to the relation between market competition and firms' incentives to merge, which has been under the spotlight of competition authorities for several decades now, and has been recently reignited by concerns over so called killer acquisitions (Cunningham et al., 2019). Kamepalli et al. (2020) show that such killer acquisition do not foster innovation and competition through more market entry. Contrary to the standard view of this literature, competition in our

approach won't be used as a motivation for a firm to merge, but will be used by the acquirer to lower the profits of its target, and in turn to lower the price of the acquisition.

A recent literature has also analyzed the competitive impacts of data driven mergers. De Corniere and Taylor (2020) characterize when data is pro or anti competitive. Chen et al. (2020) show that data driven mergers increase consumer surplus as long as there are still competitors in the market. Chirita (2018) calls for accounting for potential privacy loss when assessing the impacts of data driven mergers.

Optimal merger policy when firms have private information Besanko and Spulber (1993). Startups and upstarts Awaya and Krishna (2021).

3 Model

- There are two firms, indexed by 1,2, where 2 is a dominant firm (Google) and 1 is a firm that has developed a new product of platform and has a stock of data of mass 1 generated by this activity. Firm 1 is able to give a utility level of u to its customers and absent other competition can fix a price equal to u, making a profit of u (assume a mass one of customers interested by the product.)
- Firm 2 has developed other products and has its own stock of data. Combining data from 1 and 2 will enhance the value to customers to $v \in \{\underline{v}, \overline{v}\}.$
- The value of v is unknown to firms, but each firm knows that $v = \underline{v}$ w.p. α , and $v = \overline{v}$ w.p. 1α .
- Treating data to identify and generate synergies is costly, it requires for instance the development of new algorithms or code, further marketing efforts. Let e be this cost.

No sharing

- Firm 1 can share s% of its data with firm 2, possibly at an agreed upon price T(s): at this time of sharing, firms 1, 2 only know that v follows probability α . Upon receiving s, firm 2 can
 - either exerts effort e at cost -e, in which case the synergy v is learned with probability 1 if $e \ge c(s)$, and with probability zero otherwise. To simplify, synergies are learnt by

both firms, the case where firm 2 gets this information privately is for an extension. In case synergy is known firms and consumers know that the product provides value vs to customers if a share s of the data of firm 1 is used.⁶

- If v is known, Firm 2 can then make a TIOLI offer to firm 1 for creating a merger, or can choose to use the information to compete with firm 1. If there is a merger customers will have value v (since all data from firm 1 is part of the assets of the merged firm). If there is not a merger, firm 2 has a product competing with that of firm 1 that provides value vs to customers.
- Exploitation cost $c(s) = c \cdot (1/s 1)$ decreases with $s: c \ge 1$ c(1) = 0, $c(0) = +\infty$, and $c'(0) = -\infty$. This cost function follows the idea that one can always do at least as good with more data than with fewer. With ϵ data, it is infinitely costly to learn v. Focusing on $c \ge 1$ simplifies the analysis and ensures the concavity of the profit function in the case with the regulator.
- In equilibrium firm 2 will either invest e = c(s) and learn the value of the synergy, or not invest and remain uninformed.
- If firm 1 does not share data, merger may happen under imperfect information.
- A regulator maximizes a social welfare function finding a tradeoff between the consumer surplus weighted by 1ρ and industry profits weighted by ρ . There is some uncertainty on ρ : the regulator observes a draw ρ from a uniform distribution $U(\rho)$ on [0,1]. This uncertainty is resolved only at the time the regulator evaluates the merger proposal, that is after s has been shared and firms engage a merger: conditional on observing s, both firms decide to approach the regulator to authorize the merger.
- In an extension we analyze whether the regulator wants to allow or forbid pre-merger information sharing.

The timing of the game is the following:

- Stage 1: firm 2 either remains uninformed, or purchases s information from firm 1 for transfer T(s), invests e = c(s) and learns v.

⁶Remember that consumers always know the value of a product as soon as it is on the market.

- Stage 2: firm 2 makes a take it or leave it offer to acquire firm 1. If firm 1 declines the offer, firms compete.
- Stage 3: firms go to the regulator to have the merger allowed, the regulator learns ρ and decides to allow or prevent the merger.
- Stage 4: depending on the regulator's decision, firms compete or merge and make profits.

The following hypothesis are important elements of the analysis:

- H1: when a product is on the market, consumers know their valuation immediately. This holds even if firms do not know the quality of the product at the time they launch it.
- H2: there exists a minimum effort c(s) below which exploiting the data does not reveal its synergistic value v, and above which, v is known.
- H3: only firm 2 can purchase information and experiment.
- H4: $u \ge 2\underline{v}$.
- H5: product quality after a merger can decrease: $\underline{v} \leq u$

Justifications:

Assumption H1 is supported by the important literature on pricing of information goods (Shapiro et al., 1998) that shows how consumers have access to many ways to discover their valuation of a product before acquiring it, through sampling, free downloading, freemium, rating and reviews. It allows to avoid price signaling strategies.

Assumption H4 simplifies the cases to consider: only with type \overline{v} will firm 2 engage in a merger. This assumption is reasonable as it accounts in particular for $\underline{v} = 0$. Without this assumption, it would sometimes be profitable for firm 2 to acquire firm 1 even when synergies are low.

H5: When firm 2 purchases firm 1, it may not be able to get the same value form its product. This is supported by reputation effects such as in the GitHub acquisition by Microsoft: the developer community got concerned by the acquisition, and the reputation of GitHub is reduced because it was purchased by Microsoft. The acquisition benefited to competing service Gitlab

even though GitHub services remained identical. This change of the value of a product after an acquisition is supported by the literature on reputation effects (Tadelis, 1999)

4 Analysis

4.1 Competition

Suppose that firm 1 shares s > 0, and let us ignore for the moment the possibility of a merger. If firm 2 invests c and learns v, it can provide its customers a value vs while firm 1 can provide a value u. Assuming Bertrand competition the equilibrium price paid by the consumers and the profit per consumer are

(1)
$$\begin{cases} p = vs - u, \ \pi_1(v, s) = 0, \ \pi_2(v, s) = vs - u & \text{if } vs - u \ge 0 \\ p = u - vs \ \pi_1(v, s) = u - vs, \ \pi_2(v, s) = 0 & \text{if } vs - u \le 0. \end{cases}$$

If firm 2 does not invest, its profit per consumer is equal to zero, that of firm 1 is equal to u and synergies are not learned.

4.2 Merger

Suppose that no data is shared. At the time of the merger the expected value is equal to u and the merged firm has access to the full stock of data s=1 that it can exploit at cost c(1)=0. Therefore, the expected value if there is no investment is equal to u and is equal to $\mathbb{E}[v]=\alpha \underline{v}+(1-\alpha)\overline{v}$ if there is investment. The value of the merger is therefore

$$max\{u, \mathbb{E}[v]\}$$

The merged firm over-invest when v < u. Note that $\underline{v} < u$, which reflects the fact that destructive synergies can occur down to a point where the value to customer is lower when the merged firm [12] offers the product than with firm 1 only. This illustrates well potential negative reputation effects (in particular privacy related) that occur in Big Tech acquisitions such as Facebook/Whatsapp or Microsoft/GitHub.

Moreover, $\overline{v} > u$.

4.3 Profits with data sharing

Suppose firm 1 shares s with firm 2, and that firm 2 agrees to pay T(s) to firm 1 for this amount of data.

