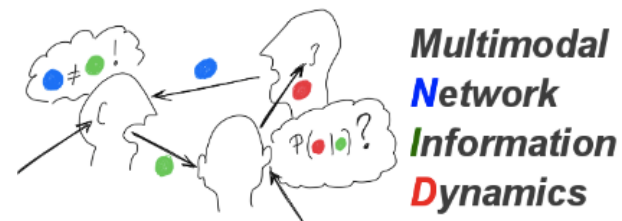


Misinformation Regulation in the Presence of Competition between Social Media Platforms

So Sasaki, Cédric Langbort

Coordinated Science Laboratory
University of Illinois at Urbana Champaign

Oct. 2023



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What are the underlying economic incentives for various regulations and reasonings?

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Regulation on influencers: Regulation may depend on the power balance between platforms and influencers [3,4]

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- Mainstream platform can enforce regulation without losing users.
- Effective regulation depends on network structures and supporters of an influencer.

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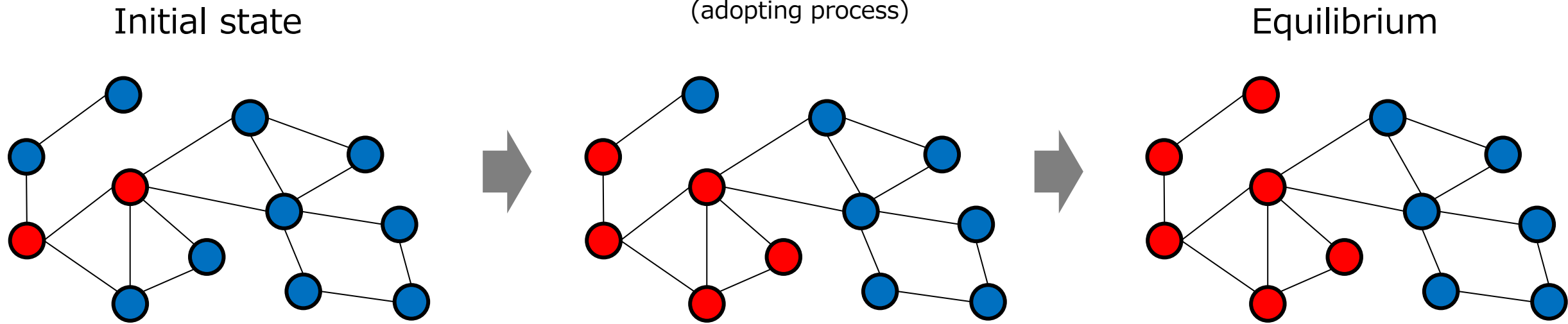
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How does the new technology replace the old one?

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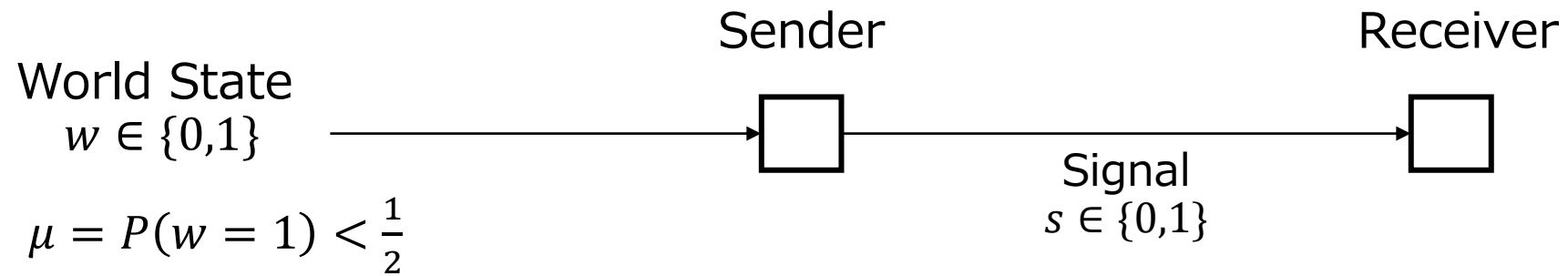
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Blue: Old technology

Red: New technology

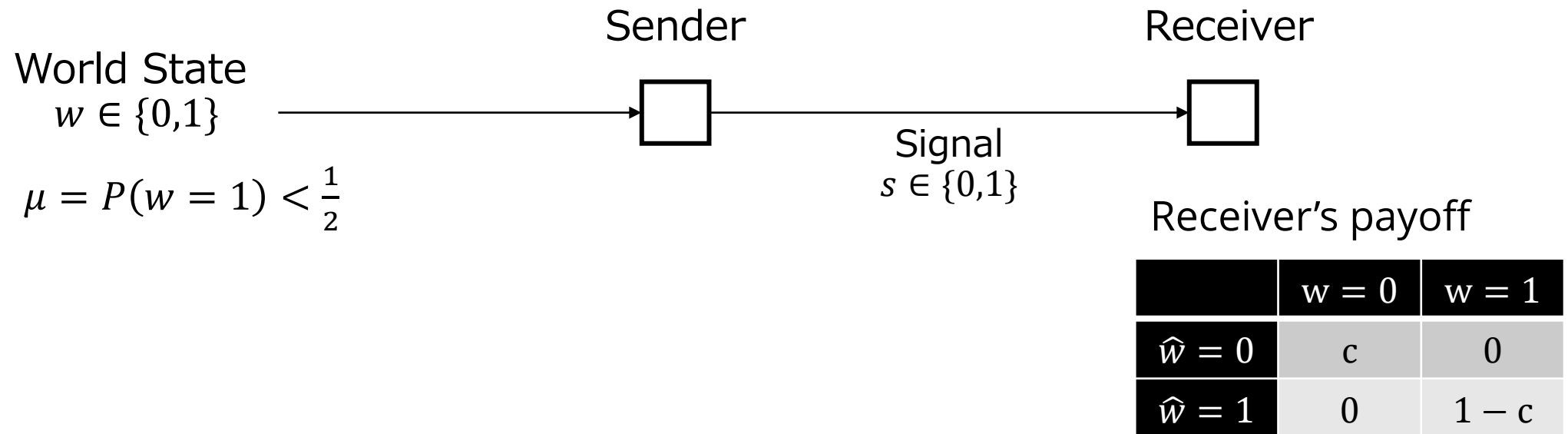
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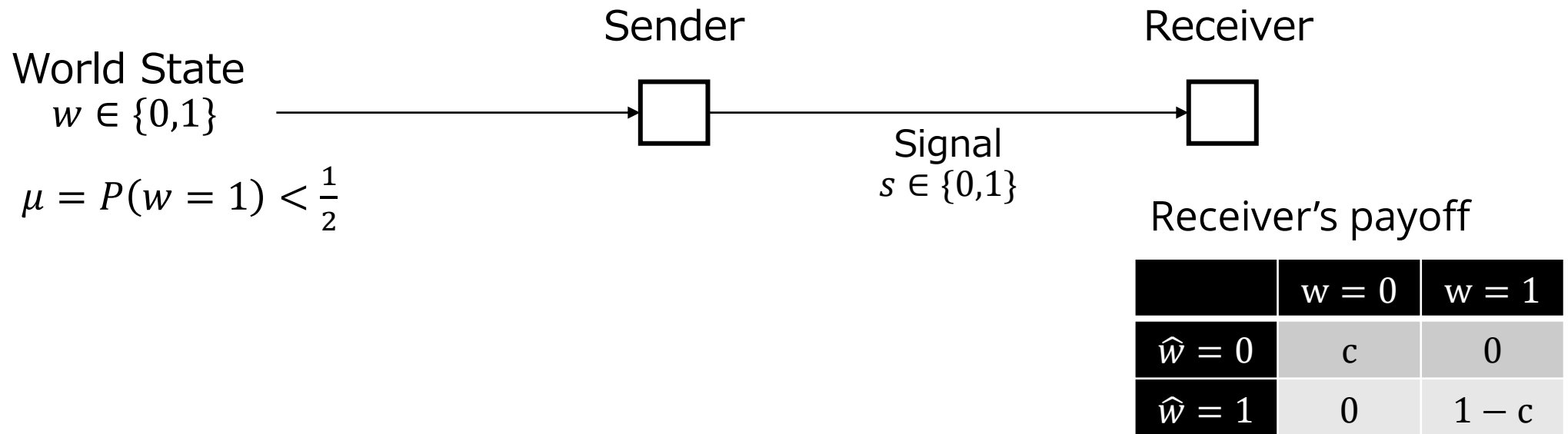
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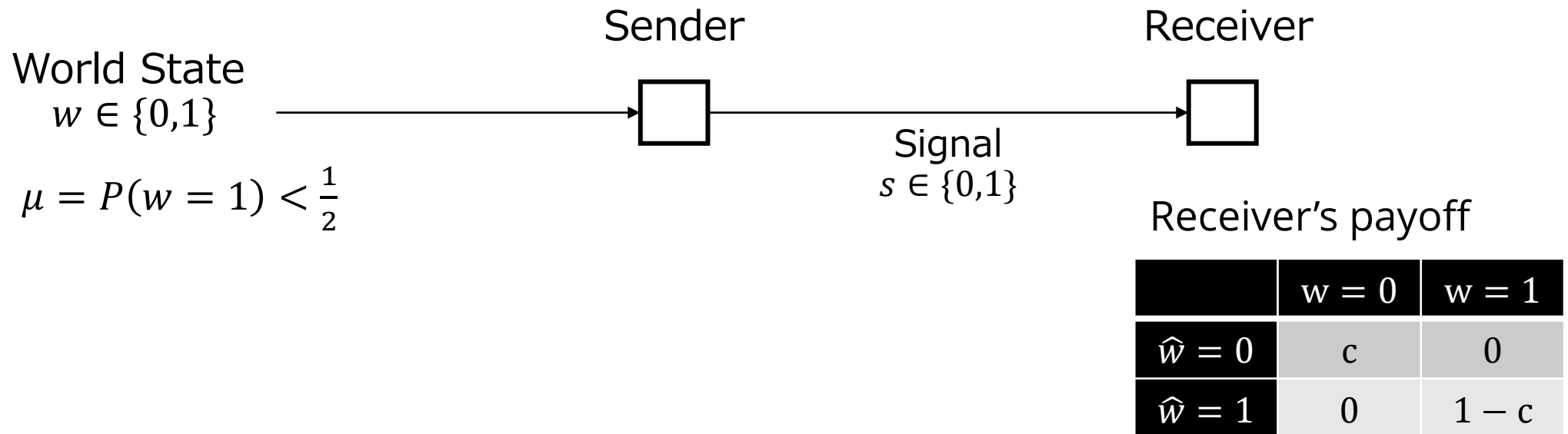


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Receiver sees β and then chooses whether they should believe the signal or not.

(Receiver doesn't know if the signal is true or not, but they can roughly assess the news source's deceitfulness or bias β by the past record or reputation.)

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- Influencer can send information valuable to other users.
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- To do so, the influencer has to be trusted and listened to.

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A sender and users choose platform A or B.

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User i 's utility in Platform $J \in \{A, B\}$:

$$V_{iJ} = \Phi_{iJ} + \Psi_{iJ}$$

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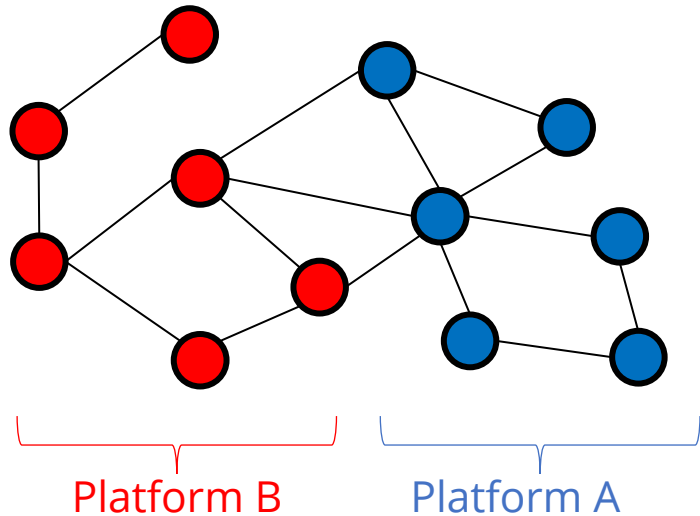
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Social interaction quality in Platform J

