

# Cooperative behaviour in a blockchain for humanitarian aid during the COVID- 19 pandemic

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# Models



## Multilayer Networks

*Co-evolution*  
*Multireciprocity*  
*Multicommunity*  
*Network completion*

## Temporal Networks

*Network growth and evolution*  
*Burstiness*  
*Microdynamics*  
*Temporal motifs*  
*Graph Evolution rules*

## AI on Graphs

*Graph Neural Networks*  
*Link prediction*  
*Graph embedding*  
*Node classification*  
*Strength prediction*

# Applications

## Urban Networks

*Mobility network*  
*On-phone networks*  
*Human behavior*

## Online social networks

*Blockchain online social networks*  
*User migration*

## Economic Networks

*Transaction networks*  
*NFT sales networks*

## Mobile Networks

*Opportunistic networks*  
*Edge computing*  
*5G and 6G*

# Web3

A PARADIGM FOR A DECENTRALIZED WEB



Over-centralization



Decentralization by blockchains

- Web3 services:
  - ▶ Decentralized Finance (DeFi)
  - ▶ Decentralized Autonomous Organization (DAO)
  - ▶ Non-fungible Token (NFT)
  - ▶ Decentralized Online Social Media

# Blockchain for Good



- Blockchain for humanitarian aid
  - Delivery of financial aid
  - Fight corruption
  - Secure digital identities
  - Coordination among NPOs

Building blocks – UN blockchain project - supports identification and access to food for Jordans' Refugee; through a scan the iris. [Building blocks WFP Image](#)

# Delivering financial aid

- Standard: cash transfers and vouchers
- Complementary currencies
  - ▶ Currencies that support the official national currency
  - ▶ A.k.a. local / community currencies (4,500+)
  - ▶ Studies on them in COVID-19 pandemic
    - Mumbuca E-Dinheiro, Brazil
    - Zielony, Poland
    - Sarafu, Kenya





# Sarafu

- Digital complementary currency system
- Payments using mobile phones, transferring digital tokens



Image from <https://www.youtube.com/watch?v=eT53cREs6hU>



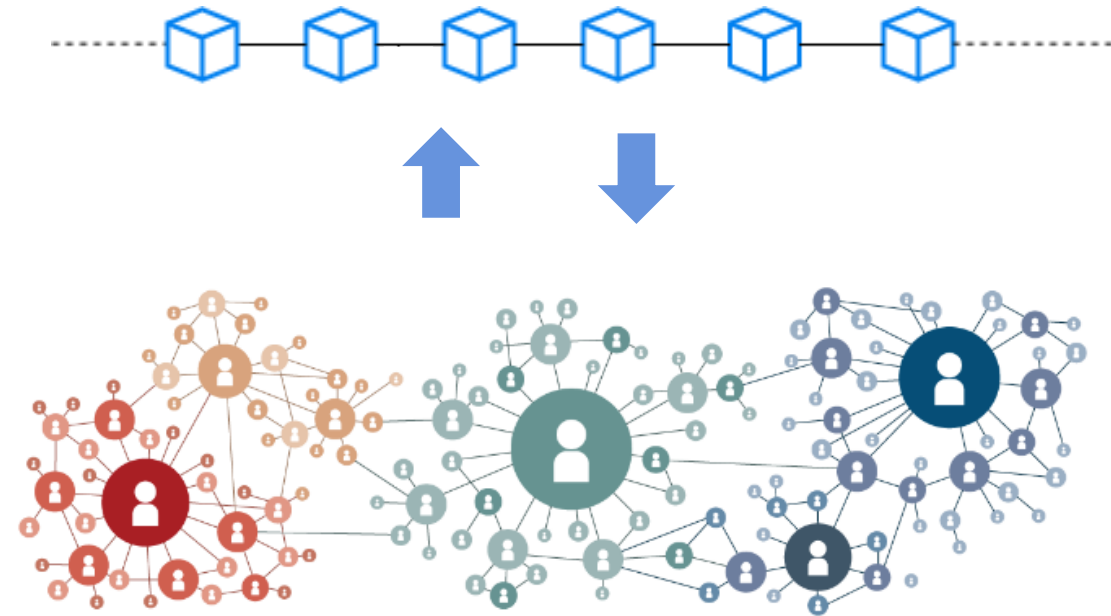
Image from <https://www.youtube.com/watch?v=uYeyFuJi4UM>

# Sarafu

- Collaboration with Red Cross for humanitarian aid during the COVID-19 pandemic
- Kitabu Blockchain