Upon receiving s, firm 2 can decide to invest c(s) in order to learn v. In this case, the two firms anticipate payoffs $\pi_i(v,s)$ as given by (1) if there is no merger. Firm 2 can make a TIOLI offer to buy firm 1's asset at a price p(v,s) that will make firm 1 indifferent between merging and not merging, that is

(2)
$$p(v,s) := \pi_1(v,s).$$

• With probability α , $v = \underline{v} < u$:

$$- \pi_1(\underline{v}, s) = u - \underline{v}s;$$

$$- \pi_2(\underline{v}, s) = 0;$$

• With probability $1 - \alpha$, $v = \overline{v} > u$:

- If
$$s \leq \frac{u}{\overline{v}}$$
:

*
$$\pi_1(\overline{v},s) = u - \overline{v}s;$$

*
$$\pi_2(\overline{v},s)=0$$
;

* Firm 2 proposes to merge and $p(\overline{v}, s) = u - \overline{v}s$

- If
$$s \geq \frac{u}{\overline{v}}$$
:

*
$$\pi_1(\overline{v},s)=0$$
;

*
$$\pi_2(\overline{v},s) = \overline{v}s - u;$$

* Firm 2 proposes to merge and $p(\overline{v}, s) = 0$

In this case, the expected payoff of firm 1 from sharing s information is:

• If $s \leq \frac{u}{\overline{v}}$, firm 2 pays a positive price to firm 1 for the merger when $v = \overline{v}$:

$$\pi_1(s) = \alpha(u - \underline{v}s) + (1 - \alpha)(u - \overline{v}s) + T(s)$$

and
$$T(s) = \mathbb{E}[v]s$$

 $\bullet \ \mbox{ If } s \geq \frac{u}{\overline{v}}, \mbox{ firm 2 acquires firm 1 for a zero price:}$

$$\pi_1(s) = \alpha(u - vs) + T(s)$$

and
$$T(s) = u - \alpha(u - \underline{v}s)$$

The expected payoff of firm 2 of paying T(s) to get s and investing c(s) following sharing of data and learning v is:

• For $s \leq \frac{u}{2}$, $T(s) = \mathbb{E}[v]s$:

$$\pi_2(s) = (1 - \alpha)(\overline{v}(1+s) - u) - c(s) - \mathbb{E}[v]s.$$
$$= (1 - \alpha)(\overline{v} - u) - \alpha \underline{v}s - c(s).$$

• For $\frac{u}{\overline{v}} \leq s$, firm 2 acquires firm 1 for a zero price if $v = \overline{v}$, $T(s) = u - \alpha(u - \underline{v}s)$:

$$\pi_2(s) = (1 - \alpha)\overline{v} - c(s) - u + \alpha(u - \underline{v}s).$$
$$= (1 - \alpha)(\overline{v} - u) - \alpha vs - c(s).$$

4.4 Information acquisition

We analyze whether it is profitable for firm 2 to purchase information from firm 1, and we characterize the optimal information sharing. The alternative for firm 2 is not to purchase data, and to merge under imperfect information. In this case, firm 2 makes a TIOLI offer to buy firm 1 at price u and firm 2 makes profit $w(0) := \mathbb{E}[v] - u$. We show that the optimal sharing can dominate no sharing for firm 2.

Consider first the case where E[v] < u: information sharing is profitable if $\pi_2(s) = (1 - \alpha)(\overline{v} - u) - \alpha \underline{v}s - c(s) \ge 0$. We find the optimal value of information sharing s^* in this case, which satisfies:

(3)
$$\alpha \underline{v} = -c'(s^*)$$
$$\implies s^* = \sqrt{\frac{c}{\alpha \underline{v}}}$$

$$\pi_2(s) = (1-\alpha)(\overline{v}-u) - 2\sqrt{c\alpha v} + c$$

Optimal information sharing s^* decreases with $\alpha \underline{v}$, as the expected loss of firm 1 in case synergies are low, which is charged to firm 2 at the data acquisition stage, is larger and thus the price of information is higher. On the contrary, when c decreases, the data exploitation cost decreases as well and the benefits for firm 2 of lowering the cost by purchasing more information decrease.

The profitability of partial information sharing thus depends on the variations of the data exploitation cost function. If c(s) decreases quickly, partial information sharing is more profitable than merging under imperfect information. On the contrary, if the data exploitation cost is high, firm 2 does not exploit data and merger occurs without information.

Consider now the case where $E[v] \ge u$. The optimal amount of information satisfies the same condition as above. Partial information sharing is optimal under the condition that:

(4)
$$\pi_2(s^*) - \pi_2 \ge 0$$

$$\implies (1 - \alpha)(\overline{v} - u) - \alpha \underline{v}s - c(s^*) \ge \alpha \underline{v} + (1 - \alpha)\overline{v} - u$$

$$\implies \alpha u \ge \alpha \underline{v}(1 + s^*) + c(s^*)$$

As we have assumed that $u \geq 2\underline{v}$, this condition is satisfied for s = 1, and thus it is always satisfied at s^* , and information sharing is always optimal when $E[v] \geq u$.

This leads us to the following proposition:

Proposition 1.

- (a) When $E[v] \ge u$ bilateral information sharing is optimal, as .
- (b) When $E[v] \le u$ firms share information when $(1 \alpha)(\overline{v} u) + c \ge 2\sqrt{c\alpha v}$.
- (c) Information sharing allows efficient mergers to take place especially when firms initially prefer not to merge $(\mathbb{E}[v] < u)$.

Firm 2 choose to purchase information for a low data exploitation cost because it allows to identify cases where the merger is destructive. Even if firm 2 incurs a loss $c(s) \ge 0$ from learning v with partial information s (versus merging and investing c(1) = 0), learning v allows firm 2 not to engage in inefficient mergers.

The price paid by firm 2 to acquire information s covers the expected loss of firm 1 from increased competition if firm 2 exploits the data. After information is shared, firm 2 can compete with firm 1 if the merger does not take place, which exerts a pressure on firm 1 and lowers the price of the acquisition.

5 The Regulator's Problem

We consider now a regulator who chooses whether to allow the merger or not. The regulator maximizes a social welfare function that weights the social cost of high industry profits and the social benefit of synergies. Contrary to the usual view that synergies are created only during the merger, synergies endogenously happen without a merger if firm 1 shares some of its data with firm 2. Hence, when evaluating a merger proposal, the regulator will compare the relative industry gain weighted by $1 - \rho$ to the relative gain of consumer surplus weighted by ρ .

- Industry profits is equal to:
 - -u if there is no information sharing and no merger
 - $max\{u vs, vs u\}$ if firms compete
 - -v if firms merge
- Consumer surplus is equal to:
 - zero if the firm is in monopoly and there is full surplus extraction, that is, no sharing occurs.
 - $-\min\{u,vs\}$ if information has been shared and firms compete.

The weight ρ that the regulator puts on consumer surplus follows a distribution $F(\rho)$.

5.1 Merger decision without information sharing

We analyze the decision of the regulator to allow or prevent a merger when no information has been shared. In this case, consumer surplus does not change as competition never occurs, and only the gains of the industry are considered: $(1 - \rho)(v - u)$ For $v = \overline{v} \ge u$, without information sharing merger is always beneficial from the regulator's point of view: since firms do not compete, there is no loss of surplus for consumers, and there is a social benefit from synergy gains.

On the opposite, for $v = \underline{v} \le u$, without information sharing merger is never beneficial from the regulator's point of view.

Without information sharing, there is imperfect information on v and the regulator allows the merger if $\mathbb{E}[v] \geq u$ and prevents it if $\mathbb{E}[v] \leq u$.

5.2 Social welfare with information sharing

At the time the regulator has to evaluate a merger, firm 1 has already shared s with firm 2 and both firms and the regulator know the value of v. If $v = \underline{v}$, firm 2 does not propose to merge and exerts a competitive pressure on firm 1. If $v = \overline{v}$, under competition firms lower their prices providing consumers with surplus equal to $\min\{u, \overline{v}s\}$, which is lost to consumers if the regulator allows the merger. On the other hand, the industry gain is $(1 - \rho)(\overline{v} - \max\{u - \overline{v}s, \overline{v}s - u\})$. Hence the welfare gain from the merger is

$$(1-\rho)(\overline{v}-\max\{u-\overline{v}s,\overline{v}s-u\})-\min\{u,\overline{v}s\}\rho$$

The probability that the merger is authorized depends on the share s:

If $s \leq \frac{u}{\overline{v}}$, the regulator authorizes the merger if

(5)
$$\rho \le \rho^*(s) := \frac{\overline{v}(1+s) - u}{\overline{v}(1+2s) - u}$$

In order to characterize the variations of ρ^* with respect to s we compute its derivative:

$$\frac{\partial \rho^*(s)}{\partial s} := -\frac{\overline{v}(\overline{v} - u)}{(\overline{v}(1 + 2s) - u)^2}$$

If $s \geq \frac{u}{\overline{v}}$, the merger is authorized for

(6)
$$\rho \ge \rho^*(s) := \frac{\overline{v}(1-s) + u}{\overline{v}(1-s) + 2u}$$

Again we compute the derivative of ρ^* with respect to s:

$$\frac{\partial \rho^*(s)}{\partial s} := -\frac{\overline{v}u}{(\overline{v}(1-s)+2u)^2}$$

The probability that a merger is allowed decreases ($\rho^*(s)$ decreases) with s. Indeed, more information sharing implies that firms compete more fiercely, which benefits consumers. The opportunity cost of a merger is thus larger for higher values of s and merger is beneficial only if ρ is large enough. Note that the merger is always authorized for s = 0.