#Neighbors in Platform J



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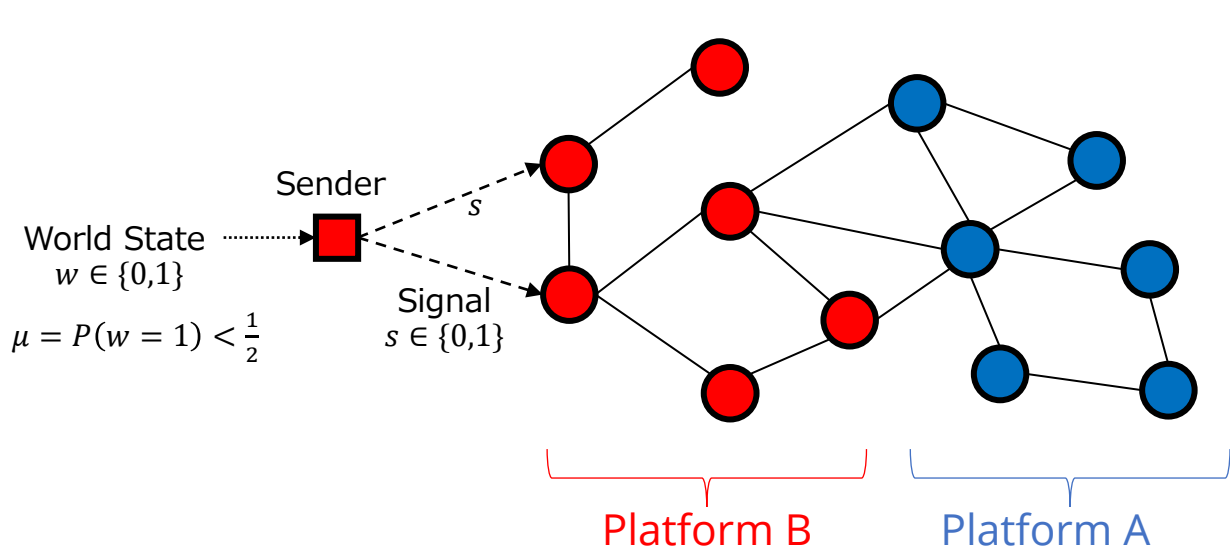
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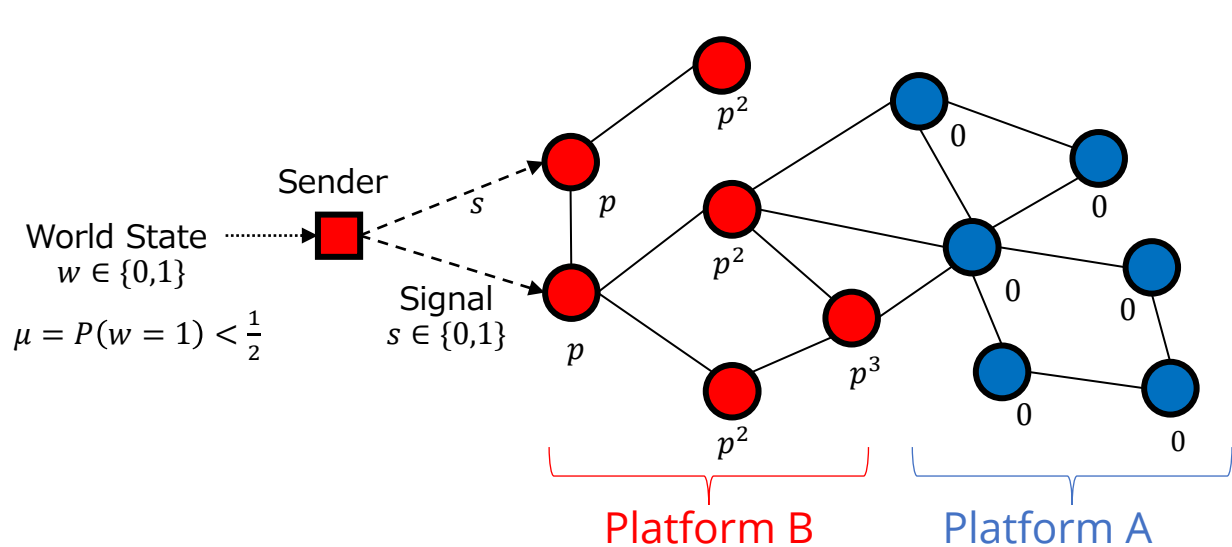
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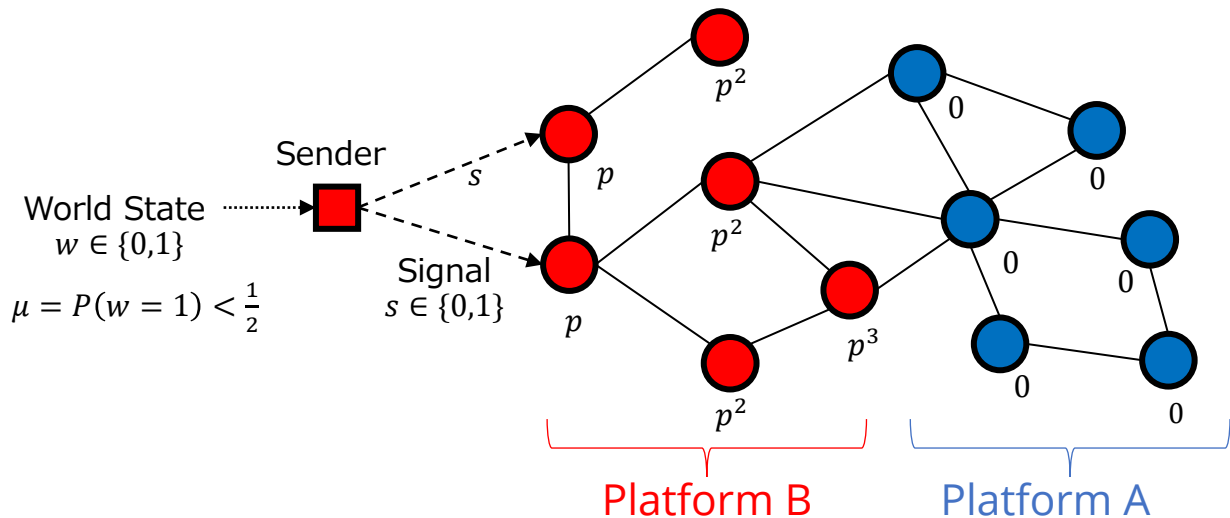
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|---------------|---------|---------|
| $\hat{w} = 0$ | c | 0 |
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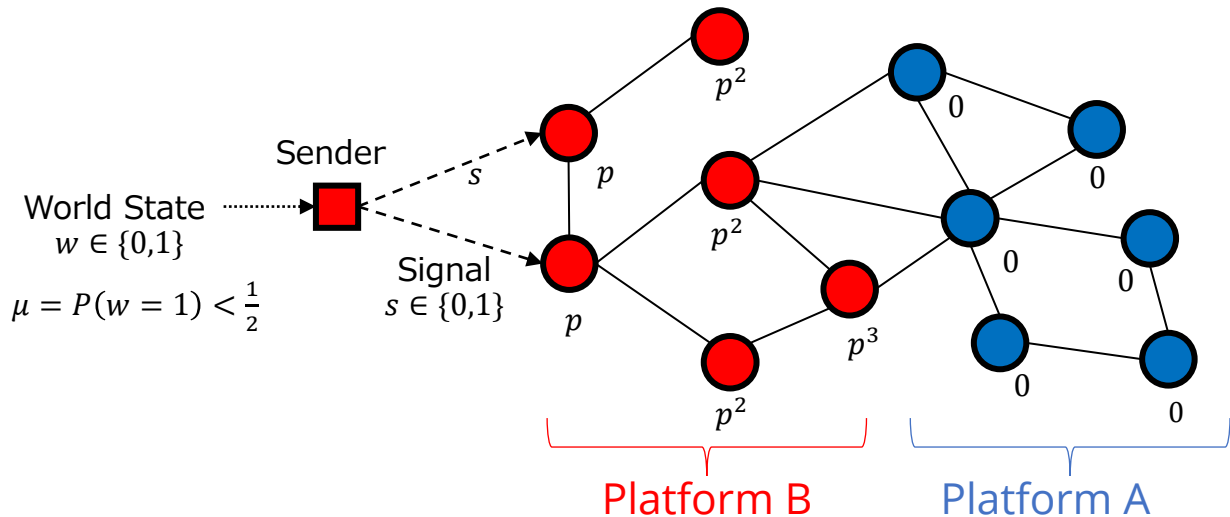
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$$\Psi_{ij} = \begin{cases} (1 - \mu)c + \overbrace{\{\mu(1 - c) - (1 - \mu)c\beta\}}^{\text{value of sender's message}} p_{ij} & \text{if } \beta \leq \beta' := \frac{\mu(1-c)}{(1-\mu)c} \\ (1 - \mu)c & \text{otherwise.} \end{cases}$$



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Sender's utility: #users who estimate $\hat{w} = 1$.

$$U = \begin{cases} \sum_i \overbrace{(\mu + (1 - \mu)\beta)}^{\text{Probability of successful persuasion}} p_{iJ} & \text{if } \beta \leq \beta'. \\ 0 & \text{otherwise.} \end{cases}$$

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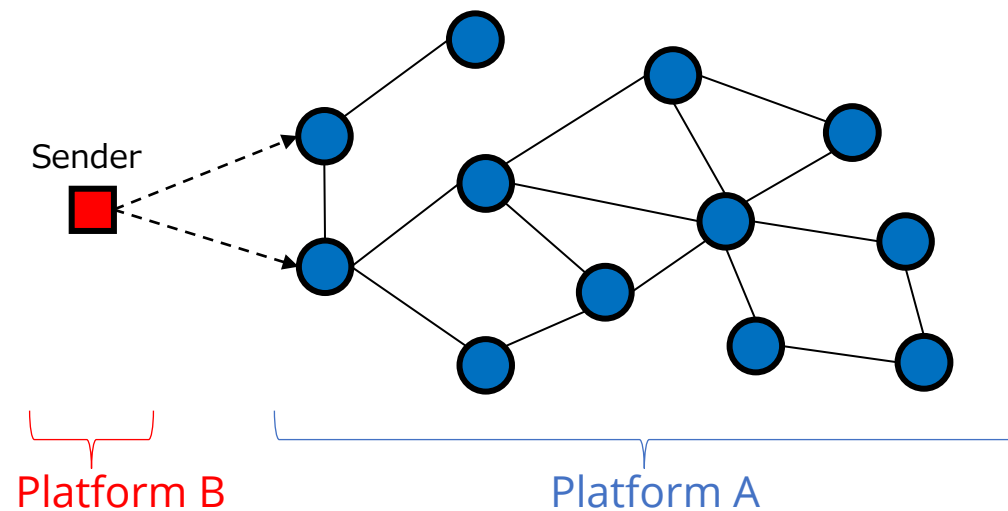
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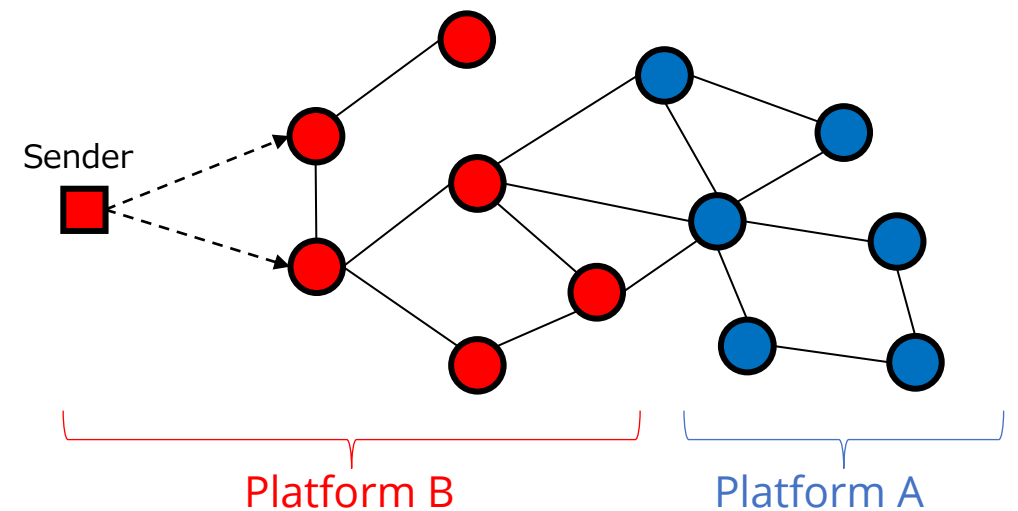
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Initial state (all users in dominant Platform A)



Equilibrium

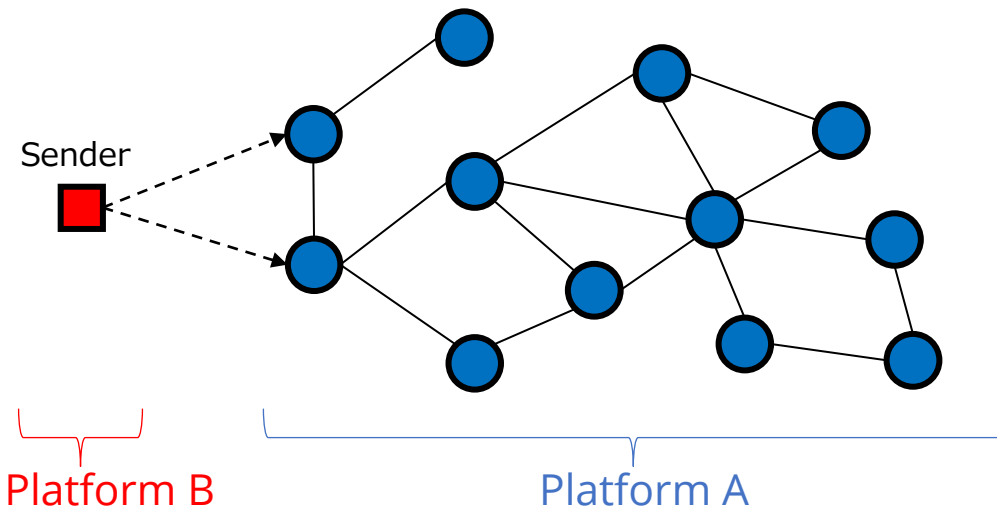


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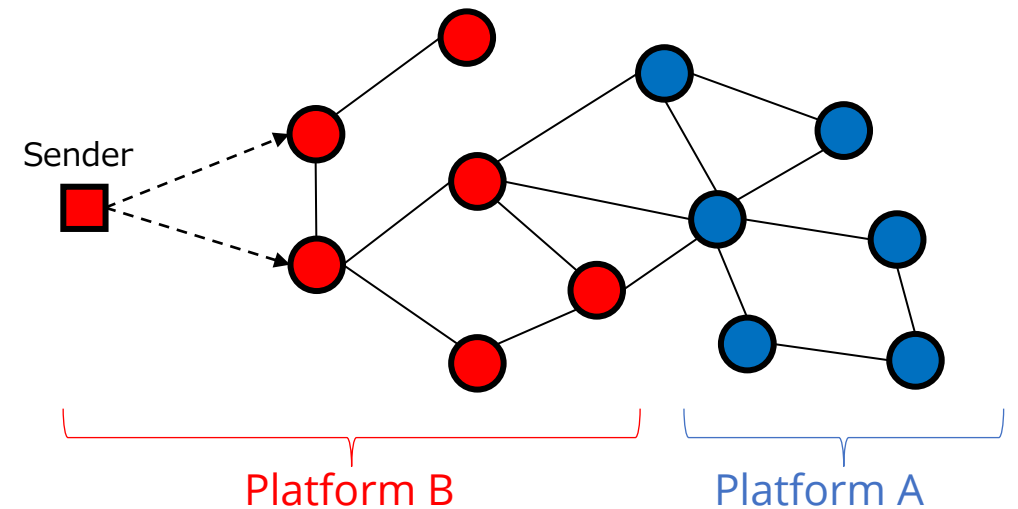
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3. Based on this equilibrium, Sender gets his utility U .

