## Discussion of Marco Galbiati and Kimmo Soramäki's

## Dynamic model of funding in interbank payment systems

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## Outline of the discussion

1. "Dynamic model of funding in interbank payment systems": Sum-up
2. Discussion of the model's assumptions
3. Possible applications in terms of policy and oversight for the Central Banks

## Model Sum-Up

- Funding game: banks' decisions
- Each bank i has to choose its liquidity level $\mathrm{a}_{\mathrm{i}}$
- Bank i faces costs associated with its liquidity $\mathrm{a}_{\mathrm{i}}$
- Bank i also faces delay costs that depend on $a_{i}$ and also on $\left(a_{k}\right)_{k \neq i}$
- Each bank i sets $a_{i}$ so as to minimize its total costs
- Nash equilibrium is reached when no


Learn about Bayesian updates and Nash equilibriums !! bank can gain by unitarily changing its liquidity level $a_{i}$, the $\left(a_{k}\right)_{k \neq i}$ being fixed

- The equilibrium in the game is thus the combination of the best individual strategies.


## Model Sum-Up

- Funding game: pay-off matrix
- Simulation result: bank i's delay only depends on $\mathrm{a}_{\mathrm{i}}$ and $\sum_{k=1, k e z i}^{N} a_{k}$
- Assumption: All banks are the same
- Consequence: they will all make the same choice ( 0 or 1 )
- In the example, banks don't care about delay: as long as there is more than zero liquidity in the system (things can settle) they have high welfare Bank i

Bank i
chooses 0
liquidity
chooses 1 liquidity

Nobody provides liquidity: nothing settles, everybody loses a lot

All other banks
choose 0
All other banks choose 1

| Bank i: -10 <br> Other banks: -10 | Bank i: -3 <br> Other banks: 0 | Bank i provides liquidity, the other <br> banks free ride, bank i loses <br> The other banks provide liquidity, |
| :---: | :---: | :---: |
| Bank i: 0 <br> Other banks: -3 | Bank i: -2 <br> Other banks: -2 | Eneryone provides liquidity |

Question 1: This is a pure hawk-dove payoff matrix. In the funding model, is the liquidity increase from $(\mathrm{N}-1)$ to N sufficient to increase the other banks' welfare from -3 to -2 ?

## Model Sum-Up

## - Funding game:

- Repeated funding game with learning process
- Bayesian learning process:
- Bank i starts with believing equal probability for other banks' actions (1-1)
- Then it makes sense to choose 1 (lower average cost). Bank i chooses 1
- As all banks are the same, it means that all banks choose 1.
- Bank i observes that the other banks choose 1 and updates its beliefs (1 more dot in the 1 case)

Bank i's beliefs regarding
the other banks


| Average | Average |
| :---: | :---: |
| cost: -5 | cost: -2.5 |
| Bank i chooses 0 liquidity | Bank i chooses 1 liquidity |
| Bank i: -10 <br> Other banks: -10 | Bank i: -3 <br> Other banks: 0 |
| Bank i: 0 <br> Other banks: -3 | Bank i: -2 <br> Other banks: -2 |

## Model Sum-Up

## - Funding game:

- Repeated funding game with learning process
- Bayesian learning process:
- Bank i starts with believing 33\% for other banks choosing 0 (1-2)
- Then it makes sense to choose 1 (lower average cost). Bank i chooses 1
- As all banks are the same, it means that all banks choose 1.
- Bank i observes that the other banks choose 1 and updates its beliefs (1 more dot in the 1 case)



## Model Sum-Up

## - Funding game:

- Repeated funding game with learning process
- Bayesian learning process:
- Bank i starts with believing $25 \%$ for other banks choosing 0 (1-3)
- Then it makes sense to choose 1 (lower average cost). Bank i chooses 1
- As all banks are the same, it means that all banks choose 1.
- Bank i observes that the other banks choose 1 and updates its beliefs (1 more dot in the 1 case)



## Model Sum-Up

## - Funding game:

- Repeated funding game with learning process
- Bayesian learning process:
- Bank i starts with believing 20\% for other banks choosing 0 (1-4)
- Then it makes sense to choose 0 (lower average cost). Bank i chooses 0
- As all banks are the same, it means that all banks choose 0.
- Bank i observes that the other banks choose 0 and updates its beliefs (1 more dot in the 0 case)



## Model Sum-Up

## - Funding game:

- Repeated funding game with learning process
- Result:
- All banks choose 1
- All banks choose 1
- All banks choose 1
- All banks choose 0
- All banks choose 1...

Bank i's beliefs regarding the other banks


A mixed Nash equilibrium is reached in which :

- All banks choose 1 with 78 \% chance
- All banks choose 0 with 22 \% chance

| Bank i's beliefs regarding the other banks |  |  | All other choose 0 | Average cost: -5 | Average cost: -2.5 <br> Bank i chooses 1 liquidity |
| :---: | :---: | :---: | :---: | :---: | :---: |
| All other banks | All other banks |  |  | Bank i <br> chooses 0 liquidity |  |
| choose 0 | choose 1 |  |  | Bank i: -10 | Banki i - 3 |
| - - | - - - - |  |  | Other banks: 10 | Other banks. 0 |
|  |  | 66 \% | All other banks choose 1 | Bank i: 0 Other banks: -3 | Bank i: -2 Other banks: -2 |