Information sharing can lead the regulator to prevent efficient mergers $(v = \overline{v} \ge u)$ when $\rho \le \rho^*(s)$, because without merger, firms compete, which benefits consumers through an increase of their surplus.

We assume that ρ follows a uniform distribution over [0, 1], and at the ex-ante stage when firms share information, the probability that a merger will be approved when firm 1 shares swith firm 2 is then equal to:

$$a(s) := \rho^*(s).$$

5.3 Information acquisition

We analyze how the presence of the regulator and the possibility that it prevents the merger impact the incentives of firm 2 to purchase information from firm 1.

Consider the expected profits of firm 2 when purchasing an amount s of information:

- When $v = \underline{v}$ (w.p. α) firm 2 makes zero profits;
- When $v = \overline{v}$ (w.p. 1α) firm 2 makes an offer to firm 1;
 - If $s \leq \frac{u}{\overline{v}}$
 - * With probability a(s) the merger is authorized and expected profits are equal to

$$(1-\alpha)(\overline{v}(1+s)-u)$$

- * With probability 1-a(s) the merger is prevented, firms compete and the expected profits of firm 2 are equal to zero.
- $\text{ If } s \geq \frac{u}{\overline{v}}$
 - * With probability a(s) the merger is authorized and expected profits are

$$(1-\alpha)\overline{v}$$

* With probability 1-a(s) the merger is prevented and the expected profit is equal to

$$(1-\alpha)(\overline{v}s-u)$$

Overall the expected profit of firm 2 from purchasing s information is: If $s \leq \frac{u}{n}$:

(7)
$$\pi_{2r}(s) = a(s)(1-\alpha)(\overline{v}(1+s)-u) - T(s) - c(s)$$

The expected payoff of firm 1 when providing firm 2 with information is:

$$w_1(s) = T(s) + \alpha(u - \underline{v}s) + (1 - \alpha)(u - \overline{v}s)$$

and the price paid by firm 2 for information is:

$$T(s) = \mathbb{E}[v]s$$

and

(8)
$$\pi_{2r}(s) = (1 - \alpha)a(s)(\overline{v}(1+s) - u) - \mathbb{E}[v]s - c(s)$$
 If $s \ge \frac{u}{\overline{v}}$:

(9)
$$\pi_{2r}(s) = (1 - \alpha)[a(s)\overline{v} + (1 - a(s))(\overline{v}s - u)] - T(s) - c(s)$$

The expected payoff of firm 1 when providing firm 2 with information is:

$$w_1(s) = T(s) + \alpha(u - \underline{v}s)$$

and the price paid by firm 2 for information is:

$$T(s) = u - \alpha(u - \underline{v}s)$$

Thus the expected payoff of firm 2 is:

(10)
$$\pi_{2r}(s) = (1 - \alpha)[a(s)\overline{v} + (1 - a(s))(\overline{v}s - u) - u] - \alpha \underline{v}s - c(s)$$

5.3.1 Optimal information sharing

If $s \leq \frac{u}{\overline{v}}$:

(11)
$$\pi_{2r}(s) = (1 - \alpha)a(s)(\overline{v}(1+s) - u) - \mathbb{E}[v]s - c(s)$$

We first show that profits are concave on $[0, \frac{u}{2}]$

(12)
$$\rho^*(s) = \frac{\overline{v}(1+s) - u}{\overline{v}(1+2s) - u}$$
$$\rho'^*(s) = -\frac{\overline{v}(\overline{v} - u)}{(\overline{v}(1+2s) - u)^2}$$
$$\rho''^*(s) = \frac{2\overline{v}^2(\overline{v} - u)}{(\overline{v}(1+2s) - u)^3}$$

$$\pi_{2r}''(s) = (1 - \alpha)(a(s)''(\overline{v}(1+s) - u) + 2a'(s)\overline{v}) - c''(s)$$

$$= (1 - \alpha)[\rho''^*(s)(\overline{v}(1+s) - u) + 2\rho'^*(s)\overline{v}] - c''(s)$$

$$= (1 - \alpha)[\frac{2\overline{v}^2(\overline{v} - u)(\overline{v}(1+s) - u) - 2\overline{v}^2(\overline{v} - u)(\overline{v}(1+2s) - u)}{(\overline{v}(1+2s) - u)^3}] - c''(s)$$

$$= (1 - \alpha)\frac{-2\overline{v}^3(\overline{v} - u)s}{(\overline{v}(1+2s) - u)^3} - c''(s)$$

Thus $\pi_{2r}''(s) < 0$, π_{2r} is strictly concave and there is at most one maximum on $[0, \frac{u}{\overline{v}}]$.

(14)
$$\pi'_{2r}(s) = (1 - \alpha)[a'(s)(\overline{v}(1+s) - u) + (a(s) - 1)\overline{v}] - \alpha \underline{v} - c'(s)$$

Thus, $\pi'_{2r}(0) > 0$ and

as

$$\rho'^*(u/\overline{v}) = -\frac{\overline{v}(\overline{v} - u)}{(\overline{v} + u)^2}$$

$$\rho''^*(u/\overline{v}) = \frac{4\overline{v}^2(\overline{v} - u)}{(\overline{v} + u)^3}$$

we have

(15)
$$\pi'_{2r}(u/\overline{v}) = a'(u/\overline{v})(1-\alpha)\overline{v} - (1-a(u/\overline{v}))(1-\alpha)\overline{v} - \alpha\underline{v} - c'(u/\overline{v})$$
$$= (1-\alpha)\left[-\frac{\overline{v}^2(\overline{v}-u)}{(\overline{v}+u)^2} - \frac{\overline{v}u}{\overline{v}+u}\right] - \alpha\underline{v} - c'(u/\overline{v})$$
$$= (1-\alpha)\frac{-\overline{v}^3 - \overline{v}u^2}{(\overline{v}+u)^2} - \alpha\underline{v} + \frac{\overline{v}^2}{u^2}c$$

Let's denote:

$$c_0 = \frac{u^2}{\overline{v}^2} (1 - \alpha) \frac{\overline{v}^3 + \overline{v}u^2}{(\overline{v} + u)^2} + \frac{u^2}{\overline{v}^2} \alpha \underline{v}$$

If $c \ge c_0$, $\pi_{2r}(s)$ is strictly increasing over $[0, u/\overline{v}]$. If $c \le c_0$, $\pi_{2r}(u/\overline{v}) < 0$ and there is a local maximum on $[0, u/\overline{v}]$.

