Algebraic analysis of complex network structures with multiplex

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Agenda

Visualization and Algebraic Analysis . . .

1. Introduction (Group structure)

2. Decomposition of a Partially Ordered Semigroup

Computations with multiplex and visualization with multigraph

First, some terminology...

- Multiplex ↔ Monoplex structure
 - \rightarrow System with several \leftrightarrow single or collapsed levels in the set of relations
- multiplex ↔ uniplex edge
 - \rightarrow A relationship with multiple \leftrightarrow single or collapsed levels
- Multimodal network
 - → Same as Multiplex, but most used with flows or transportation modes
- Multilevel network
 - → A structure with individual and group levels; i.e. affiliation networks, but where both level entities can be interrelated
- Multilayer network
 - Cascade structure with multiple subsystems and layers of connectivity

Representations for multiplex networks

Simple networks:

- (Simple) graphs, matrices
 - → for relations between actors

Multiplex networks:

- Multigraphs, arrays
 - → for (types of) relations between actors
- Cayley graphs, tables
 - for relationships between relations

Different types of algebraic structures are represented by tables

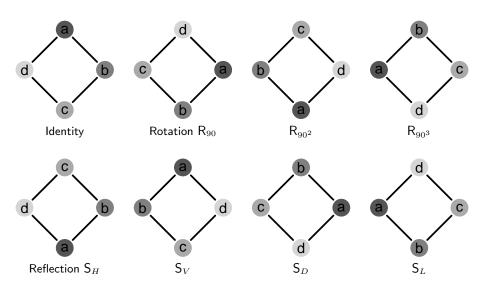
Multiplex networks

Algebraic systems representing multiplex networks:

Type of structure	Algebraic object							
Elementary	Group							
Complex	Semigroup, Semiring, Lattice, etc.							

Example of elementary group structure

Dihedral group of the square, D_4



Code: Example of elementary group structure

Dihedral group of the square, D_4

```
# CONSTRUCT MATRIX REPRESENTING A SQUARE
R> square <- transf(c("a, b", "b, c", "c, d", "d, a"), type = "toarray")</pre>
```

```
# DEFINE THE SCOPE OF THE GRAPH
R> scp <- list(directed = FALSE, cex = 16, vcol = gray(2:5/6), clu = 1:4,
+ lwd = 10, ecol = "black", tcex = 6, pos = 0)</pre>
```

```
# IDENTITY
R> multigraph(square, scope = scp)
# ROTATIONS
R> multigraph(square, scope = scp, rot = 90)
R> multigraph(square, scope = scp, rot = 90*2)
R> multigraph(square, scope = scp, rot = 90*3)
# REFLECTIONS
R> multigraph(square, scope = scp, mirrorH = TRUE)
R> multigraph(square, scope = scp, mirrorV = TRUE)
R> multigraph(square, scope = scp, mirrorD = TRUE)
R> multigraph(square, scope = scp, mirrorL = TRUE)
R> multigraph(square, scope = scp, mirrorL = TRUE)
```

Multiplication table

0	1	R_{90}	R_{90^2}	R_{90^3}	S_H	S_L	S_V	S_D
ı	I	R_{90}	R_{90^2}	R_{90^3}	S_H	S_L	S_V	S_D
R_{90}	R ₉₀	R_{90^2}	R_{90^3}	1	S_L	S_V	S_D	S_H
R_{90^2}	R_{90^2}	R_{90^3}	1	R_{90}	S_V	S_D	S_H	S_L
R_{90^3}	R ₉₀ ³	I	R_{90}	R_{90^2}	S_D	S_H	S_L	S_V
S_H	S_H	S_D	S_V	S_L	I	R_{90^3}	R_{90^2}	R_{90}
S_L	S_L	S_H	S_D	S_V	R_{90}	1	R_{90^3}	R_{90^2}
S_V	S_V	S_L	S_H	S_D	R_{90^2}	R_{90}	1	R_{90^3}
S_D	S_D	S_V	S_L	S_H	R_{90^3}	R_{90^2}	R_{90}	1

Code: Constructing the multiplication table

```
# FIRST CREATE THE GENERATORS OF D_4 AS PERMUTATION MATRICES
R > SD4 \leftarrow transf(list(R = c("2, 1", "3, 2", "4, 3", "1, 4"),
       S = c("1, 3", "2, 2", "3, 1", "4, 4")), type = "toarray", sort = TRUE)
, , R
1 0 0 0 1
2 1 0 0 0
3 0 1 0 0
4 0 0 1 0
, , S
 1 2 3 4
10010
3 1 0 0 0
4 0 0 0 1
```

Code: Constructing the multiplication table

"Because all groups are semigroups as well..."