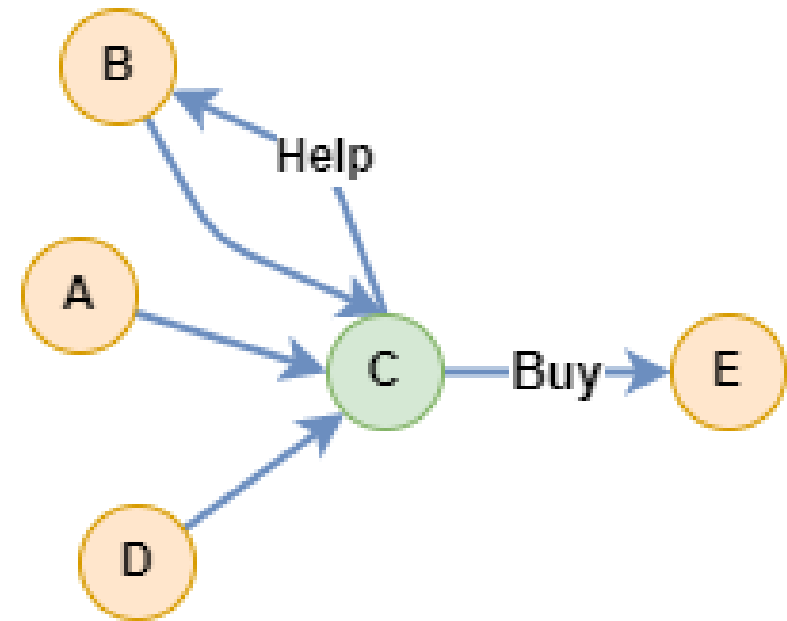


Image from <https://www.youtube.com/watch?v=uYeyFuJi4UM>



# Cooperation in Sarafu

- Group account
  - ▶ Special type of account
  - ▶ Chamas community savings groups, that save and lend currency
  - ▶ Save and lend Sarafu tokens
  - ▶ Cooperation
- The higher amount of currency handled by group accounts, the greater the cooperation





# Research questions

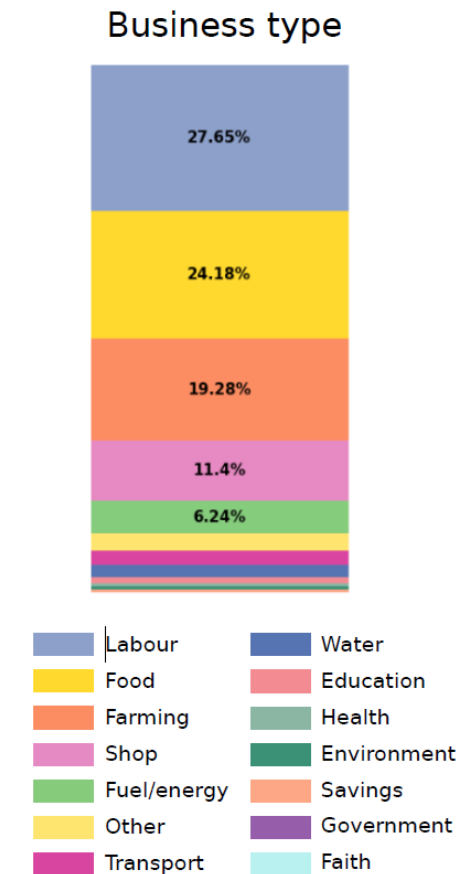
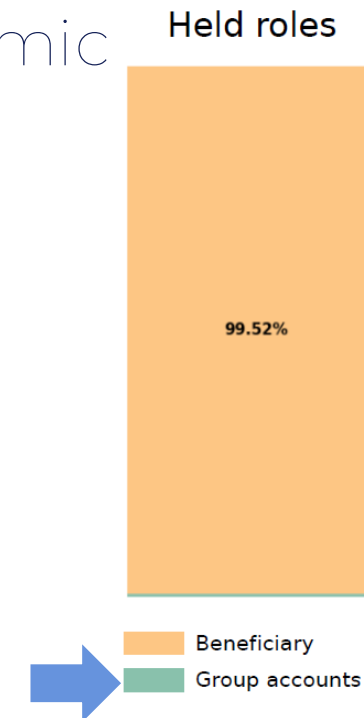
- Open problems:
  - ▶ Limited studies on complementary currencies during the COVID-19 pandemic
  - ▶ No studies on cooperative behaviour, and how it changes over time



- Research questions
  - ▶ RQ1: To what extent cooperation groups are used by Sarafu participants?
  - ▶ RQ2: Does the behaviour of cooperation groups change over time?