If $s \geq \frac{u}{\overline{v}}$:

(16)
$$\pi_{2r}(s) = (1-\alpha)[a(s)\overline{v} + (1-a(s))(\overline{v}s - u) - u] - \alpha \underline{v}s - c(s)$$

(17)
$$\rho^*(s) = \frac{\overline{v}(1-s) + u}{\overline{v}(1-s) + 2u}$$

$$\rho'^*(s) = -\frac{\overline{v}u}{(\overline{v}(1-s) + 2u)^2}$$

$$\rho''^*(s) = -\frac{2\overline{v}^2u}{(\overline{v}(1-s) + 2u)^3}$$

We first show that $\pi_{2r}(s)$ is strictly concave over $[u/\overline{v}, 1]$:

$$\pi_{2r}''(s) = (1 - \alpha)[a''(s)(\overline{v}(1 - s) + u) - 2a'(s)\overline{v}] - c''(s)$$

$$= (1 - \alpha)[\rho''^*(s)(\overline{v}(1 - s) + u) - 2\rho'^*(s)\overline{v}] - c''(s)$$

$$= (1 - \alpha)[\frac{-2\overline{v}^2u(\overline{v}(1 - s) + u) + 2\overline{v}^2u(\overline{v}(1 - s) + 2u)}{(\overline{v}(1 - s) + 2u)^3}] - c''(s)$$

$$= (1 - \alpha)\frac{2\overline{v}^2u}{(\overline{v}(1 + 2s) + 2u)^3} - c''(s)$$

As we focus on $c \ge 1$, $\pi_{2r}(s)$ is concave⁷ and has at most one maximum.

We now consider $\pi'_{2r}(s)$ at $s = u/\overline{v}$ and s = 1

⁷We have $(1 - \alpha) \frac{2\overline{v}^2 u}{(\overline{v}(1+2s)+2u)^3} < \frac{2c}{s^2}$.

(19)
$$\pi'_{2r}(s) = (1 - \alpha)[a'(s)(\overline{v}(1 - s) + u) + (1 - a(s))\overline{v}] - \alpha \underline{v} - c'(s)$$

Consider first the slope of the profit function at u/\bar{v}

(20)
$$\pi'_{2r}(u/\overline{v}) = a'(u/\overline{v})(1-\alpha)\overline{v} + (1-a(u/\overline{v}))(1-\alpha)\overline{v} - \alpha\underline{v} - c'(u/\overline{v})$$
$$= (1-\alpha)(-\frac{\overline{v}^2 u}{(\overline{v}+u)^2} + \frac{\overline{v}u}{\overline{v}+u}) - \alpha\underline{v} - c'(u/\overline{v})$$
$$= (1-\alpha)\frac{\overline{v}u^2}{(\overline{v}+u)^2} - \alpha\underline{v} + \frac{\overline{v}^2}{u^2}c$$

Let's denote

$$c_1 = \frac{u^2}{\overline{v}^2} (1 - \alpha) \frac{-\overline{v}u^2}{(\overline{v} + u)^2} + \frac{u^2}{\overline{v}^2} \alpha \underline{v}$$

If $c \ge c_1$, $\pi'_{2r}(u/\overline{v}) \ge 0$ and profits increase at u/\overline{v} . If $c \le c_1$, profit decrease at u/\overline{v} .

It is easy to show that $c_0 > c_1$.

(21)
$$\pi'_{2r}(1) = (1 - \alpha)[a'(1)u + (1 - a(1))\overline{v}] - \alpha\underline{v} - c'(1)$$
$$= (1 - \alpha)\frac{\overline{v}}{4} - \alpha\underline{v} + c$$

Let's denote

$$c_2 = \alpha \underline{v} - (1 - \alpha) \frac{\overline{v}}{4}$$

If $c \le c_2$, there is a negative slope at s = 1 and there is an interior solution. Else, the locally optimal amount of information shared is s = 1.

Thus the different cases that occur depending on the value of c are summarized in Figures 1 when $c \le c_2$ and in Figure 2 when $c \ge c_2$. Note that when $c_1 \le c \le c_0$ the global maximum can be on $[0, u/\overline{v}]$ or on $[u/\overline{v}, 1]$.

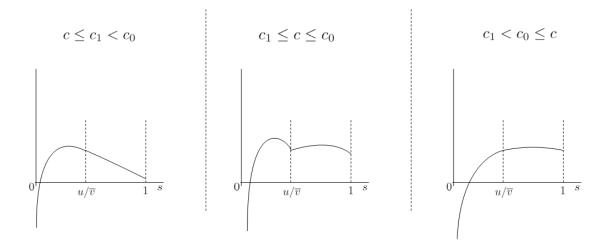


Figure 1: Profits with regulator: interior solutions

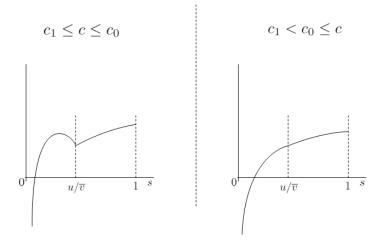


Figure 2: Profits with regulator: corner solutions

The data processing cost is key to understand the effect of the regulator on information sharing. Low processing costs will make it less profitable to share more information, and firm 2 will optimally purchase $s \in [0, u/\overline{v}]$. High processing costs will give incentives to firm 2 to purchase more, and will add a new effect to information sharing: in case the merger is declined, the higher the s the higher the profits of firm 2 under competition.

5.3.2 Does the presence of the regulator drive up or down consumer information sharing?

If $s \leq \frac{u}{\overline{v}}$:

(22)
$$\pi'_{2r}(s^*) = (1 - \alpha)[a'(s^*)(\overline{v}(1 + s^*) - u) + (a(s^*) - 1)\overline{v}] < 0$$

Thus if there is a maximum on $[0, u/\overline{v}]$, the optimal amount of data shared is smaller than without a regulator.

If $s \geq \frac{u}{\overline{v}}$:

(23)
$$\pi'_{2r}(s^*) = (1 - \alpha)[a'(s^*)(\overline{v}(1 - s^*) + u) + (1 - a(s^*))\overline{v}]$$
$$= (1 - \alpha)(-(\overline{v}(1 - s^*) + u)\frac{\overline{v}u}{(\overline{v}(1 - s^*) + 2u)^2} + \frac{\overline{v}u}{(\overline{v}(1 - s^*) + 2u)})$$
$$= (1 - \alpha)\frac{\overline{v}u^2}{(\overline{v}(1 - s^*) + 2u)^2} \ge 0$$

In this case, firm 2 purchases more information from firm 1 than without the regulator.

To sum up there are two cases to consider: if $s \leq u/\overline{v}$, more information sharing decreases the exploitation costs but lowers the probability that the merger is accepted.

If $s \geq u/\overline{v}$ there is an additional positive effect of information sharing on the profits of firm 2: if the merger is prevented, the larger the s, the higher the profits of firm 2 under competition. With uniform distribution we can show that this second effect dominates the first one on $[u/\overline{v}, 1]$, and firm 2 purchases more information than without a regulator.

Proposition 2.

- When s* ∈ [0, u/v̄] the presence of the regulator reduces the amount of information shared in equilibrium.
- When s* ∈ [u/v̄, 1] the presence of the regulator increases the amount of information shared in equilibrium.

5.3.3 The impact of the regulator on consumer surplus.

Without regulator, when firm 2 purchases s^* of information, the expected consumer surplus is:

$$\alpha vs^*$$

Clearly consumer surplus surplus increases with s^* , as consumers benefit from higher competition between firms in case synergies are low and the merger does not occurs.

With the presence of a regulator, does firm 2 find it profitable to purchase s data? Yes if $\mathbb{E}[v] < u$ and

$$(1-\alpha)(\overline{v}-u) - \alpha vs \ge c(s)$$

or if $\mathbb{E}[v] \geq u$ and

$$\alpha(u - \underline{v}(1+s)) \ge c(s)$$

With the presence of a regulator, does firm 2 find it profitable to purchase s data? Yes if $\mathbb{E}[v] < u$ and

$$(1-\alpha)[a(s)\overline{v} + (1-a(s))(\overline{v}s - u) - \overline{v}s] - \alpha vs - c(s) > 0$$

or

$$(1-\alpha)[a(s)\overline{v} + (1-a(s))(\overline{v}s - u) - u) - \alpha vs - c(s) \ge 0$$

It is clear that the presence of the regulator can prevent firm 2 to purchase information while information sharing would be the optimal strategy without a regulator. In this case, the presence of the regulator harms consumers: as no information is shared, the expected surplus is $0 < \alpha \underline{v}s$.

If firm 2 purchases $s \in [u/\overline{v}, 1]$ data, $s > s^*$ and consumer surplus is equal to $\alpha \underline{v}s + (1 - a(s))u > \alpha \underline{v}s^*$. In this case the presence of the regulator increases consumer surplus.