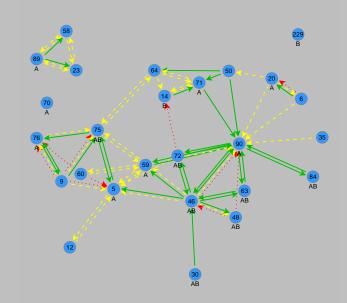
```
# THE GROUP STRUCTURE WITH SYMBOLIC FORMAT
R> semigroup(SD4, type = "symbolic")
$st
[1] "R" "S" "RR" "RS" "SR" "SS" "RRR" "RRS"
$S
              RS SR SS RRR RRS
    RR RS RRR RRS
                         SS
    SR SS RRS RRR
                     S RS RR
   RRR RRS SS SR RS
                     RR
        R SR SS RR
                     RS RRS RRR
SR RRS RRR
           RS RR SS
                     SR
SS
           RR RS SR
                     SS RRR RRS
RRR SS SR
          R S RRS RRR
    RS RR S R RRR RRS SR SS
attr(,"class")
[1] "Semigroup" "symbolic"
```

Group structure in social networks?

- Despite the symmetry, algebraic groups can model human societies
- Some kinship networks from primitive societies have specific rules of marriage & descent that follow the elementary group structure
 - Kariera and Arunta from Western Australia are classical examples
- However, since most of multiplex social networks are not symmetric they represent *complex* structures
- from a group to a semigroup partially ordered

Example: Incubator network "A", \mathscr{X}_A

Collaboration (green), Friendship (yellow), Competition (red)



Tie interlock

Social structure = Ties between actors

Relational structure = Interrelations between relations

Role structure = Relational system of aggregated relations

we benefit from algebraic structures to represent relational systems

Positional System of Incubator network "A"

After applying Compositional Equivalence with Relational contrast to \mathscr{X}_A :

1/

```
# LOAD DATA SET AND RECORD THE IMAGE MATRICES
R> data("incubA")
R> net <- incubA$IM</pre>
```

C				F				K					А					
1	0	1	0		1	0	1	0	1	0	1	0		1	0	0	0	
0	1	1	0		1	1	1	0	0	1	0	0		0	1	0	0	
1	0	1	0		1	0	1	0	0	0	1	0		0	0	1	0	
0	0	0	1		0	0	0	1	0	0	0	0		0	0	0	1	
)	G		L					В								
1	0	1	0		1	1	1	0	1	Ο	0	0		1	0	0	0	

1 0 0

0

0

Algebraic constraint: Role table

```
R> semigroup(net)
$S
                           9 10 11 12 13 14 15 16 17 18 19 20
                           9 10 17 10
                     3 8 17 10 11 12 18 17 11 18 17 18 18 17
                           9 20 11 15 16
                           9 17 11 11 16
                        8 17 10 11 12 19 20 15 18 17 18 19 20
                           9 10 11 12 13 14 15 16 17 18
                     8 10 17 10 17 10 17 17 17 17 17 17 17 17
                                17
10 10 10 10 17 17 10 10 10 17 10 17 10 17 17 17 17 17 17 17 17
11 18 17 11 11 11 11 11 18 17 17 11 11 18 17 11 18 17 18 18 17
12 8 10 12 11 11 12 12 8 17 10 11 12 18 17 11 18 17 18 18 17
                9 20 13 20
                           9 20 17 20
               9 20 14 20
                           9 20 17 20
15 19 20 15 11 11 15 15 19 17 20 11 15 18 17 11 18 17 18 18 17
                9 17 16 17
                           9 17 17
18 17 17 18 17 17 17 18 17 17 17 17 17 17 17
19 20 20 19 17 17 20 19 20 17 20 17 20 17 17 17 17 17
20 20 20 20 17 17 20 20 20 17 20 17 20 17 17 17 17 17 17 17 17
attr(,"class")
[1] "Semigroup" "numerical"
```