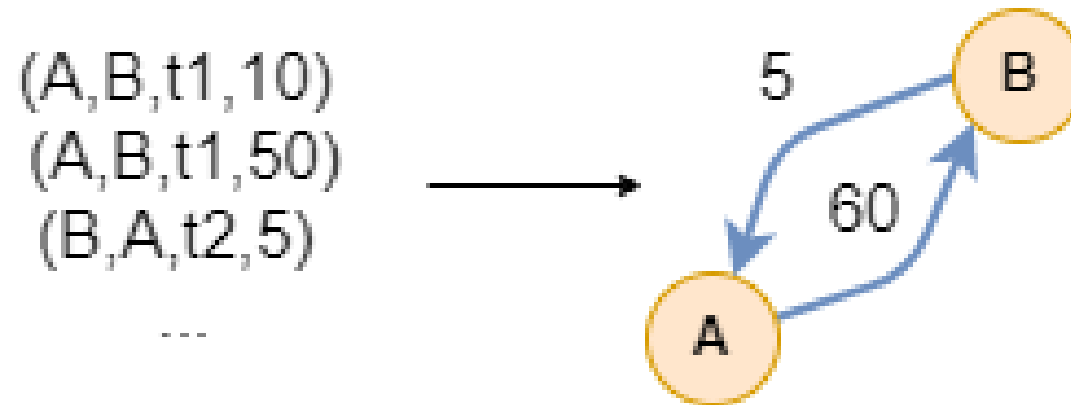
# Dataset

- Transactions during the COVID-19 pandemic
- Users (54999)
  - ID
  - Attributes (business type, role, ... )
- Transactions (930161)
  - From
  - To
  - Time
  - Weight (amount of tokens)