If firm 2 purchases $s \in [0, u/\overline{v}]$ data, $s < s^*$ and consumer surplus is equal to $\alpha \underline{v} s + (1 - a(s)) \overline{v} s$. In this case the presence of the regulator has an ambiguous effect on consumer surplus.

Proposition 3.

- When $s^* \in [0, u/\overline{v}]$ the presence of the regulator has two opposite effects on consumer surplus:
 - Less data is shared than without a regulator, which decreases consumer surplus.
 - Mergers is prevented w.p. 1-a, even when synergies are high, which increases consumer surplus.
- When $s^* \in [u/\overline{v}, 1]$ the presence of the regulator always increases consumer surplus.

5.4 Regulating pre-merger information sharing

The regulator can allow or prevent firm 2 from purchasing information from firm 1 before sharing occurs. Before learning the value of ρ , the regulator compares social welfare with and without information sharing and chooses whether to allow firms to share.⁸

Without information sharing, either $\mathbb{E}[v] < u$, firms do not merge and the expected gain in social welfare is equal to zero. Information sharing either allows the merger to proceed, and in this case the gain in social welfare is equal to $\rho(\overline{v} - u)$. The merger is prevented if the social welfare is larger than with a merger, and $(1 - \rho) \min u, \overline{v}s + \rho(\max u - \overline{v}s, \overline{v}s - u) \ge \rho \overline{v}$.

If $\mathbb{E}[v] \geq u$, either the merger is allowed, and social welfare is equal to $\rho \overline{v}$, which is equal to welfare without information sharing. Or the merger is prevented because competition yields a larger welfare.

Thus information sharing is always beneficial for the regulator, as when choosing to allow or prevent the merger, the regulator can always allow it and reach a social welfare equal to the case without information sharing. The regulator thus guarantees that social welfare is at least as good with information sharing as without, and information sharing allows the regulator to prevent merger when competition is more beneficial.

Proposition 4.

A regulator always has interest to allow firm to share information.

⁸The regulator does not know ρ at the time of this decision for instance as ρ be market specific and the decision to allow information sharing or not is for all markets. Moreover, if the regulator allows or prevents information sharing while knowing ρ , this would send a signal to firm 2 on the value of ρ .

6 Bilateral information sharing

We have focused on the case where firm 2 purchases information from firm 1. In practice firms can also engage in bilateral sharing of information, which we analyze in this section.⁹ Bilateral information sharing is reminiscent of practices of cross licensing (Fershtman and Kamien, 1992).

6.1 Competition

Suppose now that firm 1 shares $s_1 \ge 0$ and firm 2 shares $s_2 \ge 0$, and let us ignore for the moment the possibility of a merger. If firm 2 invests c and learns v, it can provide its customers a value vs_1 . Again we assume that only firm 2 chooses whether to invest $c(s_1)$, and after the investment is made, both firms learn the synergy. In this case, firm 1 also learns v and it can provide its customers a value $u + \beta vs_2$. Assuming Bertrand competition, it follows that the equilibrium price paid by the consumers and the profit per consumer are

$$\begin{cases}
p = v(s_1 - \beta s_2) - u; \pi_1(v, s_1, s_2) = 0; \pi_2(v, s_1, s_2) = v(s_1 - \beta s_2) - u & \text{if } v(s_1 - \beta s_2) \ge u \\
p = u - v(s_1 - \beta s_2); \pi_1(v, s_1, s_2) = u - v(s_1 - \beta s_2); \pi_2(v, s_1, s_2) = 0 & \text{if } v(s_1 - \beta s_2) \le u.
\end{cases}$$

6.2 Profits with data sharing

Suppose firm 1 shares s_1 with firm 2, and that firm 2 shares s_2 with firm 1 in exchange of s_1 .

Upon receiving s_1 and s_2 , Firm 2 can decide to invest c(s) in order to learn v. In this case, the two firms anticipate payoffs $\pi_i(v, s_1, s_2)$ as given Eq. (29) if there is no merger. Firm 2 can make a TIOLI offer to buy firm 1's asset at a price $p(v, s_1, s_2)$ that will make firm 1 indifferent between merging and not merging, that is

(25)
$$p(v, s_1, s_2) := \pi_1(v, s_1, s_2).$$

If $\beta \leq 0$ data sharing by firm 2 reduces the profits of firm 1, which in turn has no incentives to share information. We consider $\beta \geq 0$ and we write $\delta s = s_1 - \beta s_2 \in [-\beta, 1]$.

• With probability α , $v = \underline{v} < u$:

- If
$$\underline{v}\delta s \leq u$$
:

⁹For instance Scaria et al. (2018) describes practices of information sharing between companies in Europe.

*
$$\pi_1(\underline{v}, \delta s) = u - \underline{v}\delta s;$$

*
$$\pi_2(\underline{v}, \delta s) = 0;$$

- If $\underline{v}\delta s \geq u$:

*
$$\pi_1(v, \delta s) = 0;$$

*
$$\pi_2(\underline{v}, \delta s) = \underline{v}\delta s - u;$$

- With probability 1α , $v = \overline{v} > u$:
 - If $\overline{v}\delta s \leq u$:

*
$$\pi_1(\overline{v}, \delta s) = u - \overline{v}\delta s;$$

*
$$\pi_2(\overline{v}, \delta s) = 0;$$

- If $\overline{v}\delta s \geq u$:

*
$$\pi_1(\overline{v}, \delta s) = 0;$$

*
$$\pi_2(\overline{v}, \delta s) = \overline{v}\delta s - u;$$

In this case, the expected payoff of firm 1 from sharing δs information is:

• If $\delta s \leq u/\overline{v}$:

$$\pi_1(\delta s) = \alpha(u - \underline{v}\delta s) + (1 - \alpha)(u - \overline{v}\delta s)$$

and necessarily firm 2 needs $\delta s \leq 0$ so that firm 1 accepts to share information.

• If $u/\overline{v} \le \delta s \le u/\underline{v}$:

$$\pi_1(\delta s) = (1 - \alpha)(u - \overline{v}\delta s)$$

and $\delta s < 0$, which is impossible as $\delta s \ge u/\overline{v}$.

• If $u/\underline{v} \leq \delta s$:

$$\pi_1(\delta s) = 0$$

and $\delta s < 0$, which is impossible as $\delta s \ge u/\underline{v}$.

Thus in equilibrium, bilateral information sharing can occur if $\delta s \leq 0$.

The expected payoff of firm 2 of sharing s_2 and investing $c(s_1)$ following sharing of data and learning v is:

$$\pi_2(s_1, s_2) = (1 - \alpha)(\overline{v} - u + \overline{v}(s_1 - \beta s_2)) - c(s_1).$$

with $s_2 \geq s_1$

6.3 Information acquisition

We analyze whether it is profitable for firm 2 to exchange bilateral information with firm 1, and we characterize the optimal information sharing. The alternative for firm 2 is to purchase data and make profits as described in Section 4.4. We show that bilateral sharing can dominate information purchasing for firm 2.

It is clear that $\pi_2(s_1, s_2)$ is maximized for the highest s_1 under the condition that $s_1 \leq \beta s_2$. If $\beta \leq 1$, $s_2 = 1$, $s_1 = \beta$ and

$$\pi_2(s_1, s_2) = (1 - \alpha)(\overline{v} - u) - c(\beta).$$

If $\beta \ge 1$, $s_2 = \frac{1}{\beta}$, $s_1 = 1$ and

$$\pi_2(s_1, s_2) = (1 - \alpha)(\overline{v} - u).$$

Let's compare profits in equilibrium under bilateral information sharing and information purchasing:

$$\pi_2(s^*) = (1 - \alpha)(\overline{v} - u) - 2\sqrt{c\alpha v} + c.$$

where
$$-2\sqrt{c\alpha\underline{v}} + c < \sqrt{c\alpha\underline{v}}$$
 as $s^* = \sqrt{\frac{c}{\alpha\underline{v}}} \le 1$.