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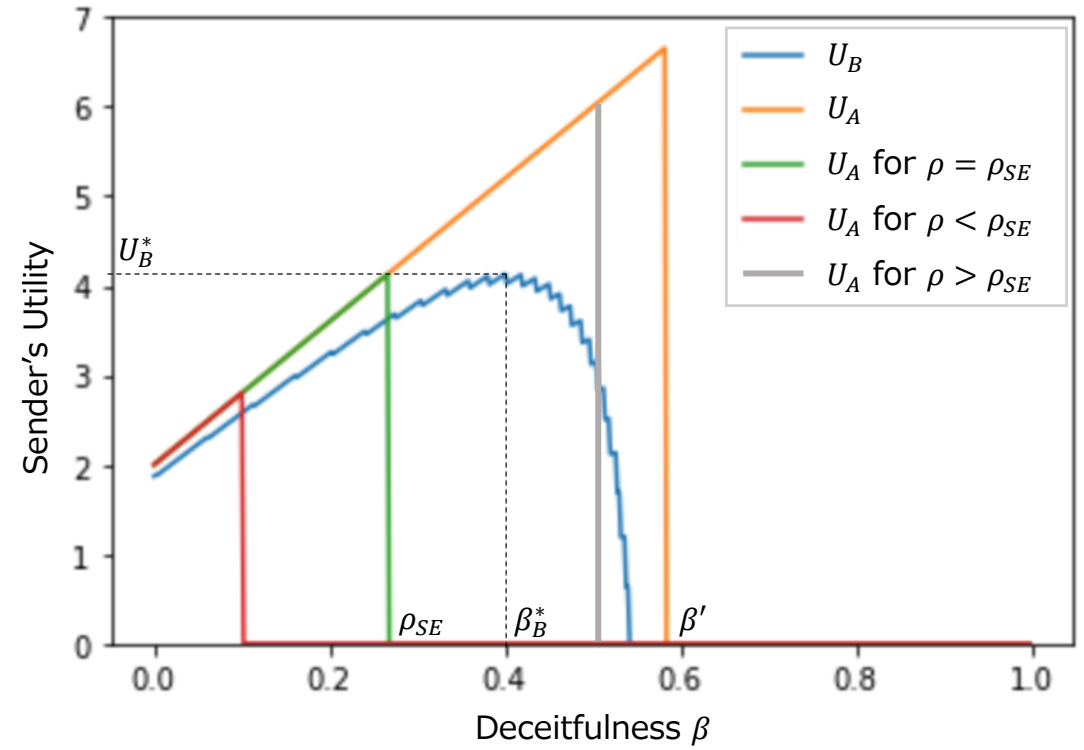


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Result

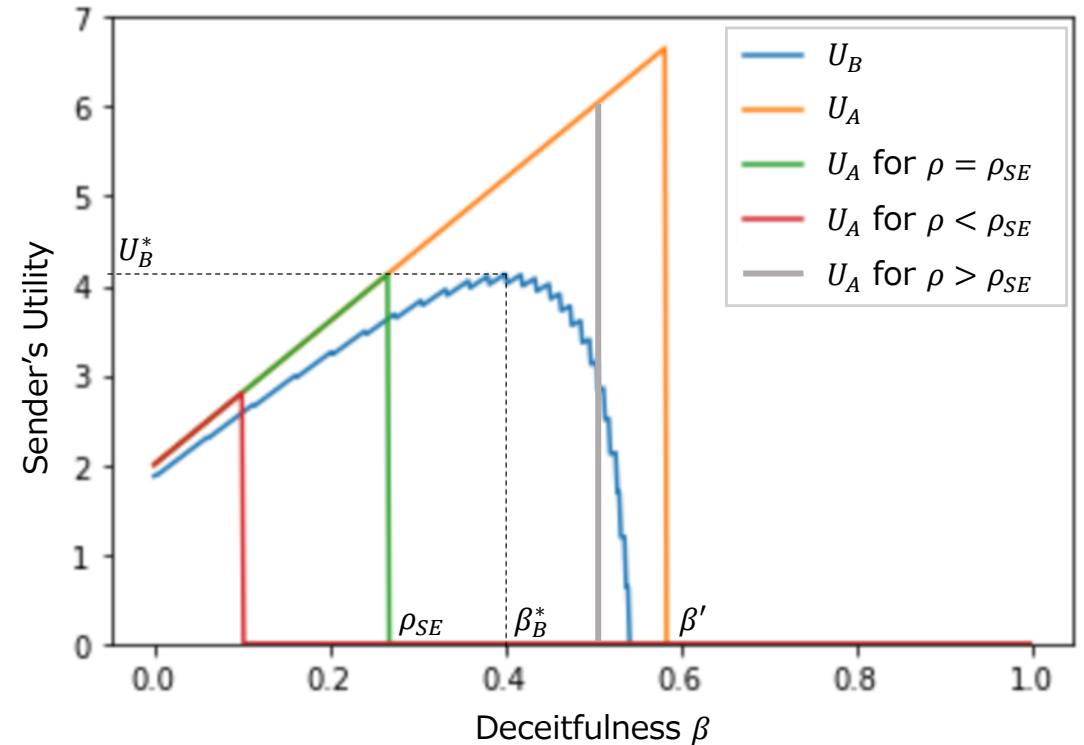
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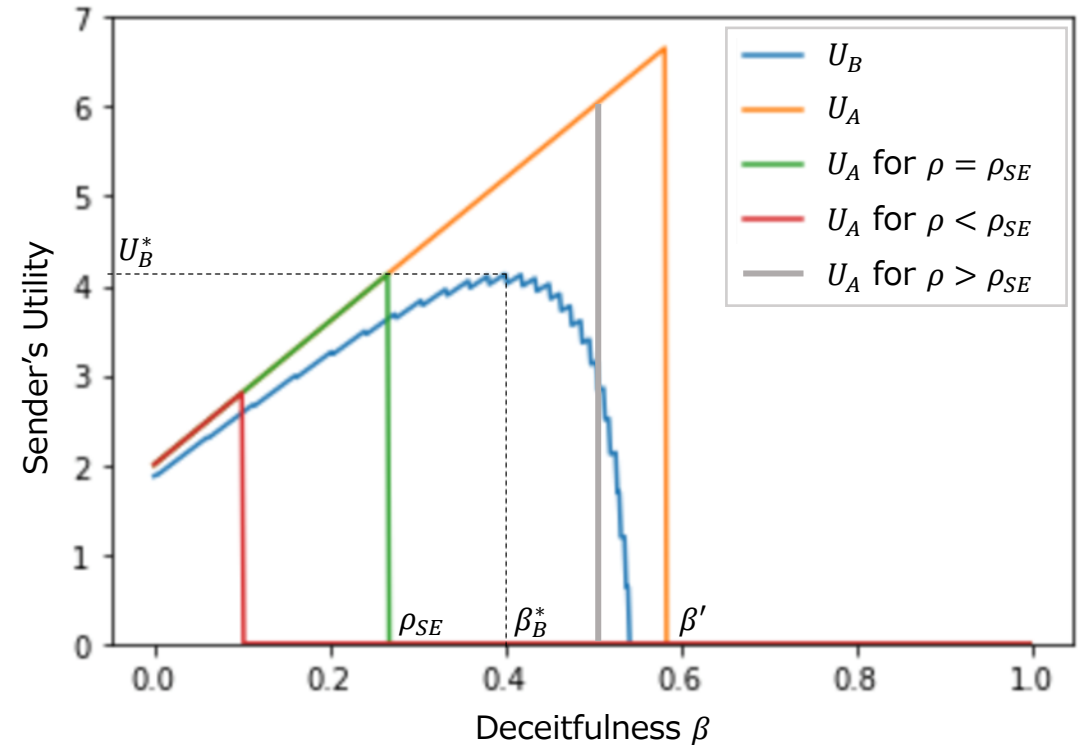
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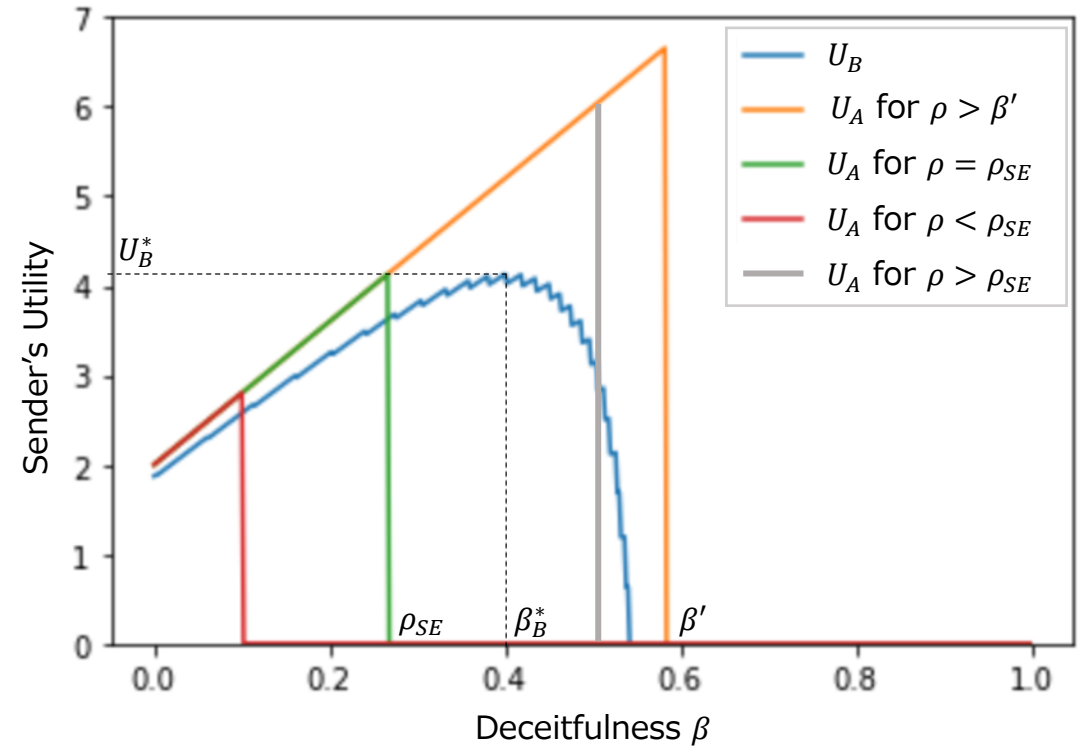
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As a result, Sender gets higher utility in the initially dominant platform A.

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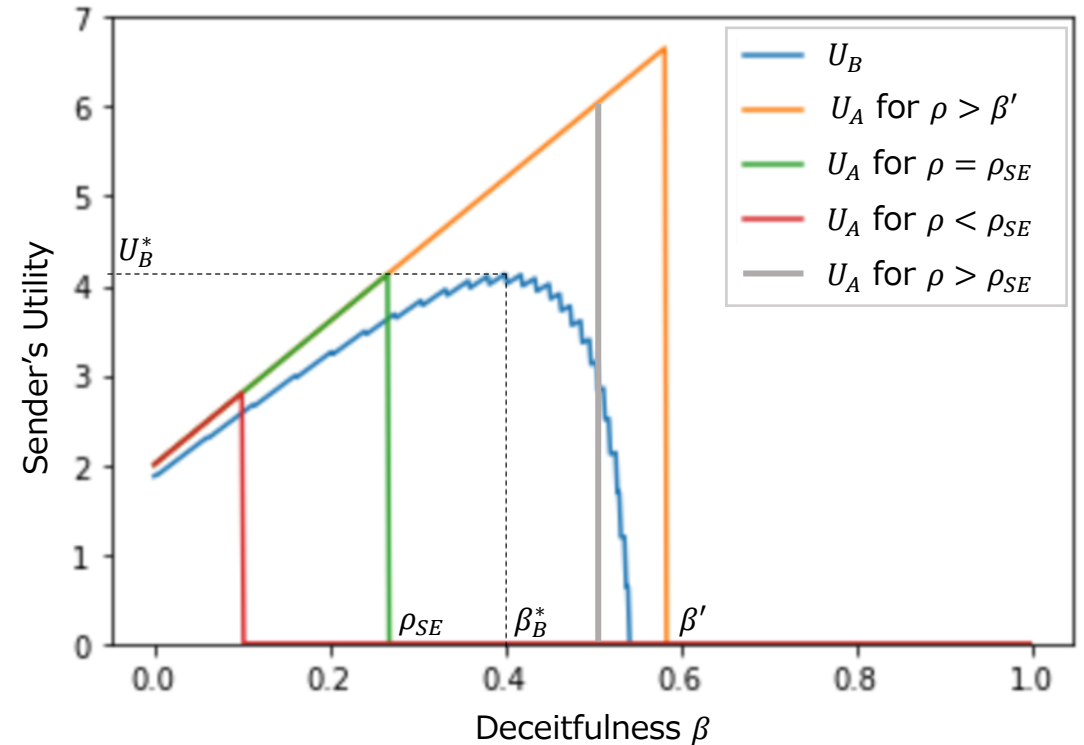
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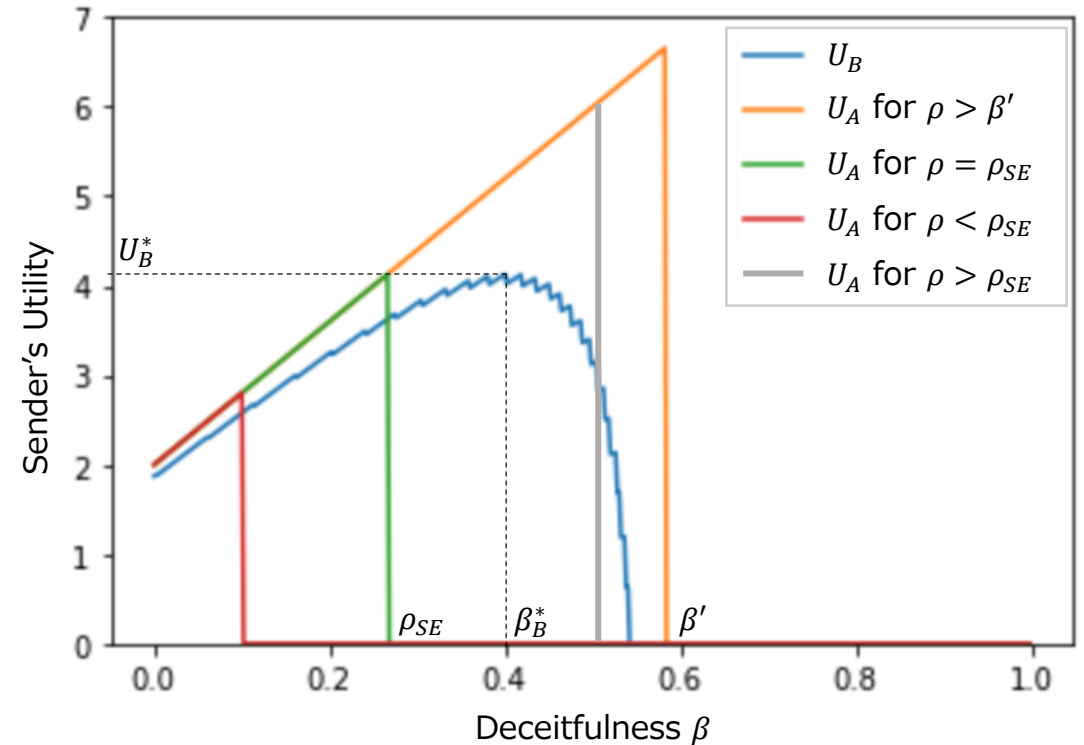
- With too strict regulation, the popular platform loses users, and the influencer remains deceitful in another platform.
- With lenient regulation, the currently popular platform can keep all users, but the sender remains relatively deceitful.