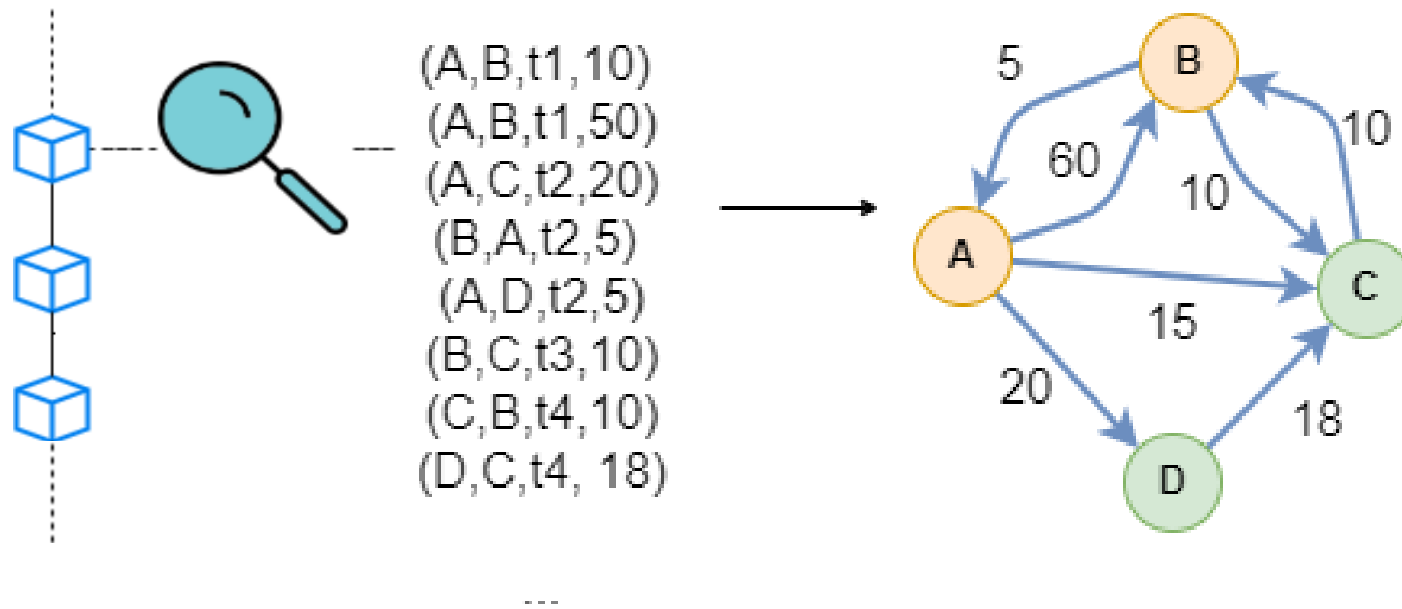
# Methodology

- Network based modeling
- Transaction networks: temporal weighted graphs



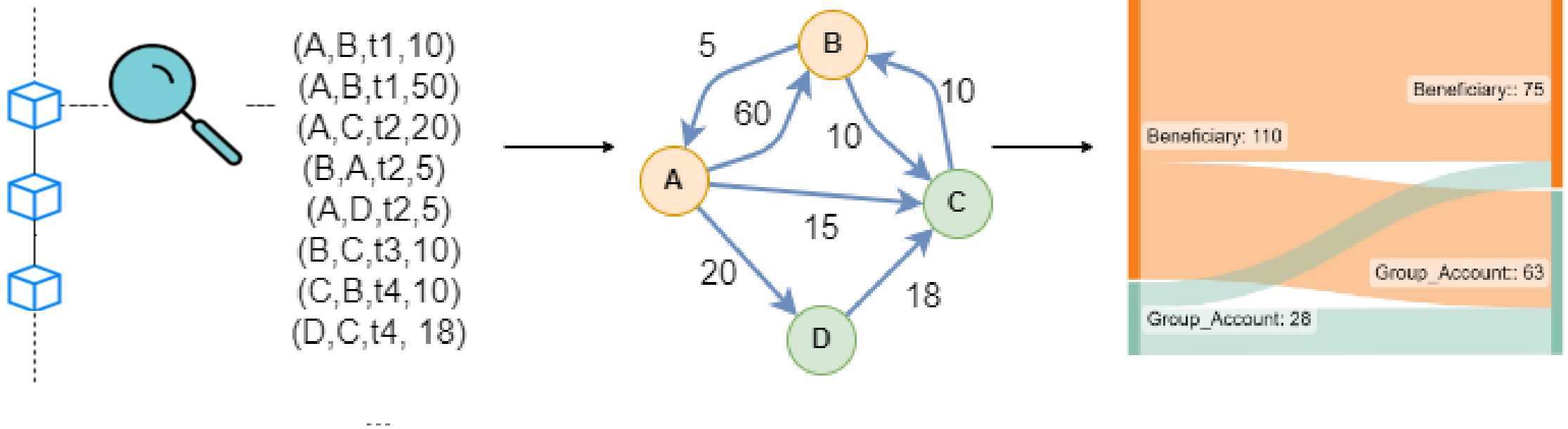
# Methodology

- Transaction networks: temporal weighted graphs



# Methodology

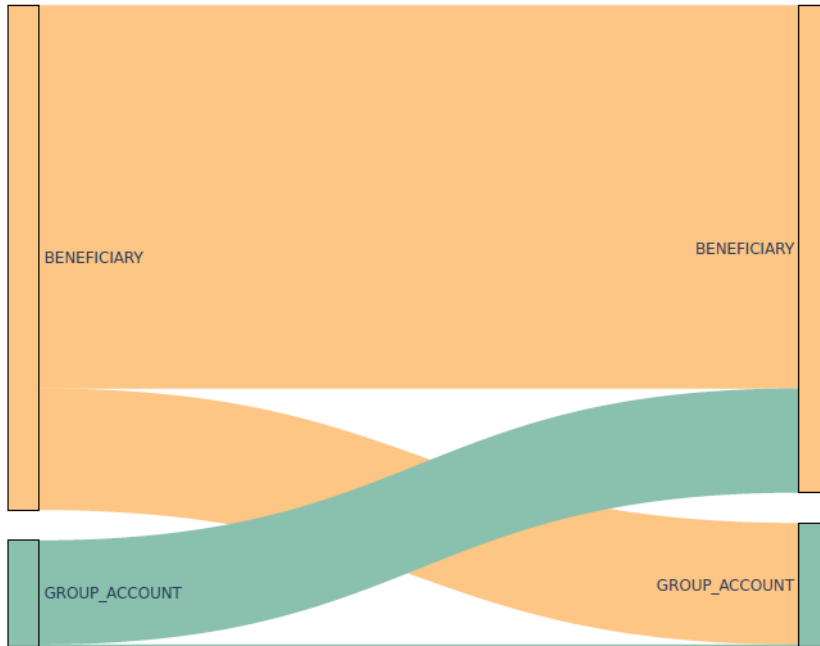
- Transaction networks: temporal weighted graphs
- Sankey diagrams: visualize the flow of transfers