Bilateral sharing is always more profitable than information purchasing if $\beta \geq 1$. Sharing information with firm 1 is a costless way to learn the synergies. In case synergies are low, no merger occurs and firm 2 has lost no money. In case synergies are high, firm 2 can acquire firm 1 at price u.

If $\beta \leq 1$, bilateral information sharing is more profitable than information purchasing iff $\sqrt{c} \leq 2\beta\sqrt{\alpha v}$. That is, if $\beta \geq \beta_0 = \sqrt{\frac{c}{4\alpha v}}$.

Similarly to information purchasing, there are two opposite effects of bilateral information sharing on the profits of firm 2. On the one hand, bilateral information sharing allows firm 2 to incentivize firm 1 to share information without money transfer. In turn, the higher s_1 the lower the data exploitation cost and the higher the benefits of firm 2 from avoiding low efficiency mergers. On the other hand, s_2 must be large enough to cover the loss of firm 1 due to competition in case merger does not occur, which increases the price firm 2 has to pay to acquire firm 1.

This leads us to the following proposition:

Proposition 5.

Bilateral information sharing yields higher profits than information purchasing if the information shared by firm 2 is profitable enough for firm 1, i.e., if $\beta \geq \beta_0$.

If $\beta \geq 1$, bilateral information sharing yields the same profits for firm 2 as if there was no information asymmetry at the beginning of the game.

6.4 Social welfare

We compare social welfare under information purchasing with welfare under bilateral information sharing. For simplicity we focus on $\beta \geq 1$, and bilateral information sharing is always more profitable for firm 2 and yields the highest possible outcome.

If $v = \underline{v}$ firm 2 does not acquire firm 1 and social welfare is equal to:

$$(1-\rho)u + \underline{v}\rho$$

with bilateral information sharing, and to

$$(1-\rho)(u-\underline{v}s^*)+\underline{v}s^*\rho$$

with information purchasing.

If $v = \overline{v}$ firm 2 tries to acquire firm 1. If the merger is authorized, social welfare under bilateral information sharing is identical to information purchasing. If the merger is prevented, social welfare under bilateral sharing is equal to:

$$(1-\rho)u+\overline{v}\rho$$

And welfare under information purchasing if $u \leq \overline{v}s^*$ is equal to

$$(1-\rho)(\overline{v}s^*-u)+u\rho$$

And whether bilateral information sharing yields higher welfare than information purchasing is ambiguous.

If $u \ge \overline{v}s^*$

$$(1-\rho)(u-\overline{v}s^*)+\overline{v}s^*\rho$$

And whether bilateral information sharing always yields higher welfare than information purchasing.

Proposition 6.

If $v = \overline{v}$ and $u \leq \overline{v}s^*$, bilateral information sharing can lead to higher or lower welfare than information purchasing.

Else, bilateral information sharing always leads to higher welfare than information purchasing.

The fact than in general, bilateral information sharing yields higher profits than information purchasing results from two effects. First, as firm 2 shares information, more information on the markets increases firm competition and consumer surplus. Secondly, as firm 2 shares information, firm 1 can enhance product quality and make higher profits. In equilibrium, the gains in profits for firm 1 from receiving s_2 cover its loss from sharing s_1 .

7 Firm 2 privately learns synergies

Consider now the situation where, after having acquired s and invested, firm 2 learns v privately. Firm 1 does not know v and the payoffs are the following:

(26)
$$\begin{cases} w.p. & \alpha, \quad \pi_1(s) = u - \underline{v}s, \pi_2(s) = 0 \\ w.p. & 1 - \alpha, \quad \pi_1(s) = \max\{u - \overline{v}s, 0\}, \pi_2(s) = \max\{\overline{v}s - u, 0\} \end{cases}$$

Pooling

Regardless of the value of the synergy, firm 2 offers to acquire firm 1 at price p(s):

(27)
$$\begin{cases} IC: & p(s) \ge \alpha(u - \underline{v}s) + \max\{u - \overline{v}s, 0\}; \\ IR_L: & \underline{v} - p(s) \ge 0; \\ IR_H: & \overline{v} - p(s) \ge \overline{v}s - u; \end{cases}$$

Thus we have $\underline{v} \geq p(s)$ and $\overline{v}(1-s) + u \geq p(s)$ and $IR_L \implies IR_H$. Thus pooling is an equilibrium if and only if $\underline{v} \geq \alpha(u - \underline{v}s) + \max\{u - \overline{v}s, 0\}$.

In this case, the expected payoff of firm 1 when sharing s is $\alpha(u - \underline{v}s) + \max\{u - \overline{v}s, 0\}$, and the price of information is $T(s) = u - \alpha(u - \underline{v}s) - \max\{u - \overline{v}s, 0\}$.

The expected payoff of firm 2 is then:

$$\pi_2(s) = (1 - \alpha)\overline{v} + \alpha \underline{v} - u - c(s)$$

And there is no benefits from sharing information.

If $\underline{v} \le \alpha(u - \underline{v}s) + \max\{u - \overline{v}s, 0\}$ pooling cannot be an equilibrium.

Excluding

If $\underline{v} \leq \alpha(u - \underline{v}s) + \max\{u - \overline{v}s, 0\}$ pooling cannot be an equilibrium and firm 2 makes an offer only when $v = \overline{v}$.

(28)
$$\begin{cases} IC: & p(s) \ge \alpha(u - \underline{v}s) + \max\{u - \overline{v}s, 0\}; \\ IR_H: & \overline{v} - p(s) \ge \overline{v}s - u; \end{cases}$$

The optimal price of acquisition is $p(s) = \alpha(u - \underline{v}s) + \max\{u - \overline{v}s, 0\}$, and the expected payoff of firm 1 from selling s information is $\alpha(u - \underline{v}s) + \max\{u - \overline{v}s, 0\}$, and the price of information is $T(s) = u - \alpha(u - \underline{v}s) - \max\{u - \overline{v}s, 0\}$.

The expected payoff of firm 2 is then:

$$\pi_2(s) = (1 - \alpha)\overline{v} - u - c(s)$$

and information sharing is less profitable than merger under imperfect information.

Separating:

In a separating equilibrium firm 2 pays two different prices \underline{p} when synergies are \underline{v} and \overline{p} when synergies are \overline{v} . It is clear that when synergies are low, firm 2 does not have interest to acquire firm 1 and separating equilibrium is not sustainable.

Proposition 7.

Information sharing is never optimal when synergies are learned privately.

It is thus essential that firm 1 learns the value of the synergy. It is also clear that the learning process must be transparent. Else, firm 2 may have interest to claim that synergies are high and to acquire firm 1 at a low cost.

References

Admati, A. R. and Pfleiderer, P. (2000), 'Forcing firms to talk: Financial disclosure regulation and externalities', *The Review of financial studies* **13**(3), 479–519.

Anton, J. J. and Yao, D. A. (2002), 'The sale of ideas: Strategic disclosure, property rights, and contracting', *The Review of Economic Studies* **69**(3), 513–531.

Argentesi, E., Buccirossi, P., Calvano, E., Duso, T., Marrazzo, A. and Nava, S. (2019), 'Merger policy in digital markets: An expost assessment', *Journal of Competition Law & Economics*.

Awaya, Y. and Krishna, V. (2021), 'Startups and upstarts: Disadvantageous information in r&d',

Journal of Political Economy 129(2), 000–000.