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Theorem 1 (Strictest effective regulation ρ_{SE})

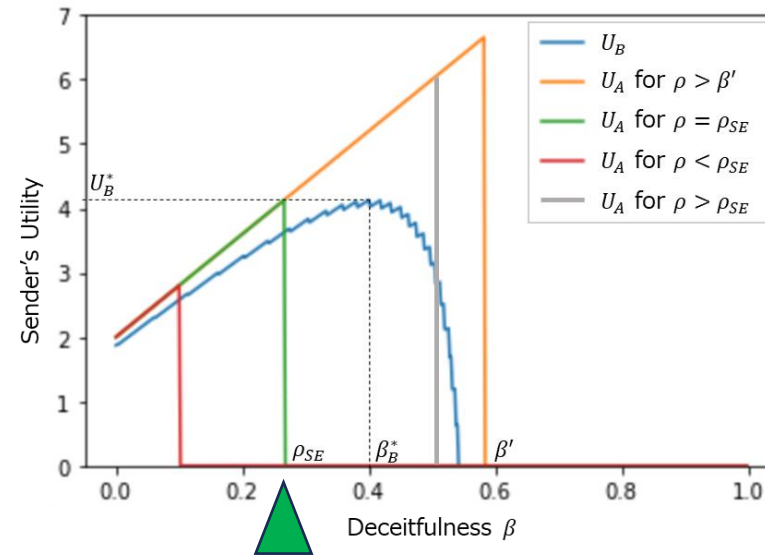
If $U_A(0) > U_B^*$, platform A can enforce any strict regulation effectively, i.e., $\rho_{SE} = 0$.

If $U_A(0) \leq U_B^* < U_A(\beta')$, regulation should be moderate and

$$\rho_{SE} = \frac{1}{1 - \mu} \left(\frac{U_B^*}{\sum_i p_{iA}} - \mu \right).$$

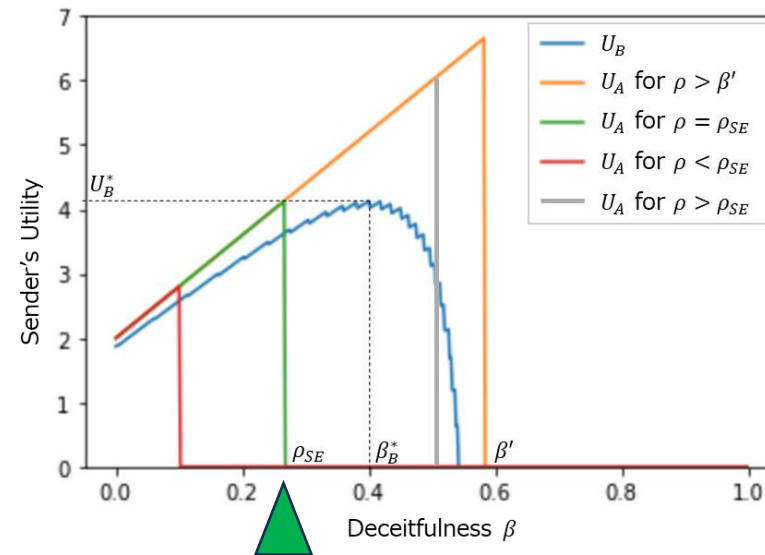
If $U_A(\beta') \leq U_B^*$, then ρ_{SE} does not exist.

Recap so far



We identified the Strictest Effective Regulation ρ_{SE} , which is

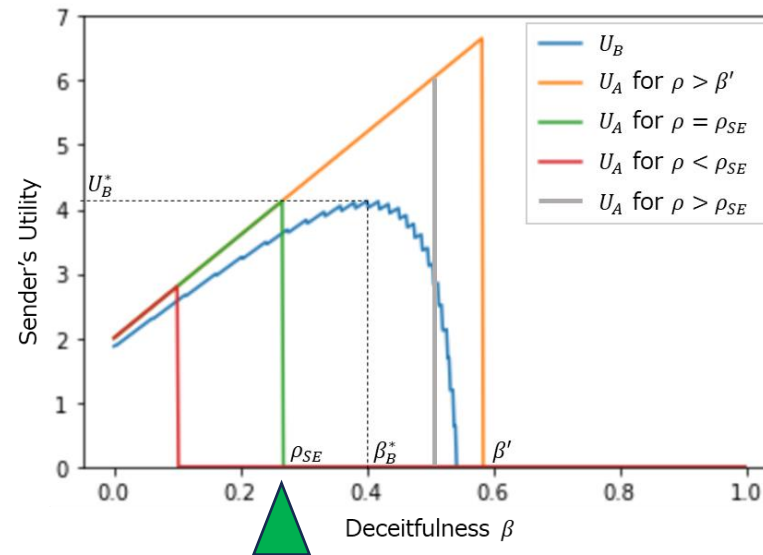
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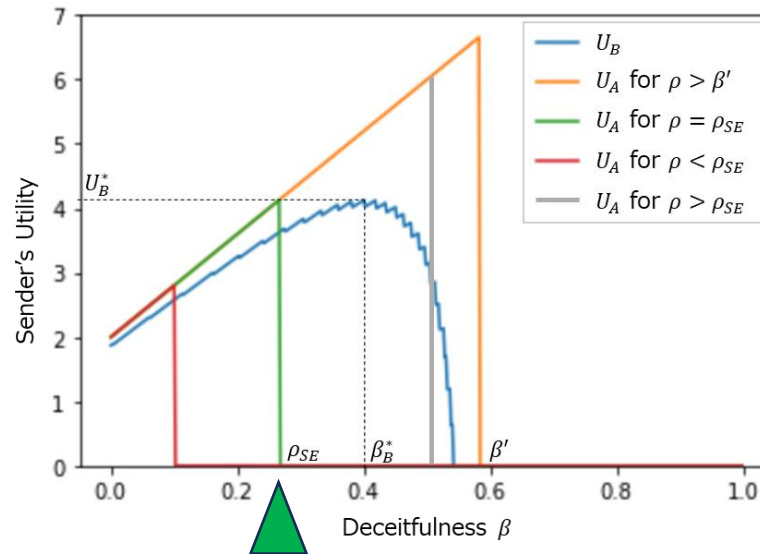
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We identified the Strictest Effective Regulation ρ_{SE} , which is

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- The best regulation for the entire society (because it allows many users to receive high quality information)

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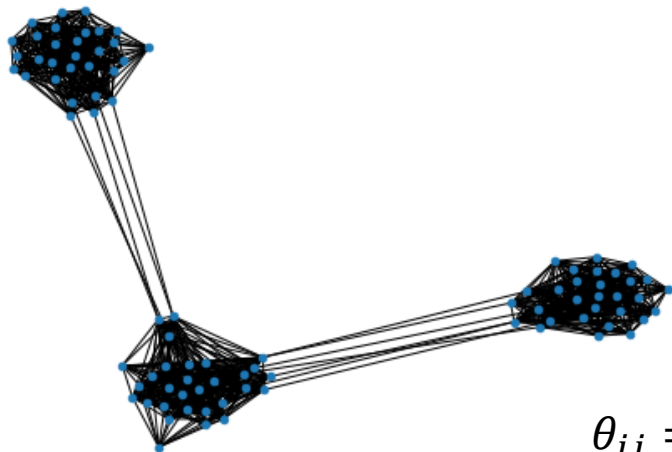


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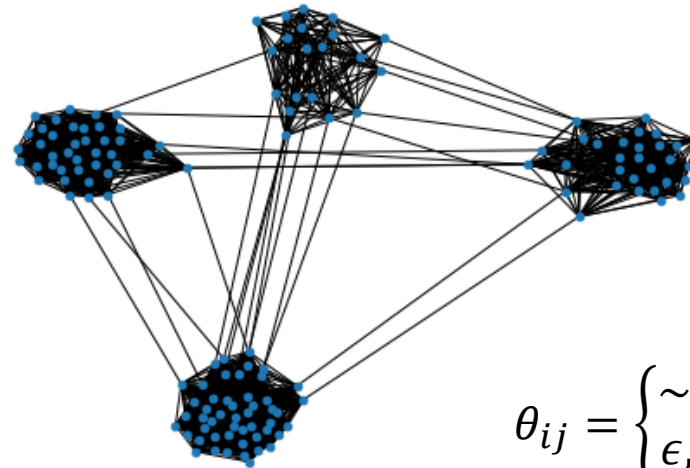
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Next, we will investigate how Proposition 1 relates to the specific characteristics of networks and users.

Stochastic Block Model (Holland et al. 1983)



$$\theta_{ij} = \begin{cases} \sim 1, & i = j \\ \epsilon, & |i - j| = 1 \\ 0, & |i - j| > 1 \end{cases}$$



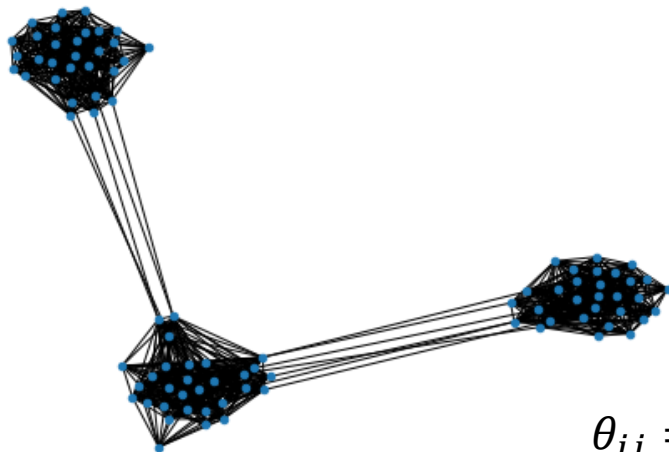
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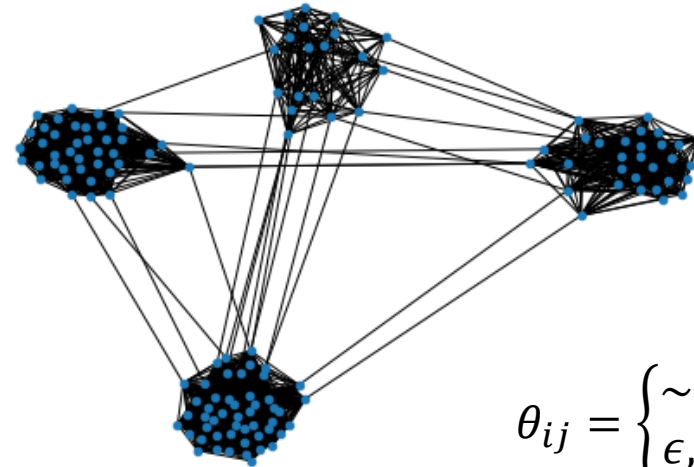
Why SBM?

- It can express various real-world networks with community structures

(McPherson et al. 2001,
Currarini et al. 2009)



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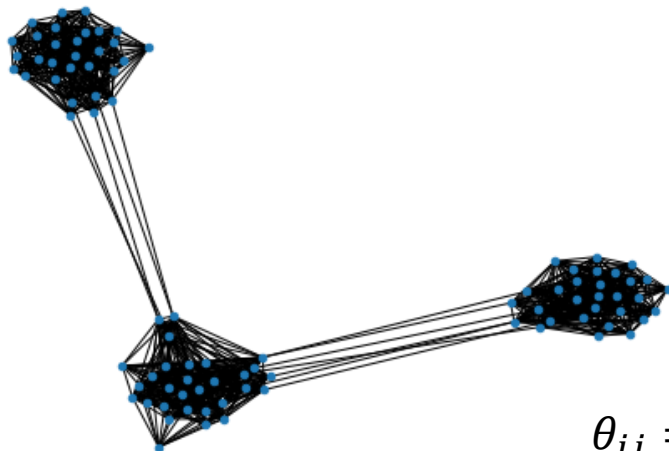
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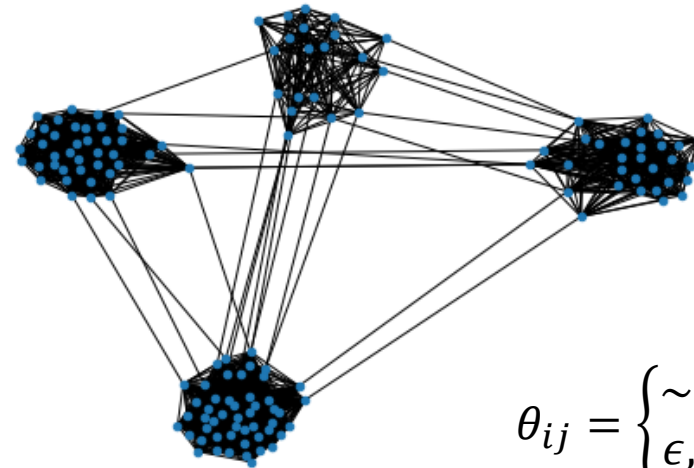
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What is SBM?

- n_i : the number of users in community i
- θ_{ij} : the probability of friendship between users in community i, j



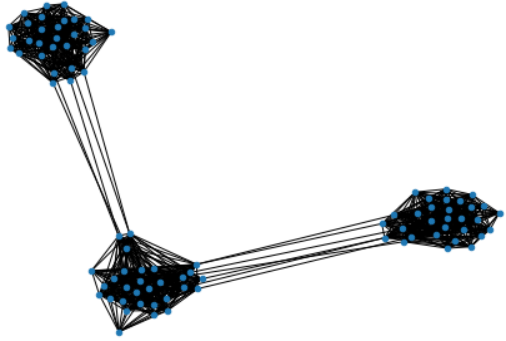
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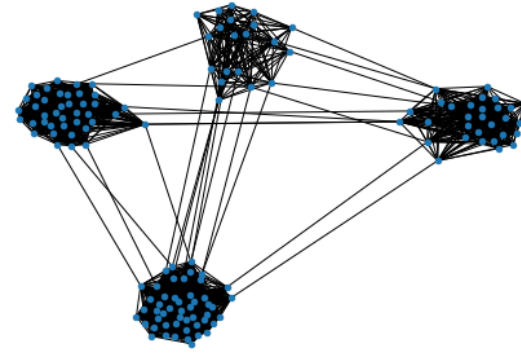
Stochastic Block Model

Chain of communities



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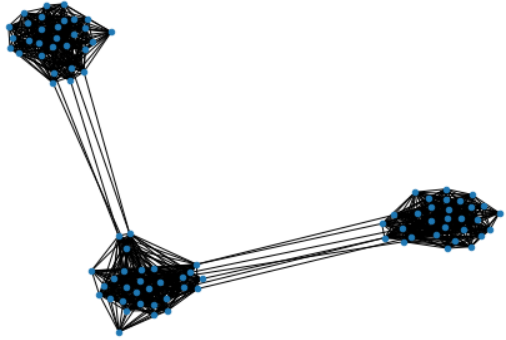
Complete graph of communities



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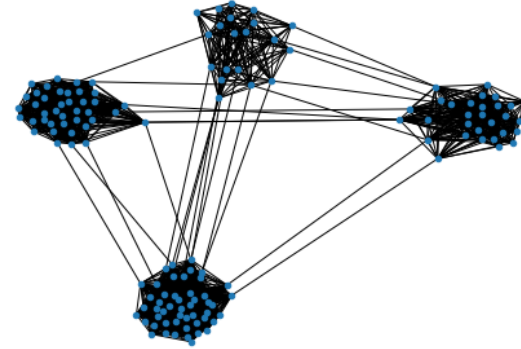
Stochastic Block Model

Chain of communities



$$\theta_{ij} = \begin{cases} \sim 1, & i = j \\ \epsilon, & |i - j| = 1 \\ 0, & |i - j| > 1 \end{cases}$$

Complete graph of communities



$$\theta_{ij} = \begin{cases} \sim 1, & i = j \\ \epsilon, & i \neq j \end{cases}$$

Theorem 2 (Sufficient condition for $\rho_{SE} = 0$ in SBM)

The strictest effective regulation is $\rho_{SE} = 0$ if

$$n_j \theta_{jj} b_A - b_B \geq \mu(1 - c) p_{iB} - \frac{\sum_{l=j+1}^m R_l}{\sum_{l=1}^j R_l} \mu c p_{iB}$$

for all $j = 1, \dots, m$.