Algebraic constraint: Set of equations

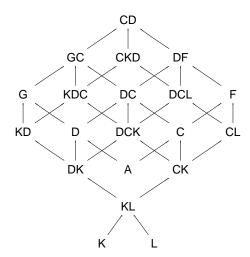
```
R> netst <- strings(net, equat = TRUE, k = 3)
R> netst$equat
$equat
$equat$C
[1] "C" "CA" "AC" "AAC" "CAA" "ACA"
$equat$F
 [1] "F"
          "CC" "FF" "CF" "FC" "FA"
                                       "AF" "CCC" "FFC" "CFF" "CCF" "FFF"
[13] "AAF" "FCC" "FAA" "CCA" "FFA" "ACC" "AFF" "FCF" "CFC" "AFA" "CAC" "FAF"
[25] "CFA" "CAF" "FCA" "FAC" "ACF" "AFC"
$equat$K
 [1] "K"
          "KK" "KA" "AK" "KKK" "AAK" "KAA" "KKA" "AKK" "AKA" "KAK"
$equat$D
[1] "D" "DA" "AD" "AAD" "DAA" "ADA"
$equat$G
[1] "G"
          "DD"
                "GG" "DG"
                           "GD" "GA"
                                       "AG" "DDD" "GGD" "DGG" "DDG" "GGG"
[13] "AAG" "GDD" "GAA" "DDA" "GGA" "ADD" "AGG" "GDG" "DGD" "AGA" "DAD" "GAG"
[25] "DGA" "DAG" "GDA" "GAD" "ADG" "AGD"
$equat$L
 [1] "[."
          "LL" "LA" "AL" "LLL" "AAL" "LAA" "LLA" "ALL" "ALA" "LAL"
$equat$A
[1] "A" "AA" "AAA"
```

Algebraic constraint: Set of inclusions

```
R> partial.order(netst, type = "strings")
       K D G L A CK CD CL KD KL DC DF DK GC CKD KDC DCK DCL
DCK 0 0 0 0 0 0 0
attr(,"class")
[1] "Partial.Order" "strings"
```

Algebraic constraint: Set of inclusions (visualization)

```
R> diagram(partial.order(netst, type = "strings"))
```



Decomposition of Relational Structures

Abstract Semigroup

```
# ROLE STRUCTURE OF \mathscr{X}_A
R> S <- semigroup(net, type = "symbolic")</pre>
# DECOMPOSE AND REDUCE WITH CONGRUENCE CLASSES IN THE ABSTRACT SEMIGROUP
R> decomp(S, cngr(S, uniq = TRUE), type = "cc", reduc = TRUE)
$IM[[11]]
 A C
AAC
CCC
$IM[[12]]
   C KD KL CD K D L A
 C CD C CD C CD C C
KD CD KD KD CD KD KD KD KD
KL C KD KL CD KL KD KL KL
CD CD CD CD CD CD CD CD
  C KD KI, CD K KD KI, K
D CD KD KD CD KD D KD D
L C KD KL CD KL KD L L
A C KD KL CD K D L A
$ord
 [1] 10 6 8 7 5 6 5 8 2 2 2 8
```

Decomposition of Relational Structures

Partially Ordered Semigroup

```
# PARTIAL ORDER STRUCTURE OF STRINGS
R> P0 <- partial.order(netst, type = "strings")</pre>
attr(, "class")
[1] "Partial.Order" "strings"
```

Factorization

Partially Ordered Semigroup

Function fact performs the full factorization option from PACNET

```
# FACTORIZATION BY INDUCED INCLUSIONS
R> POSii <- fact(S, PO)</pre>
```

```
# PARTITION—RELATIONS
R> POSpr <- pi.rels(POSii, PO, po.incl = TRUE)</pre>
```

```
# DECOMPOSITION WITH MEET—COMPLEMENTS
R> Sfac <- decomp(S, POSpr, type = "mc", reduc = TRUE)</pre>
```