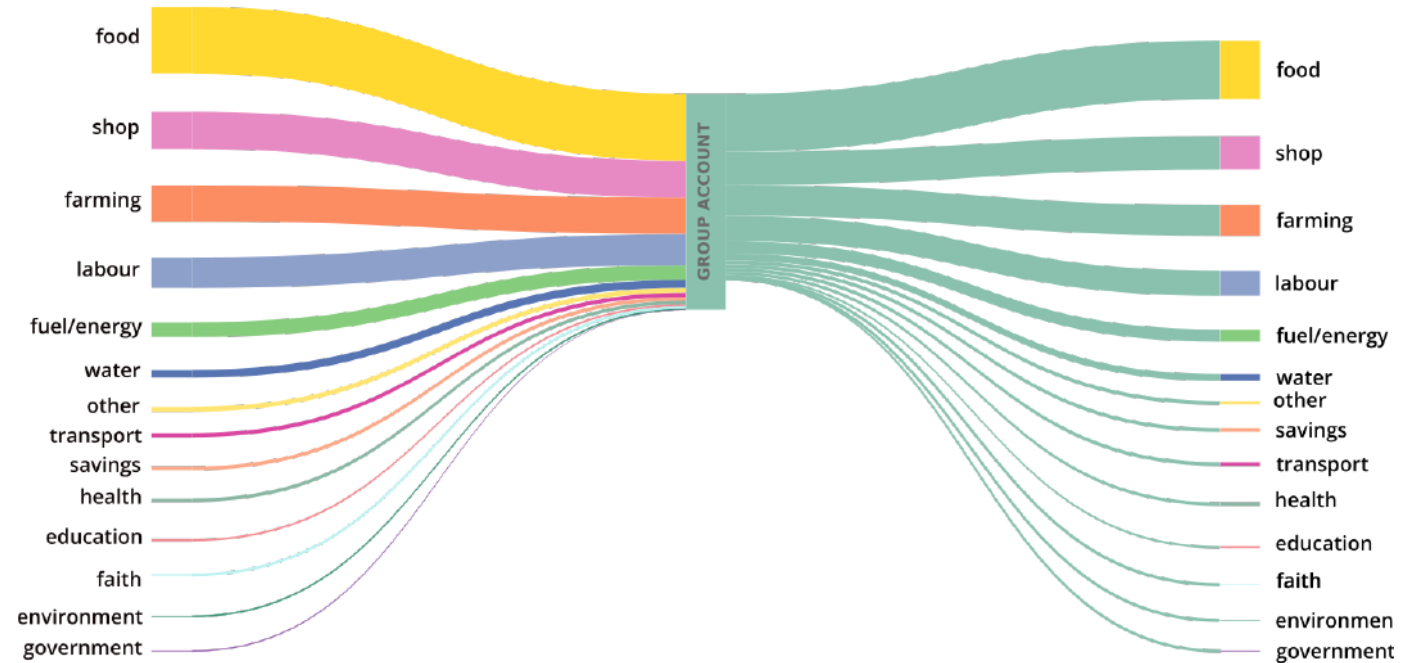


# Cooperation

Flows divided by held role



Flows divided by business type

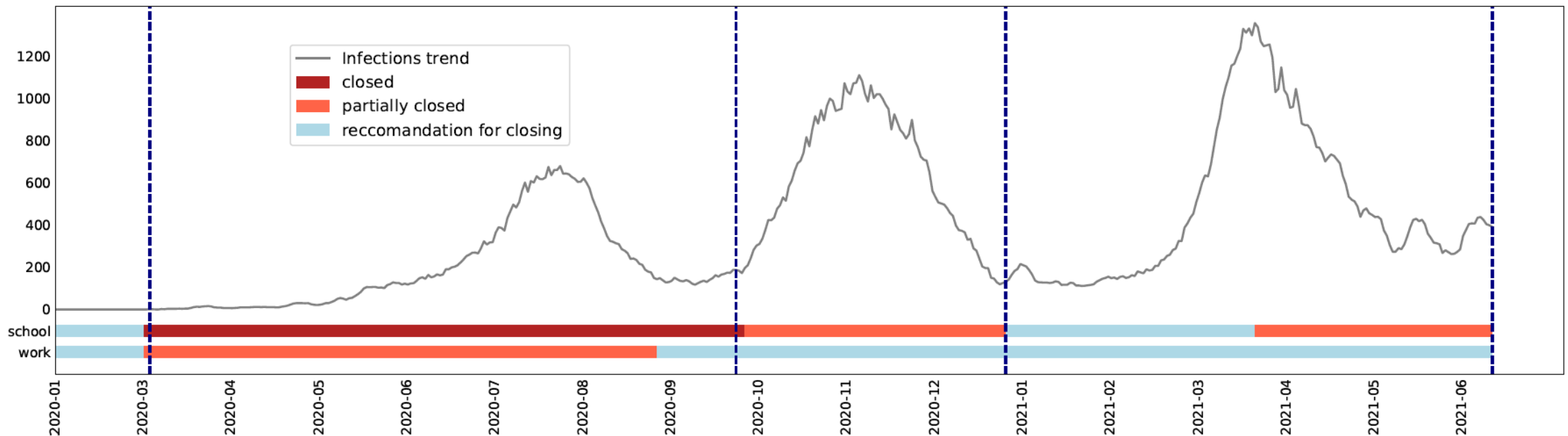


- Group accounts have an important role

# Over time (1)

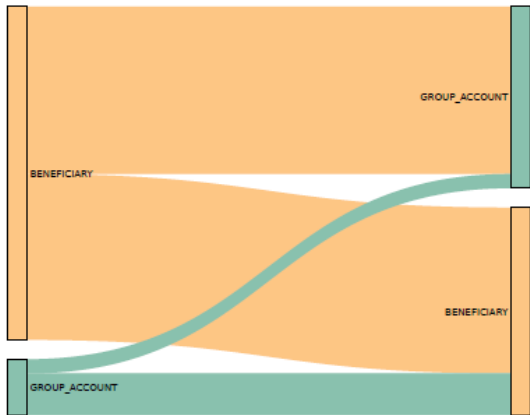
- Four periods of time based on pandemic situation
  - changes in the mitigation policies and restrictions