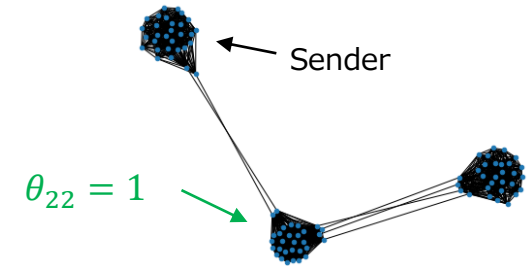
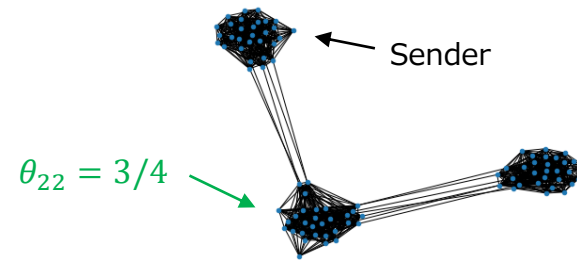
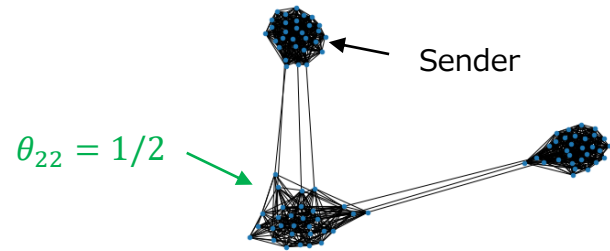
n_1, n_2, \dots, n_m : #users in cluster

For chain of communities, $p_{iB} = \begin{cases} p & j = 1 \\ p^{2j-2} & 2 \leq j \leq m \end{cases}$, $R_j = n_j p^{2j-1}$.

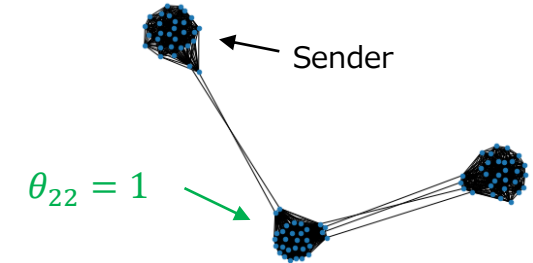
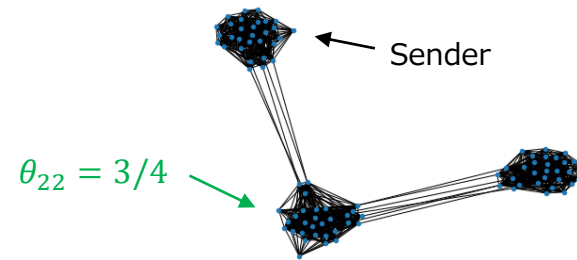
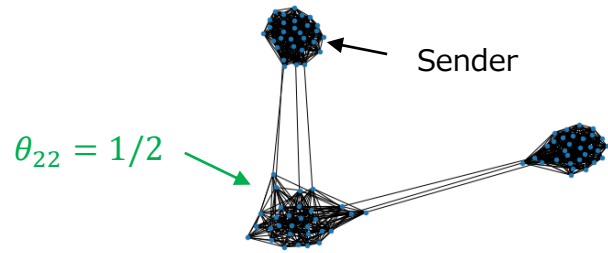
For complete graph of communities, $p_{iB} = \begin{cases} p & j = 1 \\ p^2 & 2 \leq j \leq m \end{cases}$, $R_j = \begin{cases} n_1 p & j = 1 \\ n_j p^3 & 2 \leq j \leq m \end{cases}$

See the meaning and implications in the following slides

Impact of in-between community structure on regulation

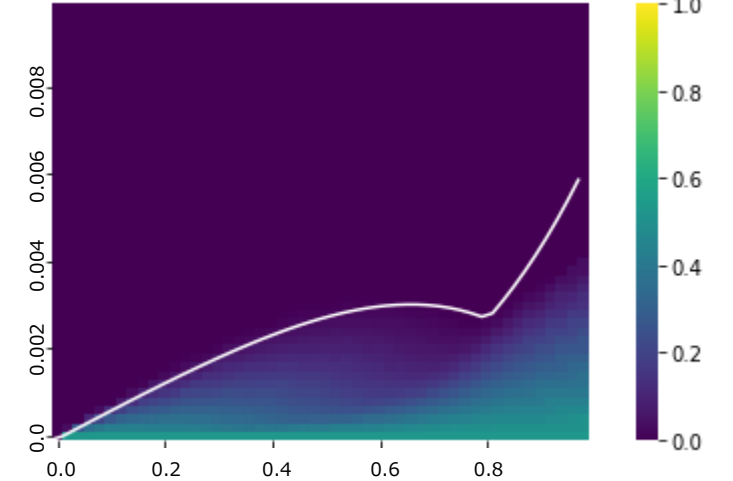
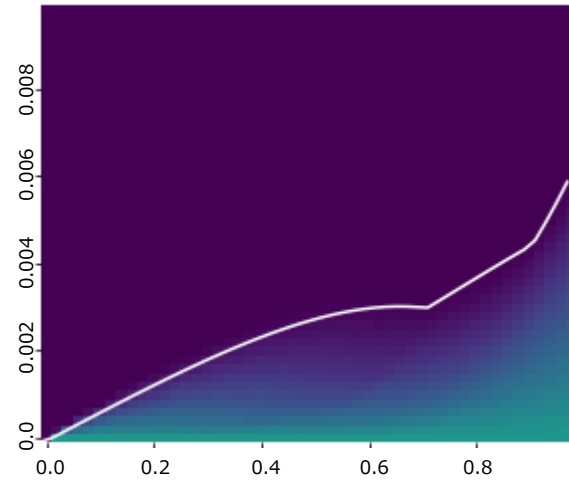
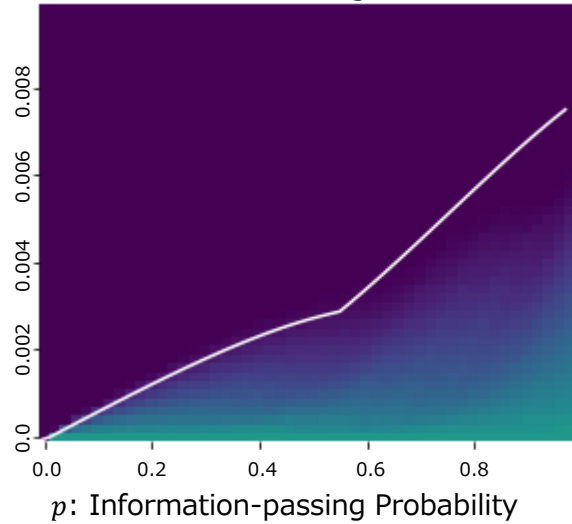


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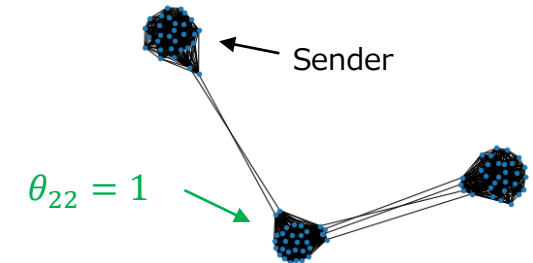
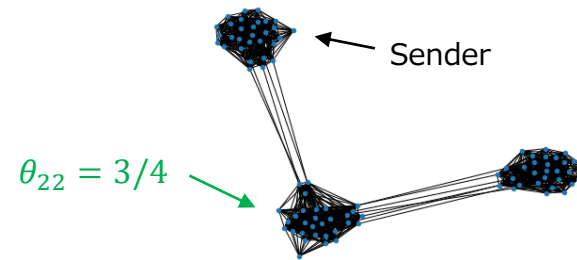
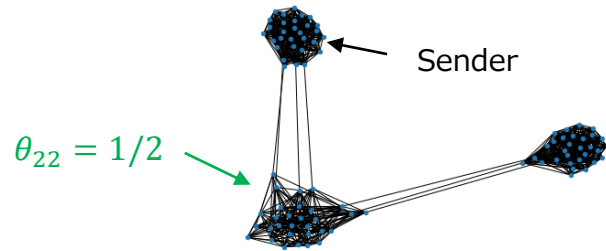


b_A : Social Interaction Quality in Platform A

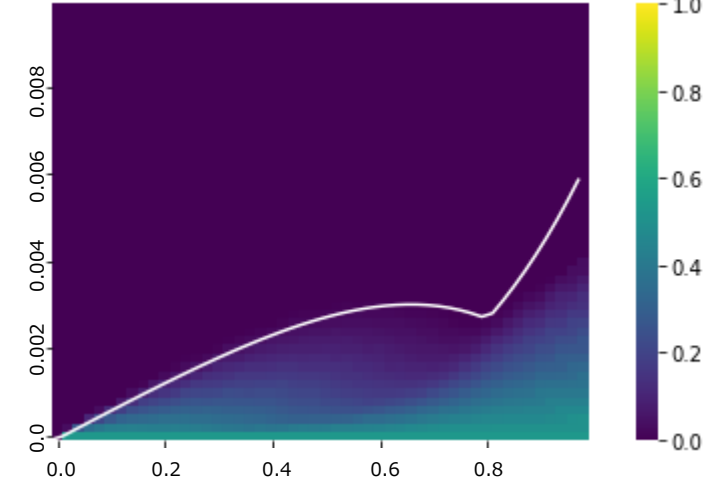
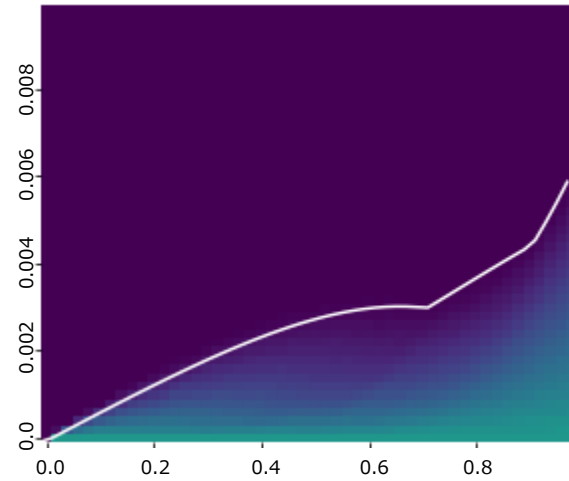
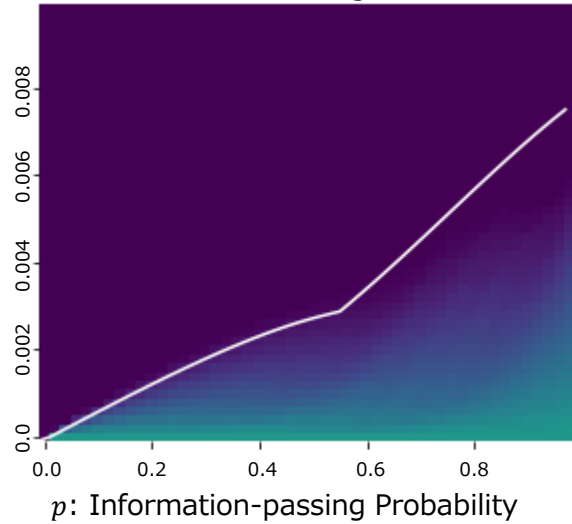
Strictest Effective Regulation in A



Impact of in-between community structure on regulation

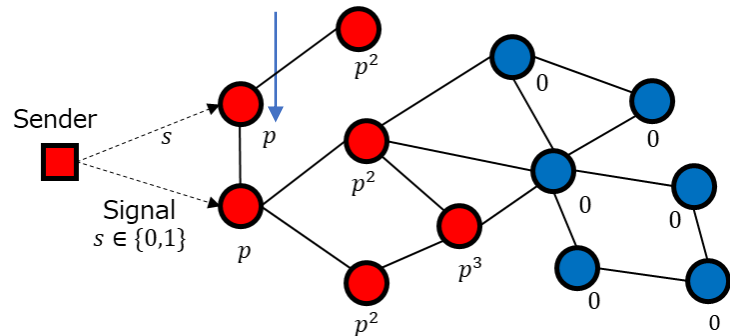


Strictest Effective Regulation in A

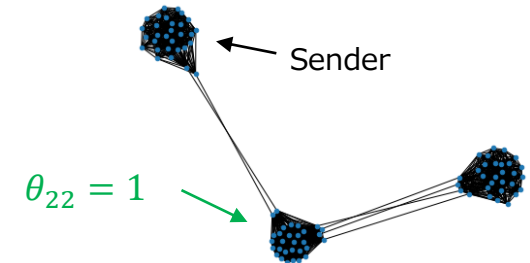
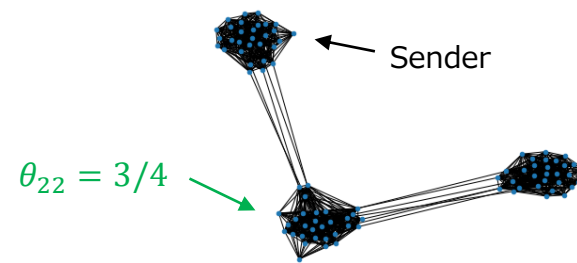
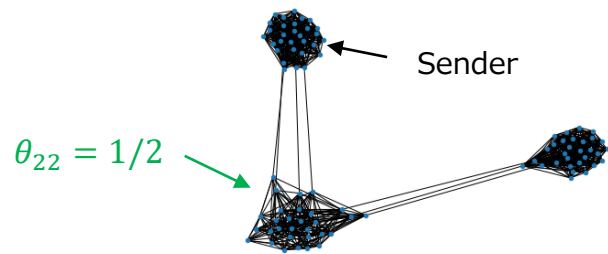