- Bergemann, D. and Bonatti, A. (2015), 'Selling cookies', American Economic Journal: Microeconomics 7(3), 259–94.
- Bertschinger, N., Rauh, J., Olbrich, E., Jost, J. and Ay, N. (2014), 'Quantifying unique information', Entropy 16(4), 2161–2183.
- Besanko, D. and Spulber, D. F. (1993), 'Contested mergers and equilibrium antitrust policy',

 The Journal of Law, Economics, and Organization 9(1), 1–29.
- Cabral, L. (2021), 'Merger policy in digital industries', Information Economics and Policy 54, 100866.
- Chatterjee, S. (1986), 'Types of synergy and economic value: The impact of acquisitions on merging and rival firms', *Strategic management journal* 7(2), 119–139.
- Chen, Z., Choe, C., Cong, J. and Matsushima, N. (2020), 'Data-driven mergers and personalization', ISER DP 12(1108).
- Chirita, A. D. (2018), 'Data-driven mergers under eu competition law', The Future of Commercial Law: Ways Forward for Harmonisation, (eds) J Linarelli & O Akseli (1st ed, Oxford, Hart Publishing, 2019).
- Crémer, J., de Montjoye, Y.-A. and Schweitzer, H. (2019), 'Competition policy for the digital era', Report for the European Commission.
- Cunningham, C., Ederer, F. and Ma, S. (2019), 'Killer acquisitions', Available at SSRN 3241707 .
- Daley, B. and Green, B. (2020), 'Bargaining and news', American Economic Review 110(2), 428–74.
- Damodaran, A. (2005), 'The value of synergy', Stern school of Business pp. 132–146.
- d'Aspremont, C., Bhattacharya, S. and Gérard-Varet, L.-A. (2000), 'Bargaining and sharing innovative knowledge', *The Review of Economic Studies* **67**(2), 255–271.
- De Corniere, A. and Taylor, G. (2020), 'Data and competition: a general framework with applications to mergers, market structure, and privacy policy'.

- Federico, G., Morton, F. S. and Shapiro, C. (2019), Antitrust and innovation: Welcoming and protecting disruption, *in* 'Innovation Policy and the Economy, Volume 20', University of Chicago Press.
- Fershtman, C. and Kamien, M. I. (1992), 'Cross licensing of complementary technologies', *International Journal of Industrial Organization* **10**(3), 329–348.
- Gal-Or, E. (1986), 'Information transmission—cournot and bertrand equilibria', The Review of Economic Studies 53(1), 85–92.
- Griffith, V. and Koch, C. (2014), Quantifying synergistic mutual information, in 'Guided Self-Organization: Inception', Springer, pp. 159–190.
- Gupta, D. and Gerchak, Y. (2002), 'Quantifying operational synergies in a merger/acquisition', Management Science 48(4), 517–533.
- Hagiu, A. and Wright, J. (2020), 'When data creates competitive advantage', *Harvard Business Review* **98**(1), 94–101.
- Jones, C. I. and Tonetti, C. (2020), 'Nonrivalry and the economics of data', American Economic Review 110(9), 2819–58.
- Kamepalli, S. K., Rajan, R. and Zingales, L. (2020), Kill zone, Technical report, National Bureau of Economic Research.
- Larsson, R. and Finkelstein, S. (1999), 'Integrating strategic, organizational, and human resource perspectives on mergers and acquisitions: A case survey of synergy realization', *Organization science* **10**(1), 1–26.
- Madura, J. and Ngo, T. (2008), 'Clustered synergies in the takeover market', *Journal of Financial Research* **31**(4), 333–356.
- Martens, B., De Streel, A., Graef, I., Tombal, T. and Duch-Brown, N. (2020), 'Business-to-business data sharing: An economic and legal analysis', *EU Science Hub*.
- Mukherjee, T. K., Kiymaz, H. and Baker, H. K. (2004), 'Merger motives and target valuation:

 A survey of evidence from cfos', *Journal of Applied Finance* **14**(2).

- Olbrich, E., Bertschinger, N. and Rauh, J. (2015), 'Information decomposition and synergy', *Entropy* 17(5), 3501–3517.
- Scaria, E., Berghmans, A., Pont, M., Arnaut, C. and Leconte, S. (2018), 'Study on data sharing between companies in europe', A study prepared for the European Commission Directorate-General for Communications Networks, Content and Technology by everis Benelux 24.
- Scott Morton, F., Bouvier, P., Ezrachi, A., Jullien, B., Katz, R., Kimmelman, G., Melamed, A. D. and Morgenstern, J. (2019), 'Committee for the study of digital platforms: Market structure and antitrust subcommittee report', Chicago: Stigler Center for the Study of the Economy and the State, University of Chicago Booth School of Business.
- Shapiro, C. (2019), 'Protecting competition in the american economy: Merger control, tech titans, labor markets', *Journal of Economic Perspectives, Forthcoming*.
- Shapiro, C., Carl, S., Varian, H. R. et al. (1998), Information rules: A strategic guide to the network economy, Harvard Business Press.
- Sootla, S., Theis, D. O. and Vicente, R. (2017), 'Analyzing information distribution in complex systems', *Entropy* **19**(12), 636.
- Stucke, M. E. and Grunes, A. P. (2016), 'Introduction: Big data and competition policy', Big Data and Competition Policy, Oxford University Press (2016).
- Tadelis, S. (1999), 'What's in a name? reputation as a tradeable asset', *American Economic Review* 89(3), 548–563.
- Tirole, J. (2020), 'Competition and the industrial challenge for the digital age'.
- Varian, H. R. (1989), 'Price discrimination', Handbook of industrial organization 1, 597-654.
- Vives, X. (1984), 'Duopoly information equilibrium: Cournot and bertrand', Journal of economic theory 34(1), 71–94.

A Appendix

A.1 Bilateral information sharing 2

We consider alternative profits for firm 1 from receiving information from firm 2.

A.1.1 Competition

Suppose now that firm 1 shares $s_1 \geq 0$ and firm 2 shares $s_2 \geq 0$, and let us ignore for the moment the possibility of a merger. If firm 2 invests c and learns v, it can provide its customers a value vs_1 . Again we assume that only firm 2 chooses whether to invest $c(s_1)$, and after the investment is made, both firms learn the synergy. In this case, firm 1 also learns v and it can provide its customers a value $max\{u, vs_2\}$ (taking the maximum allows to avoid destructive synergies due to reputation effects that do not arise when firms compete). Assuming Bertrand competition, it follows that the equilibrium price paid by the consumers and the profit per consumer are

$$\begin{cases} p = vs_1 - \max\{u, vs_2\}; \pi_1(v, s_1, s_2) = 0; \pi_2(v, s_1, s_2) = vs_1 - \max\{u, vs_2\} & \text{if } vs_1 \ge \max\{u, vs_1\} \\ p = \max\{u, vs_2\} - vs_1; \pi_1(v, s_1, s_2) = \max\{u, vs_2\} - vs_1; \pi_2(v, s_1, s_2) = 0 & \text{if } vs_1 \le \max\{u, vs_2\}. \end{cases}$$

A.1.2 Profits with data sharing

Suppose firm 1 shares s_1 with firm 2, and that firm 2 shares s_2 with firm 1 in exchange of s_1 .

Upon receiving s_1 and s_2 , Firm 2 can decide to invest c(s) in order to learn v. In this case, the two firms anticipate payoffs $\pi_i(v, s_1, s_2)$ as given Eq. (29) if there is no merger. Firm 2 can make a TIOLI offer to buy firm 1's asset at a price $p(v, s_1, s_2)$ that will make firm 1 indifferent between merging and not merging, that is

(30)
$$p(v, s_1, s_2) := \pi_1(v, s_1, s_2).$$

If $s_2 \leq \frac{u}{\overline{v}}$ data sharing by firm 2 does not impact the profits of firm 1, which in turn has no incentives to share information. We consider $s_2 \geq \frac{u}{\overline{v}}$ and we write $\delta s = s_1 - s_2 \in [-1, 1 - \frac{u}{\overline{v}}]$.

- With probability α , $v = \underline{v} < u$:
 - $\pi_1(\underline{v}, s_1) = u \underline{v}s_1;$
 - $-\pi_2(v,s_1)=0;$

- With probability 1α , $v = \overline{v} > u$:
 - If $s_1 \leq s_2$, $\delta s \leq 0$ and:

*
$$\pi_1(\overline{v}, \delta s) = -\overline{v}\delta s$$
;

*
$$\pi_2(\overline{v}, \delta s) = 0;$$

– If $s_1 \geq s_2$, $\delta s \geq 0$ and:

*
$$\pi_1(\overline{v},s)=0$$
;

*
$$\pi_2(\overline{v},s) = \overline{v}\delta s;$$

In this case, the expected payoff of firm 1 from sharing δs information is:

• If $\delta s \leq 0$, firm 2 pays a positive price to firm 1 for the merger when $v = \overline{v}$:

$$\pi_1(s) = \alpha(u - \underline{v}s_1) + (1 - \alpha)(-\overline{v}\delta s)$$

and
$$(1-\alpha)\overline{v}s_2 \geq (1-\alpha)u + \mathbb{E}[v]s_1$$

• If $\delta s \geq 0$, firm 2 acquires firm 1 for a zero price:

$$\pi_1(s) = \alpha(u - \underline{v}s_1)$$

and $s_1 = -\frac{1-\alpha}{\alpha} \frac{u}{\underline{v}}$, which is impossible as $s_1 \geq 0$.