**Covid cases and restrictions in Kenya**

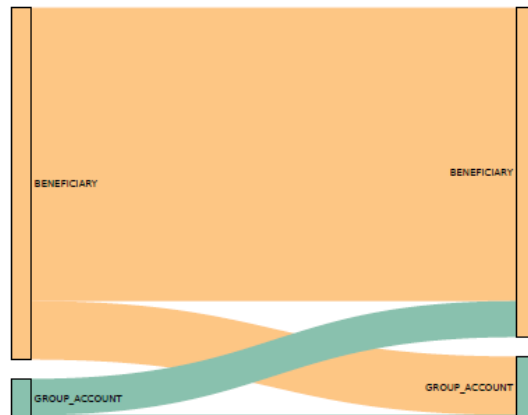


# Over time (2)

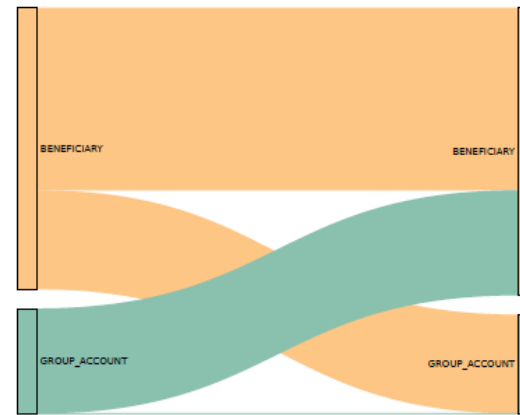
26JAN20 - 15MAR20



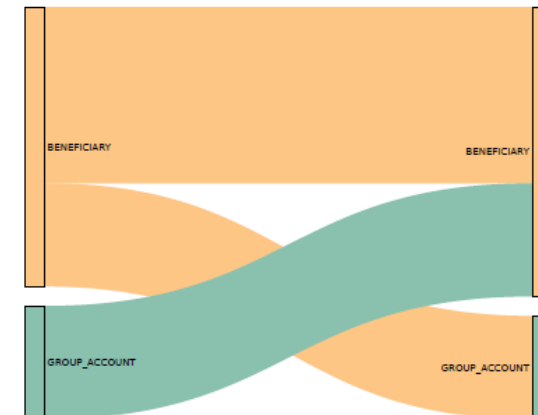
15MAR20 - 30SEP20



1OCT20 - 31DEC20

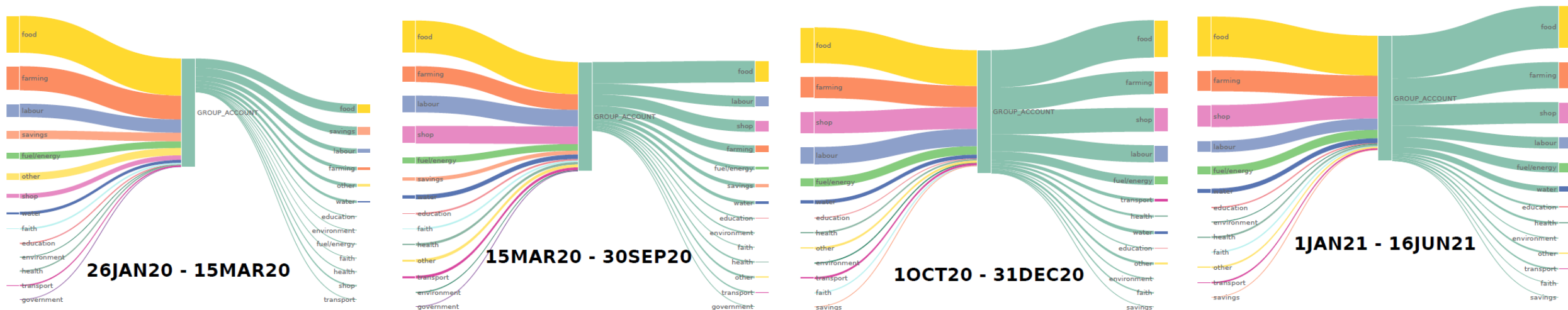


1JAN21 - 16JUN21



- Increase of monetary flows from group accounts

# Over time (3)



- Changes in funding and spending of cooperation groups