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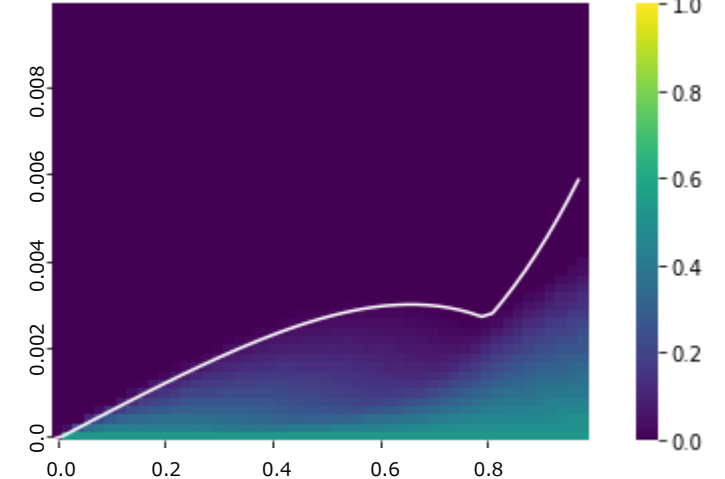
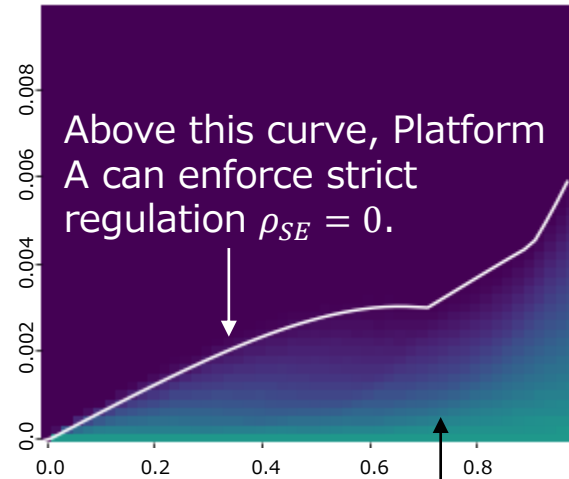
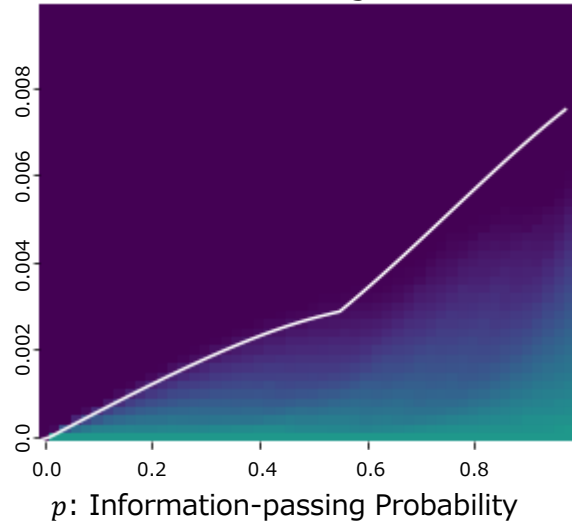
$$\Phi_{ij} = b_j N_{ij}$$



Impact of in-between community structure on regulation

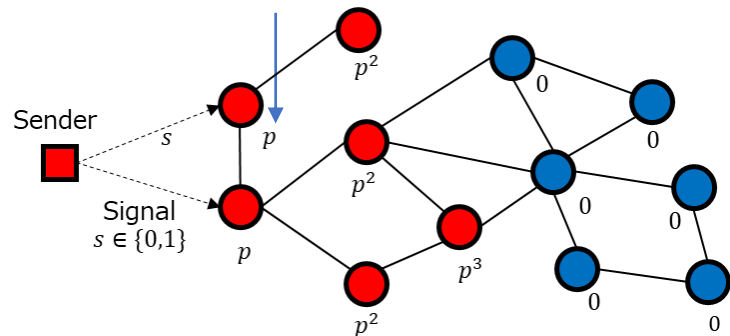


Strictest Effective Regulation in A



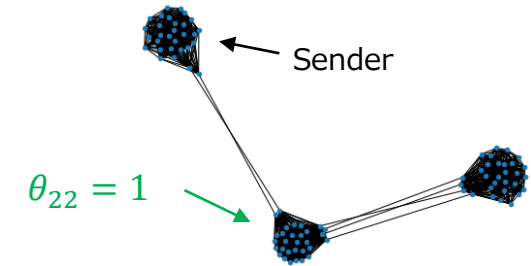
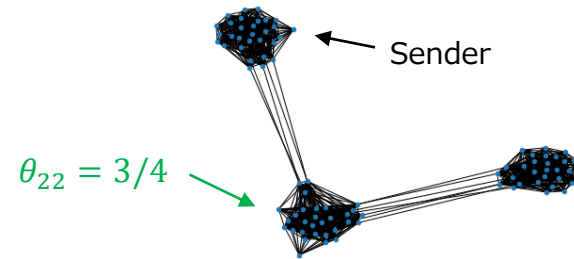
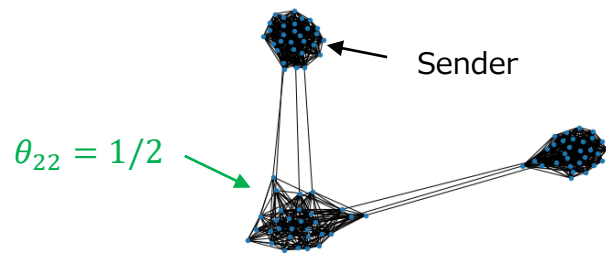
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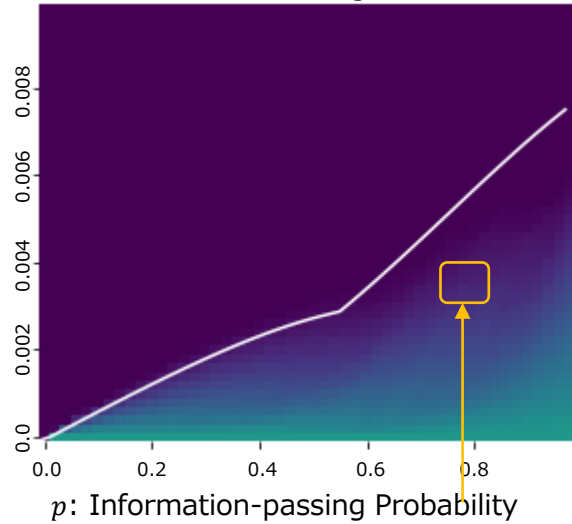
Platform A cannot enforce strict regulation. $\rho_{SE} > 0$.

Impact of in-between community structure on regulation

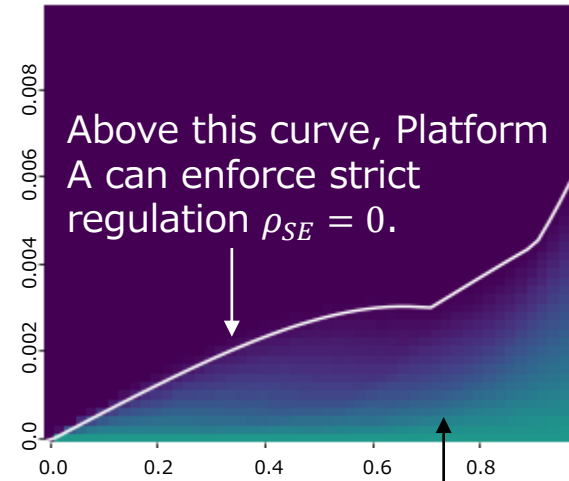


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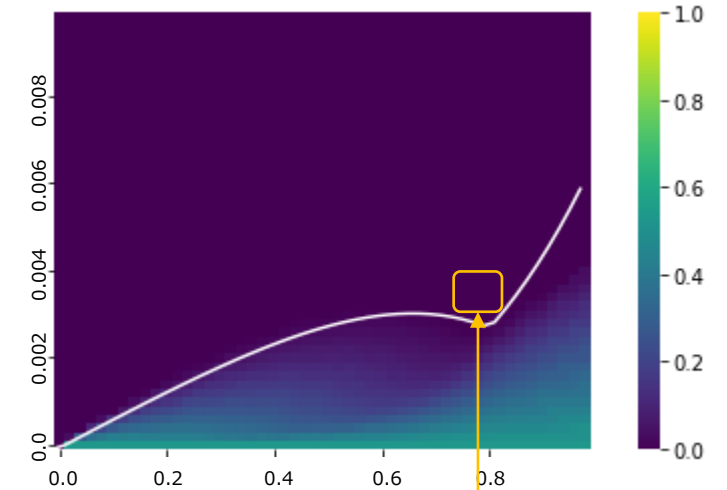
Strictest Effective Regulation in A



Platform A cannot set strict regulation.

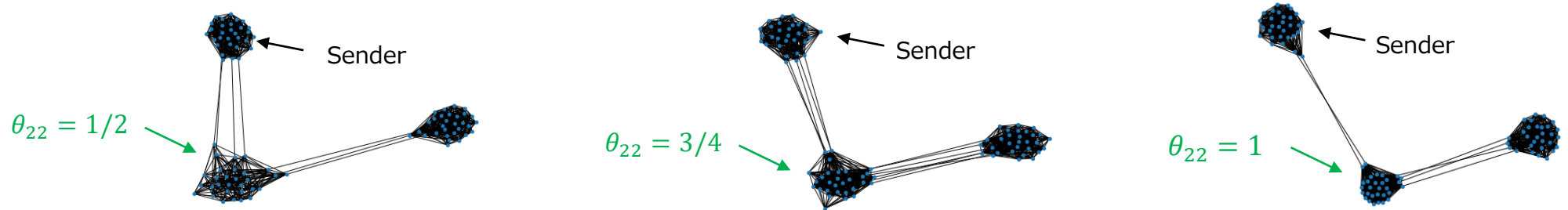


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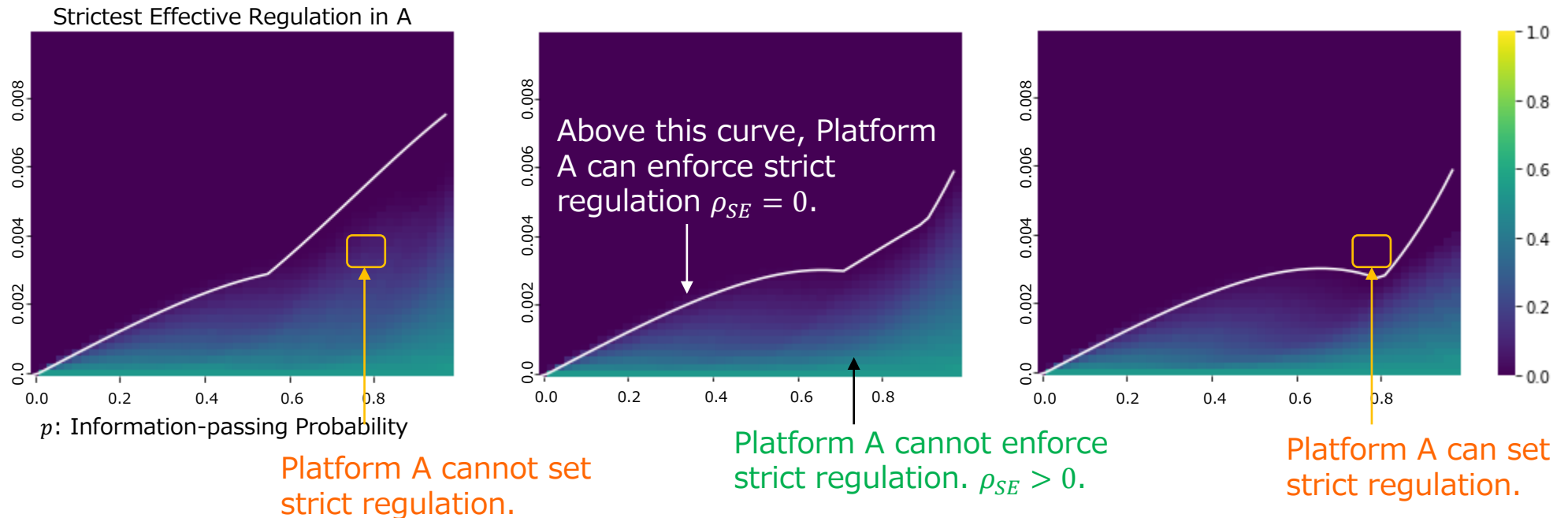


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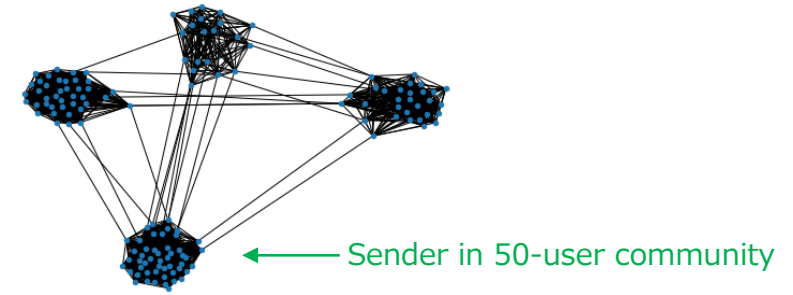
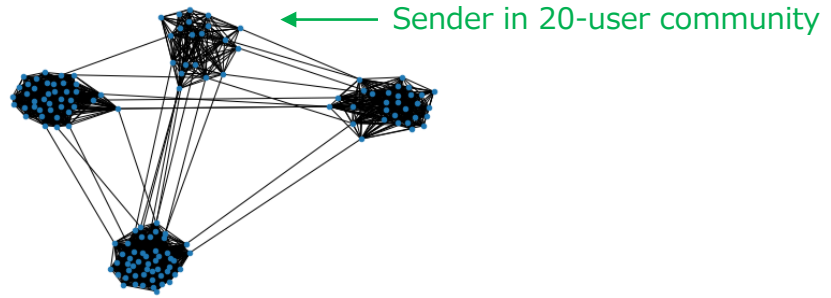


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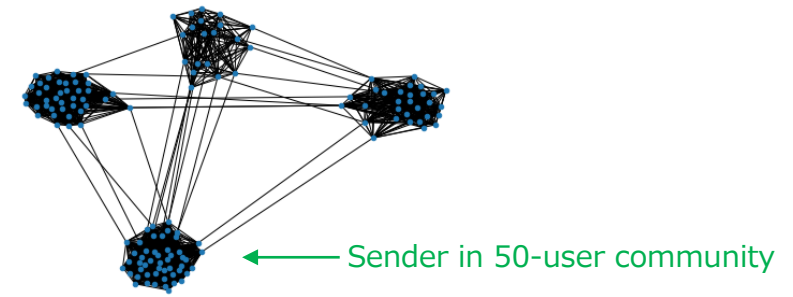
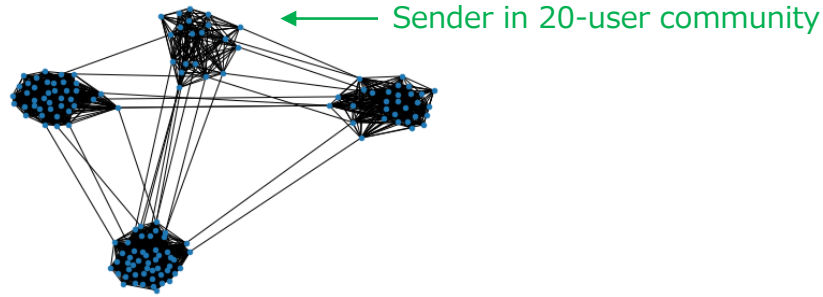


When p is high (information is diffusive), distant users become relatively important.
Since the tight community blocks user migration, it helps Platform A to set strict regulation.