Thus in equilibrium, bilateral information sharing can occur if $\delta s \leq 0$, and in this case $(1-\alpha)\overline{v}s_2 = (1-\alpha)u + \mathbb{E}[v]s_1$.

The expected payoff of firm 2 of sharing s_2 and investing $c(s_1)$ following sharing of data and learning v is:

(31)
$$\pi_2(s_1, s_2) = (1 - \alpha)\overline{v}(1 - s_2 + s_1) - c(s_1)$$
$$= (1 - \alpha)\overline{v} - (1 - \alpha)u - \alpha \underline{v}s_1 - c(s_1)$$

with $s_2 \geq s_1$

A.1.3 Information acquisition

We analyze whether it is profitable for firm 2 to exchange bilateral information with firm 1, and we characterize the optimal information sharing. The alternative for firm 2 is to purchase data and make profits as described in Section 4.4. We show that bilateral sharing can be equivalent to information purchasing for firm 2.

It is clear that $\pi_2(s)$ is maximized for s_1 such that

$$\alpha \underline{v} = -c'(s_1^*)$$

under the condition that $(1-\alpha)\overline{v}s_2 \geq (1-\alpha)u + \mathbb{E}[v]s_1$. Thus in equilibrium,

Bilateral sharing is more profitable than information purchasing if:

$$(1-\alpha)(\overline{v}-u) - \alpha \underline{v}s_1^* - c(s_1^*) \ge (1-\alpha)(\overline{v}-u) - \alpha \underline{v}s^* - c(s^*).$$

As s_1^* is chosen under constraints, either $s_1^* = s^*$ and information purchasing is equivalent to bilateral information sharing, or $s_1^* < s^*$ and information purchasing yields higher profits than information sharing.

Similarly to information purchasing, there are two opposite effects of bilateral information sharing on the profits of firm 2. On the one hand, bilateral information sharing allows firm 2 to incentivize firm 1 to share information without money transfer. In turn, the higher s_1 the lower the data exploitation cost and the higher the benefits of firm 2 from avoiding low efficiency mergers. On the other hand, s_2 must be large enough to cover the loss of firm 1 due to competition in case merger does not occur, which increases the price firm 2 has to pay to acquire firm 1.

This leads us to the following proposition:

Proposition 8.

- Information purchasing is always at least as good as bilateral information sharing.
- Bilateral information sharing is equivalent to information purchasing when $s_1^* = s^*$.

• Bilateral information sharing can be optimal when information purchasing is prevented.

A.1.4 Social welfare

We compare social welfare under information purchasing with welfare under bilateral information sharing.

If $v = \underline{v}$ firm 2 does not acquire firm 1 and social welfare is equal to:

$$(1-\rho)(u-\underline{v}s_1^*)+\underline{v}s_1^*\rho$$

If $\rho \in [0, 1/2]$, welfare is higher under the regime that yields the lowest s_1 , that is, under bilateral information sharing. If $\rho \in [1/2, 1]$ the opposite is true.

If $v = \overline{v}$ firm 2 tries to acquire firm 1. If the merger is authorized, social welfare under bilateral information sharing is identical to information purchasing. If the merger is prevented, social welfare under bilateral sharing is equal to:

$$(1-\rho)\overline{v}(1-s_1^*) + \overline{v}s_1^*\rho$$

And welfare under information purchasing if $u \leq \overline{v}s^*$ is equal to

$$(1-\rho)(\overline{v}(1-s^*)+u)+u\rho$$

If $u \ge \overline{v}s^*$

$$(1-\rho)(\overline{v}(1+s^*)-u)+\overline{v}s^*\rho$$

Proposition 9.

A.2 Mixed strategy: bilateral information sharing & information purchasing

Firm 2 can now both purchase information from firm 1 and share some of its own information at the same time. The competition stage is identical to the previous section and we directly go to profit functions and the price of information under mixed strategies.

A.2.1 Profits with data sharing

Suppose firm 1 shares s_1 with firm 2, and that firm 2 shares s_2 with firm 1 in exchange of s_1 .

Upon receiving s_1 , firm 2 can decide to invest $c(s_1)$ in order to learn v. In this case, the two firms anticipate payoffs $\pi_i(v, s_1, s_2)$ as given by Eq. (29) if there is no merger. Firm 2 can make a TIOLI offer to buy firm 1's asset at a price $p(v, s_1, s_2)$ that will make firm 1 indifferent between merging and not merging, that is

(32)
$$p(v, s_1, s_2) := \pi_1(v, s_1, s_2).$$

• With probability α , $v = \underline{v} < u$:

$$-\pi_1(v,s_1)=u-vs_1;$$

$$- \pi_2(\underline{v}, s_1) = 0;$$

• With probability $1 - \alpha$, $v = \overline{v} > u$:

– If
$$s_1 \leq s_2$$
, $\delta s \leq 0$ and:

*
$$\pi_1(\overline{v}, \delta s) = -\overline{v}\delta s$$
:

*
$$\pi_2(\overline{v}, \delta s) = 0;$$

- If $s_1 > s_2$, $\delta s > 0$ and:

*
$$\pi_1(\overline{v},s)=0$$
;

*
$$\pi_2(\overline{v},s) = \overline{v}\delta s;$$

In this case, the expected payoff of firm 1 from sharing δs information is:

• If $\delta s \leq 0$, firm 2 pays a positive price to firm 1 for the merger when $v = \overline{v}$:

$$\pi_1(s_1, s_2) = \alpha(u - vs_1) + (1 - \alpha)(-\overline{v}\delta s) + T(s_1, s_2)$$

and
$$(1 - \alpha)\overline{v}s_2 + T(s_1, s_2) \ge (1 - \alpha)u + \mathbb{E}[v]s_1$$

• If $\delta s \geq 0$, firm 2 acquires firm 1 for a zero price:

$$\pi_1(s_1, s_2) = \alpha(u - vs_1) + T(s_1, s_2)$$

and
$$T(s_1, s_2) = (1 - \alpha)u + \alpha \underline{v}s_1$$
.

If $\delta s \leq 0$:

(33)
$$\pi_2(s_1, s_2) = (1 - \alpha)(\overline{v}(1 + \delta s)) - c(s_1) - T(s_1, s_2)$$

$$= (1 - \alpha)(\overline{v}(1 + \delta s)) - c(s_1) + (1 - \alpha)\overline{v}s_2 - (1 - \alpha)u - \mathbb{E}[v]s_1$$

$$= (1 - \alpha)(\overline{v} - u) - c(s_1) - \alpha \underline{v}s_1$$

If $\delta s \geq 0$:

(34)
$$\pi_2(s_1, s_2) = (1 - \alpha)\overline{v} - c(s_1) - T(s_1, s_2)$$

$$= (1 - \alpha)\overline{v} - c(s_1) - (1 - \alpha)u - \alpha \underline{v}s_1$$

$$= (1 - \alpha)(\overline{v} - u) - c(s_1) - \alpha \underline{v}s_1$$

A.2.2 Optimal information acquisition

(35)
$$\pi_2(s_1, s_2) = (1 - \alpha)(\overline{v} - u) - c(s_1) - \alpha \underline{v} s_1$$
$$\frac{\partial \pi_2(s_1, s_2)}{\partial s_1} = -c'(s_1) - \alpha \underline{v}$$

And the optimal amount of information shared by firm 1 is identical to information purchasing.