# Conclusions

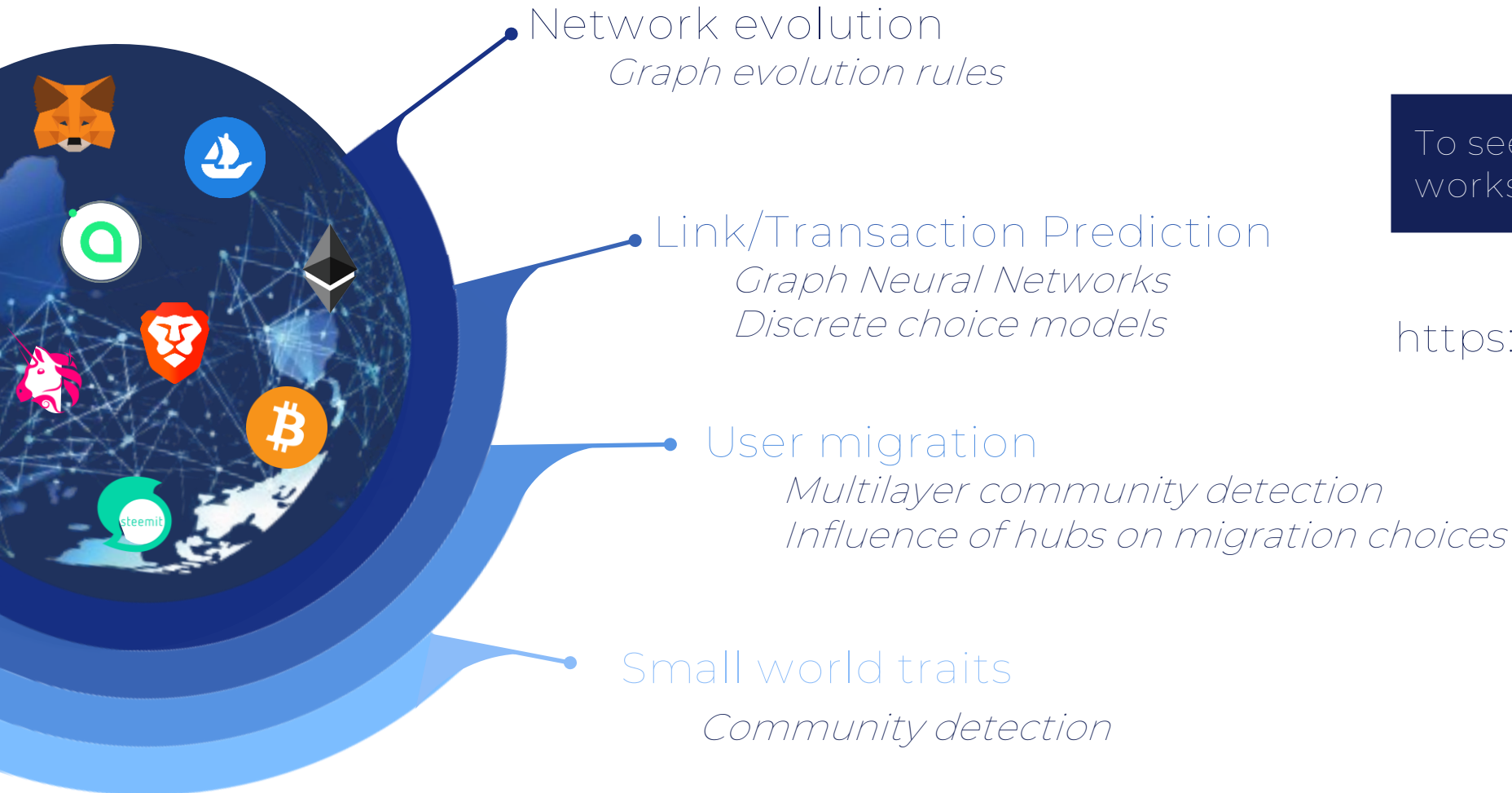
- Takeaways:
  - ▶ Cooperation behaviour
    - is important
    - changes over time
  - ▶ Group accounts should be considered by other humanitarian projects
- Future works:
  - ▶ Study of other currencies
  - ▶ Study the impact of other subset of accounts
  - ▶ Leverage additional contextual information (e.g.: pandemic, economy)