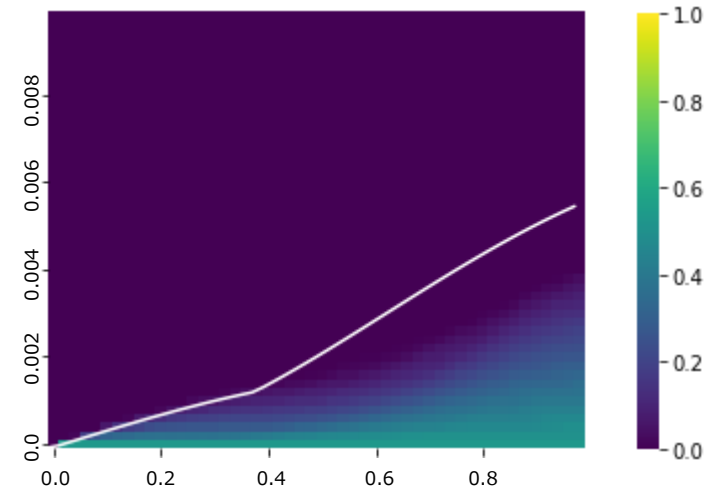
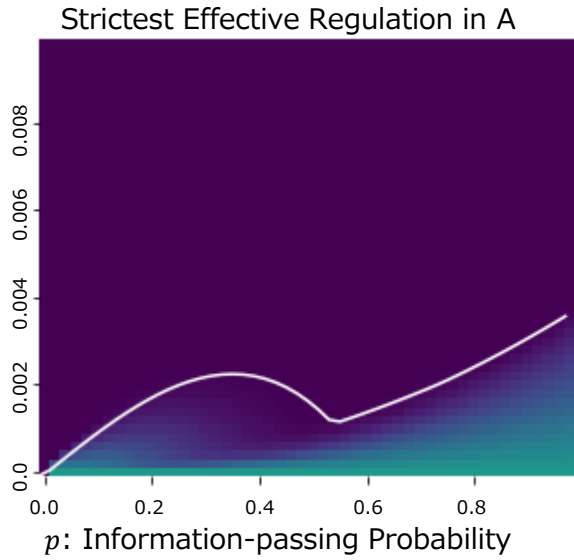
Impact of Sender's community size on regulation



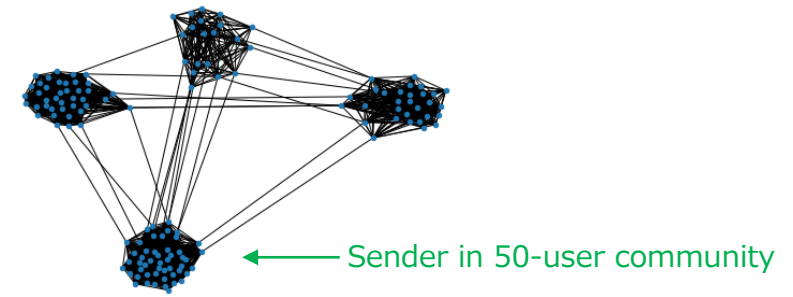
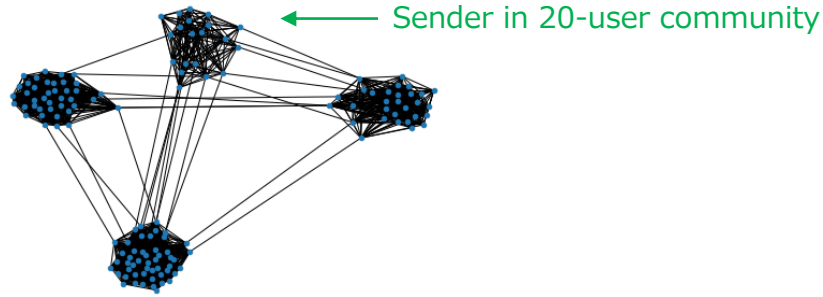
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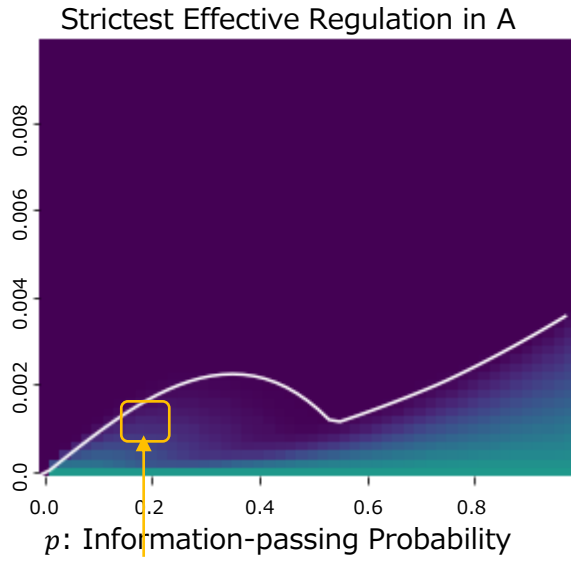
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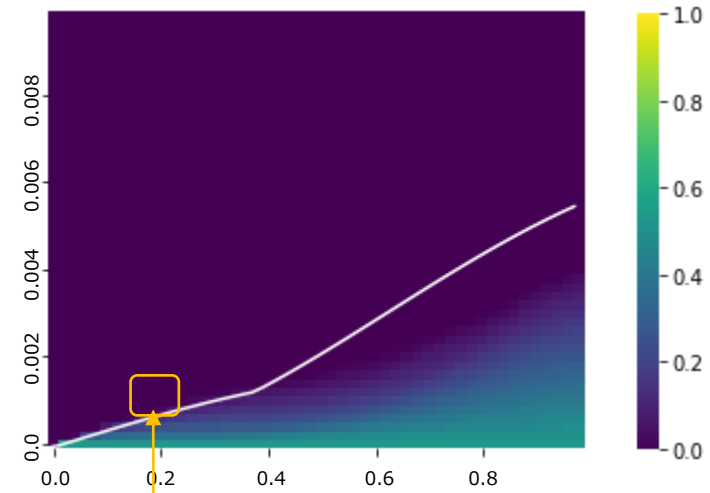
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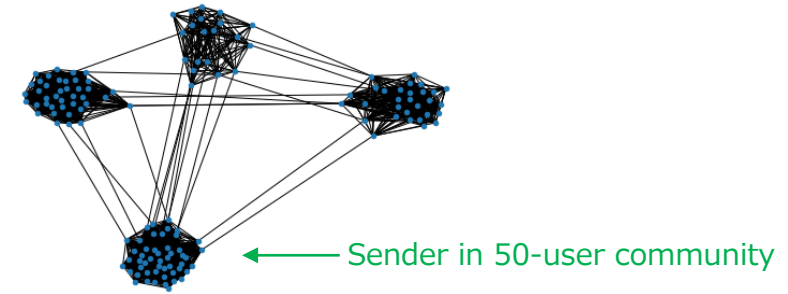
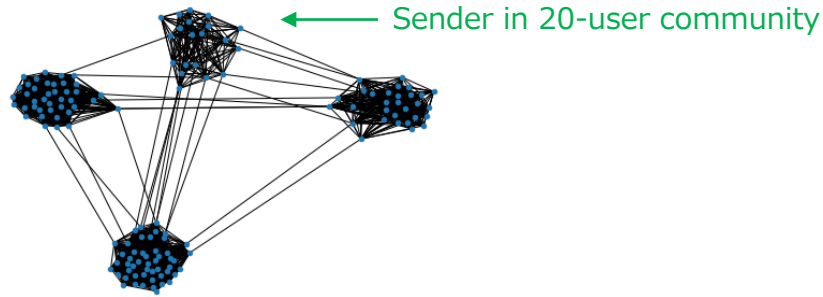


Platform A cannot set strict regulation.

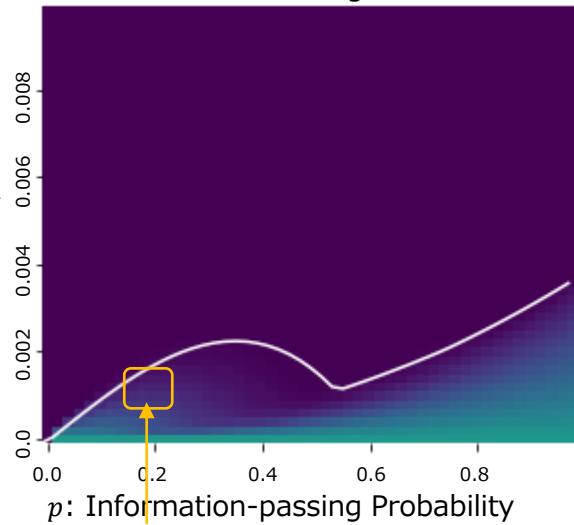


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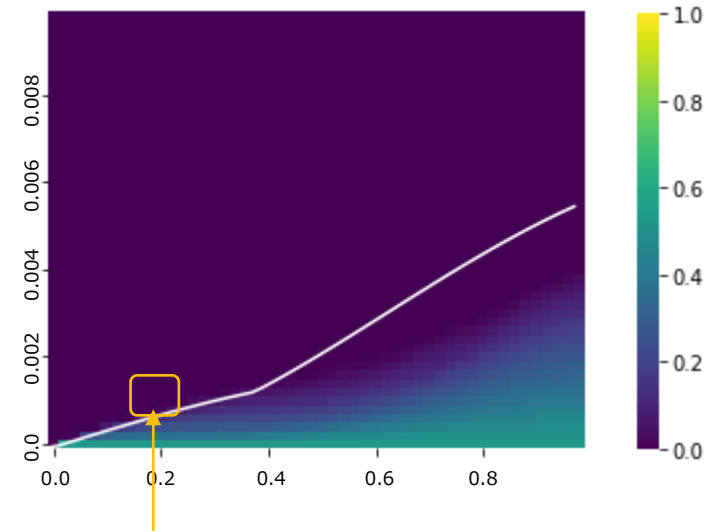
Impact of Sender's community size on regulation



Strictest Effective Regulation in A



Platform A cannot set strict regulation.



Platform A can set strict regulation.

When p is low (information is not diffusive), nearby users become relatively important. **Since a big community is less likely to change platforms, it helps Platform A to set strict regulation.**

Heterogeneous Users (Sympathizers & Non-sympathizers)

So far, all users had the same parameter c . Now, user i has c_i .

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Payoff for correctly estimating
the unsurprising world state $w = 0$.

| | $w = 0$ | $w = 1$ |
|---------------|---------|---------|
| $\hat{w} = 0$ | c | 0 |
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- Non-sympathizers (users with high c_i) tend to believe the unsurprising world state ($w = 0$).
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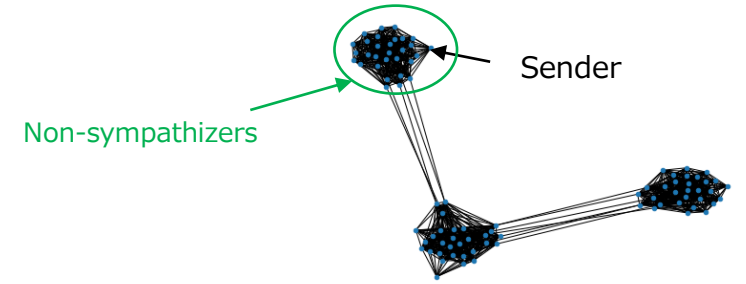
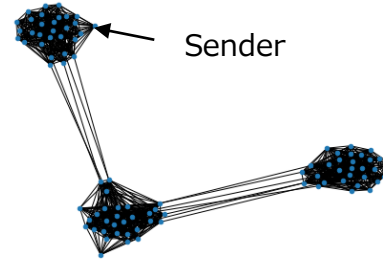
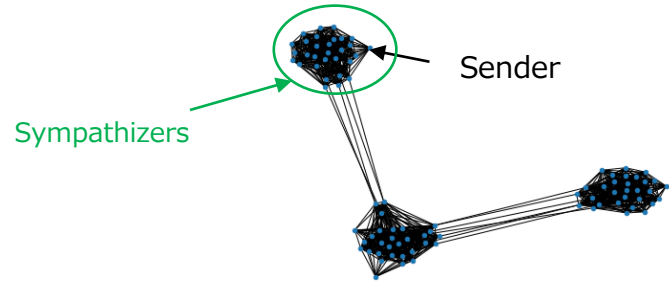
Theorem 3 (Sufficient condition for $\rho_{SE} = 0$ in heterogeneous SBM)

Suppose users in community j have c_j . The strictest effective regulation is $\rho_{SE} = 0$ if