Factorization of the Partially Ordered Semigroup

Induced inclusions

```
R> POSii$ii
$`2, 1`
[1] "10, 1" "10, 13" "10, 16" "10, 18" "10, 19" "10, 8" "14, 13" "14, 16"
[9] "17, 16" "17, 18" "2, 1" "2, 13" "2, 16" "20, 13" "20, 16" "20, 18"
Γ171 "20, 19" "9, 16"
$'4.1'
[1] "11, 1" "11, 10" "11, 13" "11, 14" "11, 19" "11, 2" "11, 20" "11, 8"
[9] "13, 2" "14, 2" "15, 1" "15, 10" "15, 2" "15, 8" "16, 14" "16, 2"
[17] "17, 10" "17, 14" "17, 2" "17, 20" "18, 10" "18, 14" "18, 2" "18, 20"
[25] "19, 10" "19, 2" "20, 10" "20, 2" "4, 1" "4, 2" "5, 13" "5, 14"
[33] "5, 2" "9, 14" "9, 2"
$`5, 1`
[1] "11, 1" "11, 10" "11, 13" "11, 14" "11, 19" "11, 2" "11, 20" "11, 8"
[9] "13, 2" "14, 2" "15, 1" "15, 10" "15, 2" "15, 8" "16, 14" "16, 2"
[17] "17, 10" "17, 14" "17, 2" "17, 20" "18, 10" "18, 14" "18, 2" "18, 20"
[25] "19, 10" "19, 2" "20, 10" "20, 2" "4, 1" "4, 2" "5, 1" "5, 13"
[33] "5, 14" "5, 2" "9, 14" "9, 2"
```

```
R> POSii$at

$'11, 14'
[1] "11, 14" "11, 20" "17, 14" "17, 20" "18, 14" "18, 20"

$'10, 16'
[1] "10, 16" "10, 18" "17, 16" "17, 18" "20, 16" "20, 18"

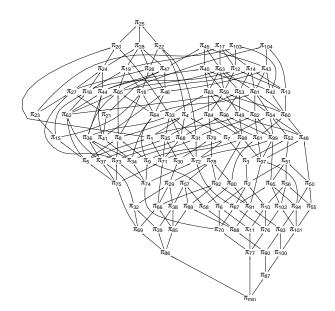
$'1, 17'
[1] "1, 17" "13, 17" "14, 17" "16, 17" "2, 17" "4, 17" "5, 17" "7, 17"
[9] "9, 17"
```

Factorization of the Partially Ordered Semigroup

Meet-Complements of the Atoms

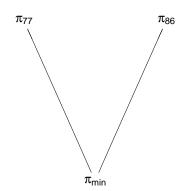
```
R> POSii$mc
[[1]]
[[2]]
```

Lattice of Congruence Relations

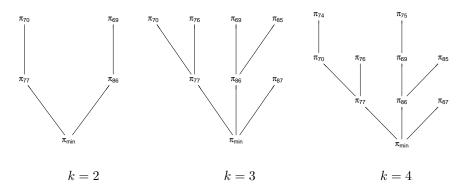


(Relational) Role Interlock

```
# POTENTIAL ATOMS AS THE K—SHORTEST INDUCED INCLUSIONS IN THE FACTORIZATION POSpatm <- fact(S, PO, patm = TRUE, K = 1)patm # PLOT HASSE DIAGRAM OF SELECTED \pi-RELATIONS WITH THE PARTIAL ORDER diagram(partial.order(POSpr, type = "pi.rels", po.incl = TRUE, sel = POSpatm))
```

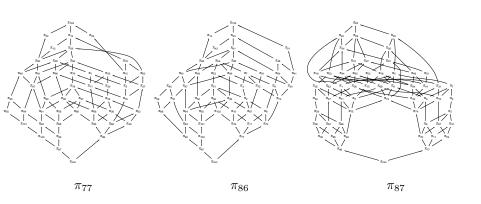


(Relational) Role Interlock



Meet-complements of the Atoms

We are interested in the maximal elements in the (complete) lattice



Factorization with Meet-Complements of the Atoms

Clustering of Semigroup elements

Logics of Interlock

Aggregated Image Matrices

```
R> Sfac$IM
[[1]]
 CDGL
CCGGC
DDGGD
GGGGG
LCDGL
[[2]]
 CFKD
CFFCF
FFFFF
KCFKD
DCFDD
[[3]]
 СК
ССК
KKK
```

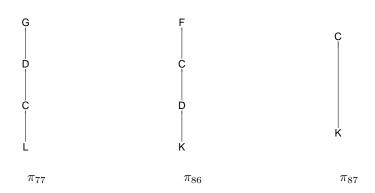
Logics of Interlock

Aggregated Partial Orders

```
R> Sfac$P0
[[1]]
  CDGL
C 1 1 1 0
D 0 1 1 0
G 0 0 1 0
L 1 1 1 1
[[2]]
  CFKD
C 1 1 0 0
F 0 1 0 0
K 1 1 1 1
D 1 1 0 1
[[3]]
  СК
C 1 0
K 1 1
```

Logics of Interlock

Aggregated Partial Orders (Visualization)





Thanks for your attention!

github.com/mplex