# Thanks for your attention!

## Web3

RESEARCH GROUP WORKS



To see our  
works visit



<https://connets.di.unimi.it/>

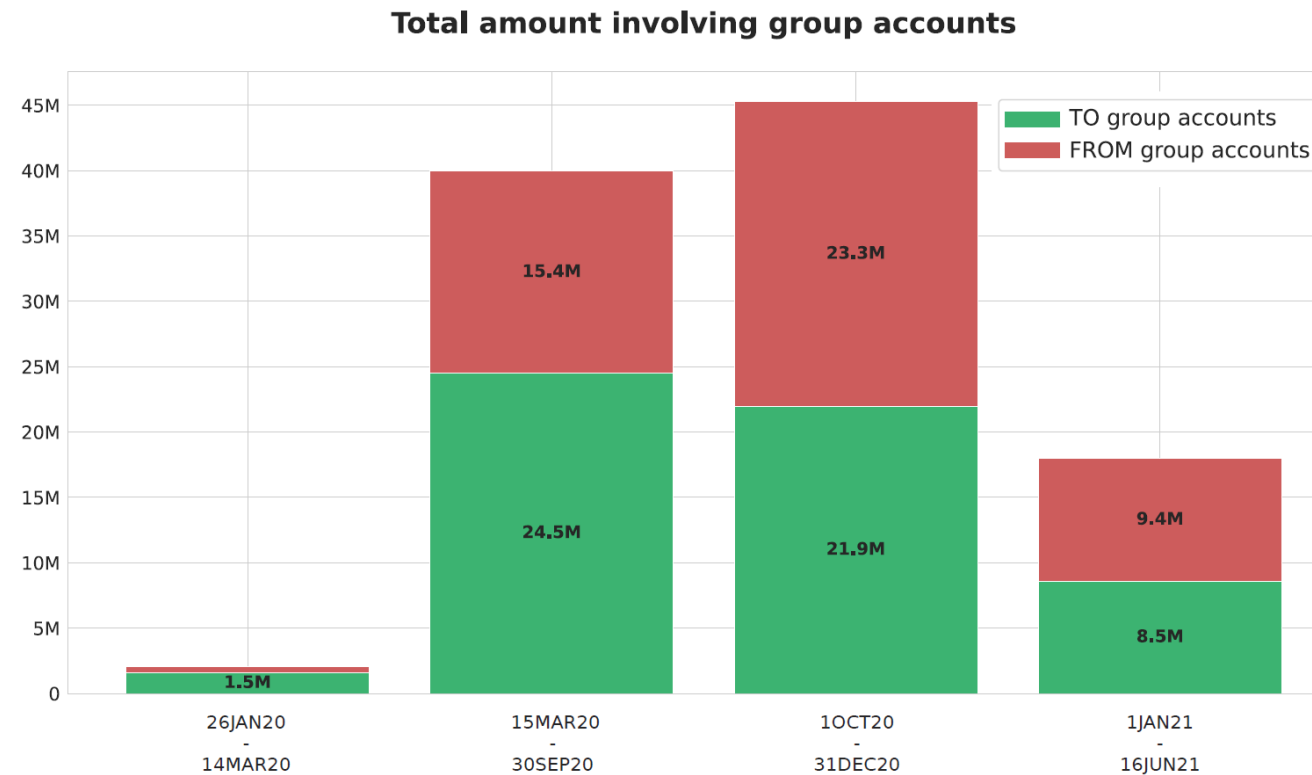


# Backup slides

# Transaction networks

Start	End	Active users	Edges	Transactions
2020-01-26	2020-03-15	4217	8281	12168
2020-03-15	2020-10-01	28070	96266	251594
2020-10-01	2021-01-01	7030	22872	63262
2021-01-01	2021-06-16	13960	35225	85026
Entire period		40343	143239	412050

# Over time (4)



# Complementary