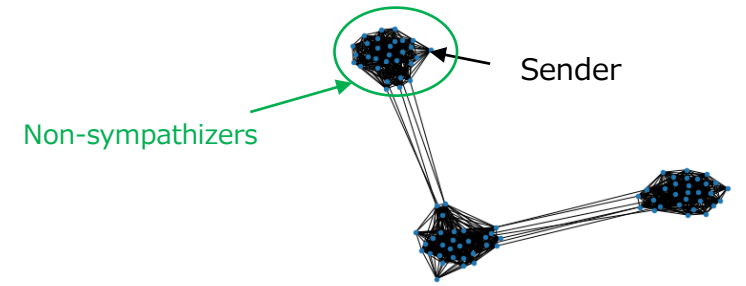
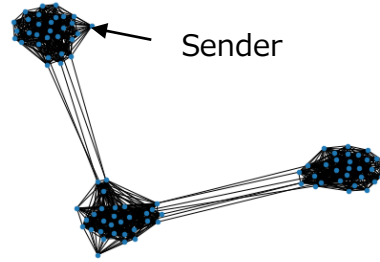
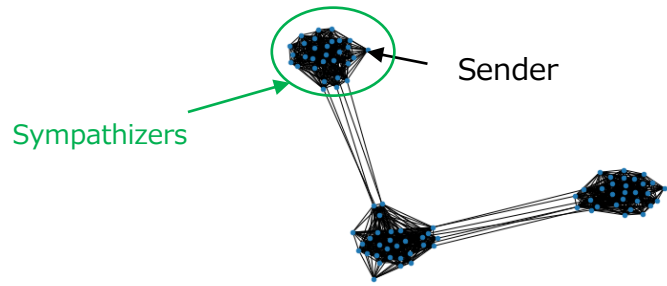
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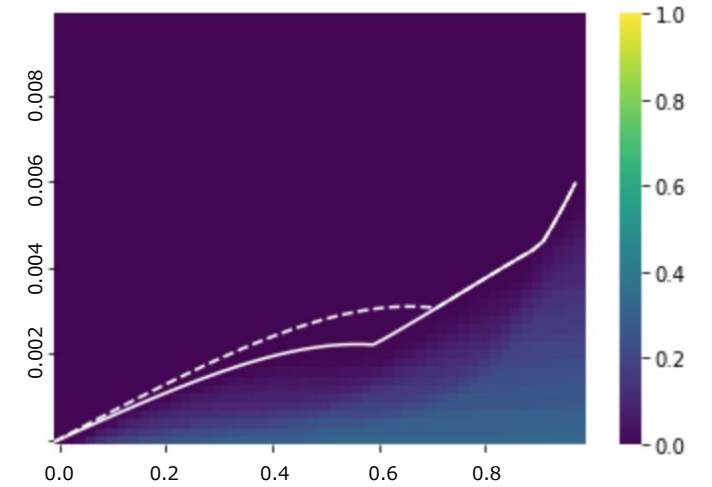
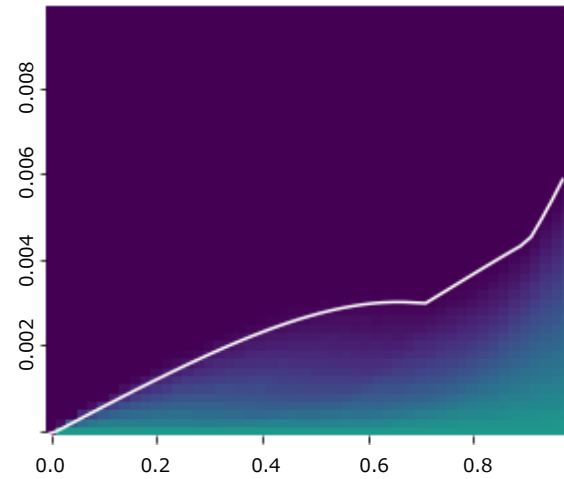
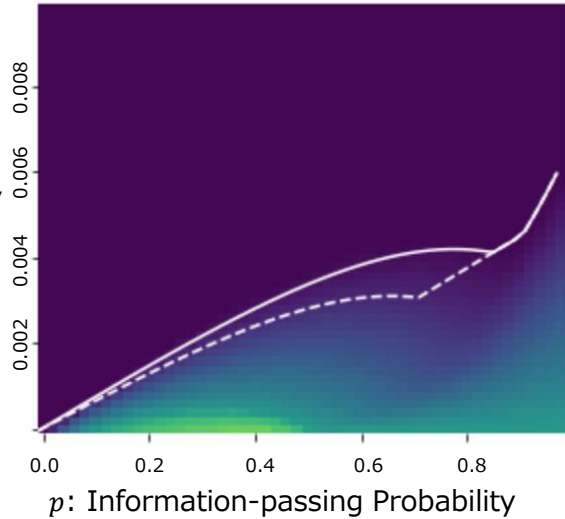
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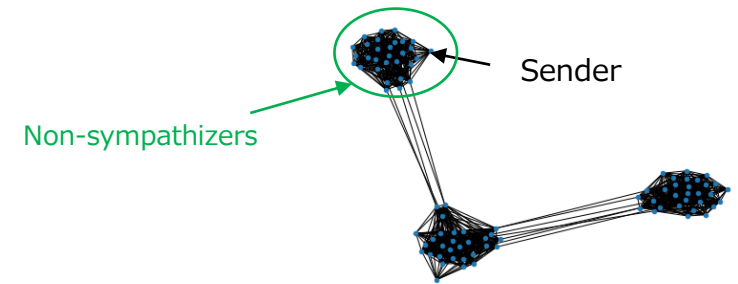
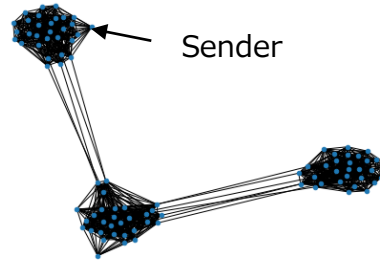
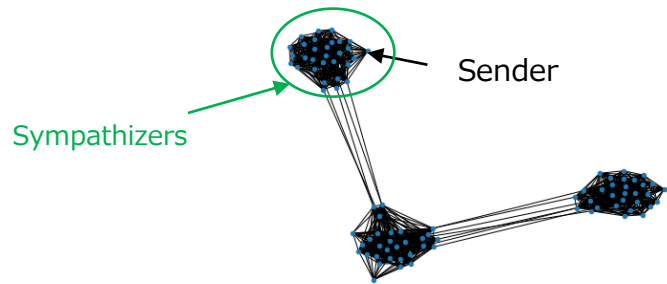


Strictest Effective Regulation in A



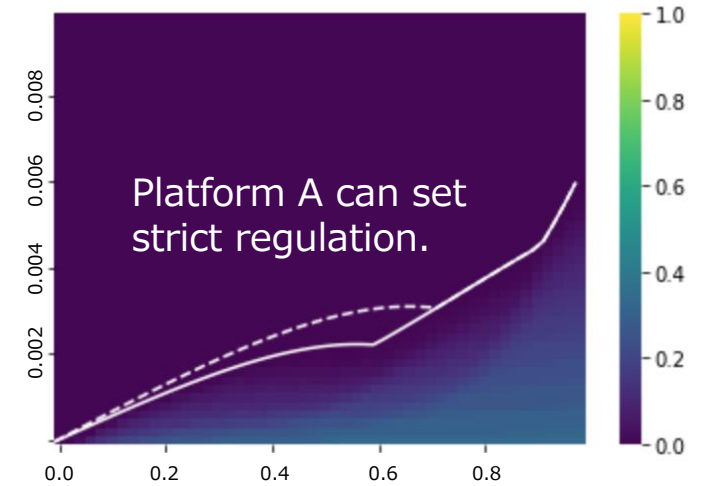
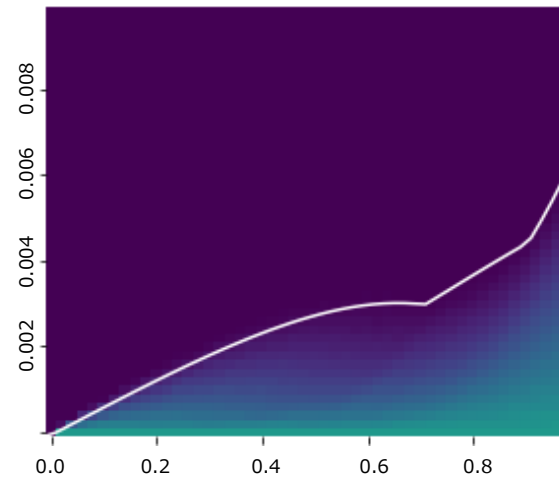
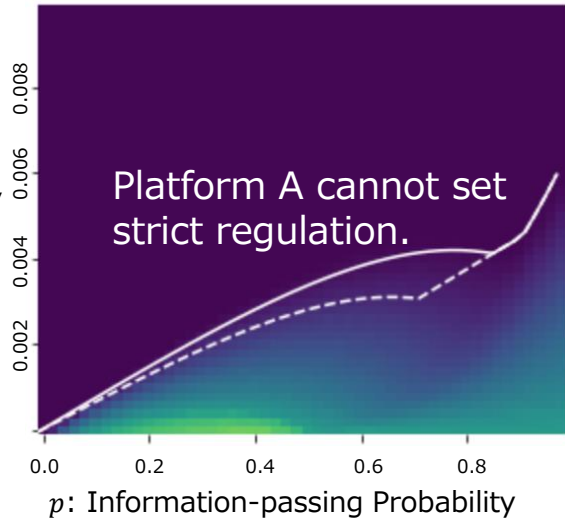
b_A : Social Interaction Quality in Platform A

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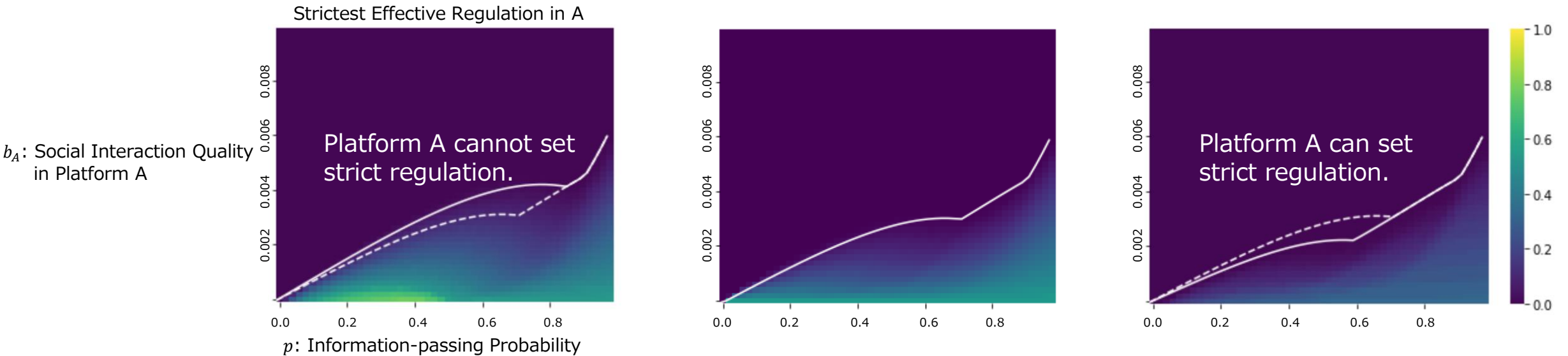
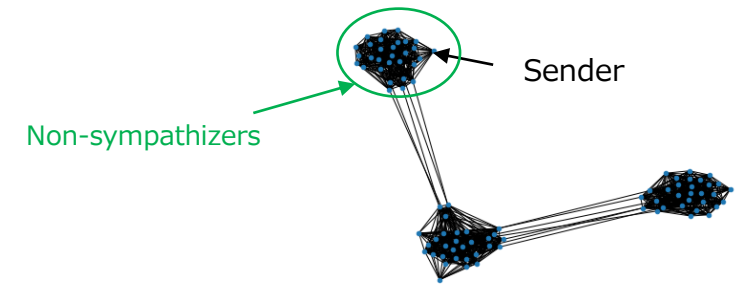
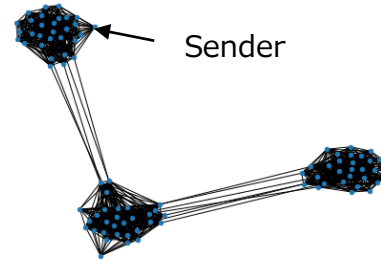
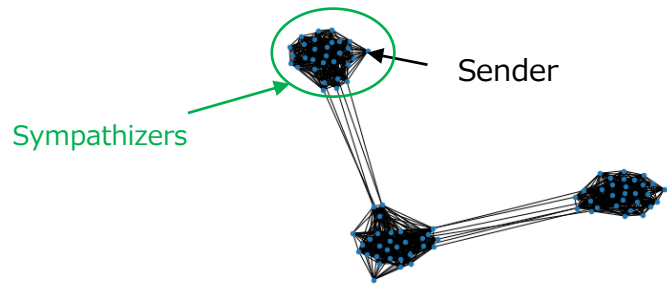


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Strictest Effective Regulation in A



Heterogeneous Users (Sympathizers & Non-sympathizers)



With sympathizers nearby, Sender has more power (Platform A can't set strict regulation).
But if p is high, sympathizers make less difference because distant users become important.

Discussion

- Why only two platforms? What if there are more than two?

Since social media has positive externalities, the two-platform case can be considered as the worst case for the dominant platform A.

(If users are distributed to many platforms, it is difficult for alternative platforms to become a strong competitor. So, platform A may enforce stricter regulation.)

- Why single-homing? What if a user can be on multiple platforms at the same time?

1. Then, users would be on platform A anyways.

2. Therefore, Platform A would enforce any strict regulation (i.e., $\rho_A = 0$).

3. Influencer would move to platform B and become deceitful ($\beta = \beta'$).

4. As a result, the information quality becomes worse despite the strict regulation.

→ For more discussion, we should consider the cost of multi-homing.

- Why singular influencer? What if there are some?

Suppose multiple senders S_1, S_2, \dots have the access to the same world state and coordinate their strategies.

Then this situation is almost the same as with a fictitious singular sender S connected to user nodes S_1, S_2, \dots .

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Then this situation is almost the same as with a fictitious singular sender S connected to user nodes S_1, S_2, \dots .

Discussion

- Why only two platforms? What if there are more than two?

Since social media has positive externalities, the two-platform case can be considered as the worst case for the dominant platform A.

(If users are distributed to many platforms, it is difficult for alternative platforms to become a strong competitor. So, platform A may enforce stricter regulation.)

- Why single-homing? What if a user can be on multiple platforms at the same time?

1. Then, users would be on platform A anyways.

2. Therefore, Platform A would enforce any strict regulation (i.e., $\rho_A = 0$).

3. Influencer would move to platform B and become deceitful ($\beta = \beta'$).

4. As a result, the information quality becomes worse despite the strict regulation.

→ For more discussion, we should consider the cost of multi-homing.

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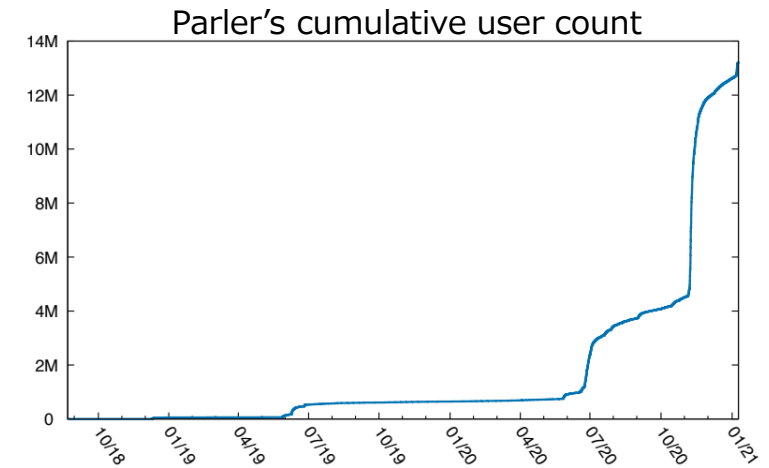
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 - Because they have different value of p (the diffusiveness of messages)?
 - Because the network structures for Trump and his followers (sympathizers) are different?

Thanks for your attention!

I'm looking for collaboration partners/ideas!

Impact of regulation on platform competition

Alternative platform's user growth shows jumps in response to the choice by other platforms to label or remove content from prominent individuals



A new platform emerges as a result of intensified regulation in mainstream platforms