## Discussion of the model's assumptions

## - Question 2 (for game theorists):

- The model is based on the following assumptions
- All banks are similar
- They have limited intelligence: their expectations are only based on their previous observations
- As each bank has only observed "all other banks choose 1 " or "all other banks choose 0", each bank expects it to continue...
- ... hence the "all other banks" against "bank i" matrix
- However the initial assumption: "Bank i starts with believing there is $50 \%$ chance for all other banks choosing 0 and $50 \%$ chance for all others choosing $1^{\prime \prime}$ is extremely strong:
- ... Much stronger than the "all banks are similar" assumption
- All banks being similar in their behaviour does not mean all the realizations of their actions will be similar
- If one throws 10 similar dices, it is unlikely that all dices will yield the same figure
- As they have never witnessed anything else, the banks will continue to assume an "all 0 " or "all 1"
- Conclusion: it would be nice to drop the "all banks behave the same", and investigate the N -player game... Maybe starting with $\mathrm{N}=3$


## Discussion of the model's assumptions

## - Bank's cost function

$$
\operatorname{Cost}_{i}=\alpha_{i} a_{i}+\beta_{i} \text { Delay }_{\text {emitted by i }}
$$

- Do banks care only about the settlement delay of their sent payments ?
- Probably not as receiving a payment allows a bank to credit one of its customers. A safer bet would be:

$$
\operatorname{Cost}_{i}=\alpha_{i} a_{i}+\beta_{i} \text { Delay }_{\text {emitted by } i}+\gamma_{i} \text { Delay }_{\text {received by } \mathrm{i}}
$$

- Are all banks similar ?
- The cost of liquidity will depend on a bank's obligatory reserve and portfolio
- The cost of delay will depend on a bank's activity
- Introducing heterogeneity in the preferences is next step...
- Moreover, the fact that bank i's delay only depends on $\mathrm{a}_{\mathrm{i}}$ and on $\sum_{k=1, k \neq i}^{N} a_{k}$ is a consequence of the complete isotropic network...


## Possible applications in terms of policy and oversight

## - A reasonable delay function...



Delay Vs funds (as presented by Galbiati and Soramäki)


Delay Vs funds (fitted)

$$
\text { Delay }_{i}=0.2 \times e^{-\frac{a_{i}}{s}} \times e^{-\frac{<j>}{t}}=f\left(a_{i}\right) \times g\left(\sum_{k=1}^{N} a_{k}\right)
$$

# Possible applications in terms of policy and oversight 

## - Total Welfare against Individual Welfares...

$$
\operatorname{Cost}_{i}=\alpha_{i} a_{i}+\beta_{i} \times f\left(a_{i}\right) \times g\left(\sum_{k=1}^{N} a_{k}\right)
$$

$$
\frac{\partial \operatorname{Cost}_{i}}{\partial a_{i}}=\alpha_{i}+\beta_{i} \times f^{\prime}\left(a_{i}\right) \times g\left(\sum_{k=1}^{N} a_{k}\right), \dot{A}^{\prime} \beta_{i} \times f\left(a_{i}\right)^{\prime} \times g^{\prime}\left(\sum_{k=1}^{N} a_{k}\right)=0
$$

$$
\frac{\partial \text { Total Cost }}{\partial a_{i}}=\alpha_{i}+\beta_{i} \times f^{\prime}\left(a_{i}\right) \times g\left(\sum_{k=1}^{N} a_{k}\right)_{i}^{4} \sum_{k=1}^{N} \beta_{k} f\left(a_{k}\right){ }^{\prime} g^{\prime}\left(\sum_{k=1}^{N} a_{k}\right)=0
$$

The social planner will take into account the externalities created
by bank i's decision

## Possible applications in terms of policy and oversight

- Total Welfare against Individual Welfares...
- The combination of the best individual strategies will lead to a smaller total welfare than what a social planner would achieve.
- Question 3 (to Marco \& Kimmo) : In your model (with heterogeneous banks) can the Central Bank, by charging less for promptly settled payments, or by imposing a settlement schedule (f.ex. 60\% settled before 12.00 ), increase the total welfare ?
- Question 4 (to the Overseers in the audience) : Is it part of the Central Bank's role ?


## Possible applications in terms of policy and oversight

- Banks' trade-off between delays and liquidity costs
- Your situation as a system operator:
- The banks in your system use a total liquidity of 100
- Resulting in a total liquidity cost of $80 . .$.
- ...and a total delay cost of 50.
- Total cost for the banks is thus 130.
- A new offsetting algorithm has been designed
- It dramatically reduces the total delay for a given level of liquidity in the system
- After the algorithm has been implemented:
- The banks in your system use a total liquidity of 50
- Resulting in a total liquidity cost of 40 ...
- ...and a total delay cost of 70.
- Total cost for the banks is thus 110.


## Possible applications in terms of policy and oversight

- Banks' trade-off between delays and liquidity costs
- Before: Cost for the banks 130, Total Delay 50
- After: Cost for the banks 110, Total Delay 70
- Result:
- The banks are happy...
- ... Your boss is not and says the risks have increased
- Question 4 (to Marco \& Kimmo): Could your model predict this outcome for a reasonable delay function ??
- Question 5 (to the Overseers in the room): WWOD ??
- What Would the Overseer Do? Keep the new algorithm or not?
- CPSS Core Principle IV: 'The system should provide prompt final settlement on the day of value..."
- CPSS Core Principle VIII: 'The system should provide a means of making payments which is practical for its users and efficient for the economy"


## Conclusions

- Unifying the simulation approach and the game theory approach is of great interest
- Very promising start
- Bank heterogeneity would be a good next step towards more realism
- Some oversight and policy applications
- The behaviour of the banks in practice is sometimes very hard to predict (and model)...

