



International laboratory for Applied Network  
Research

MASNA: Applied Statistics with  
Network Analysis

Moscow 2023, June 29

# Pajek program for analysis and visualization of complex networks

Workshop of the MASNA online programme

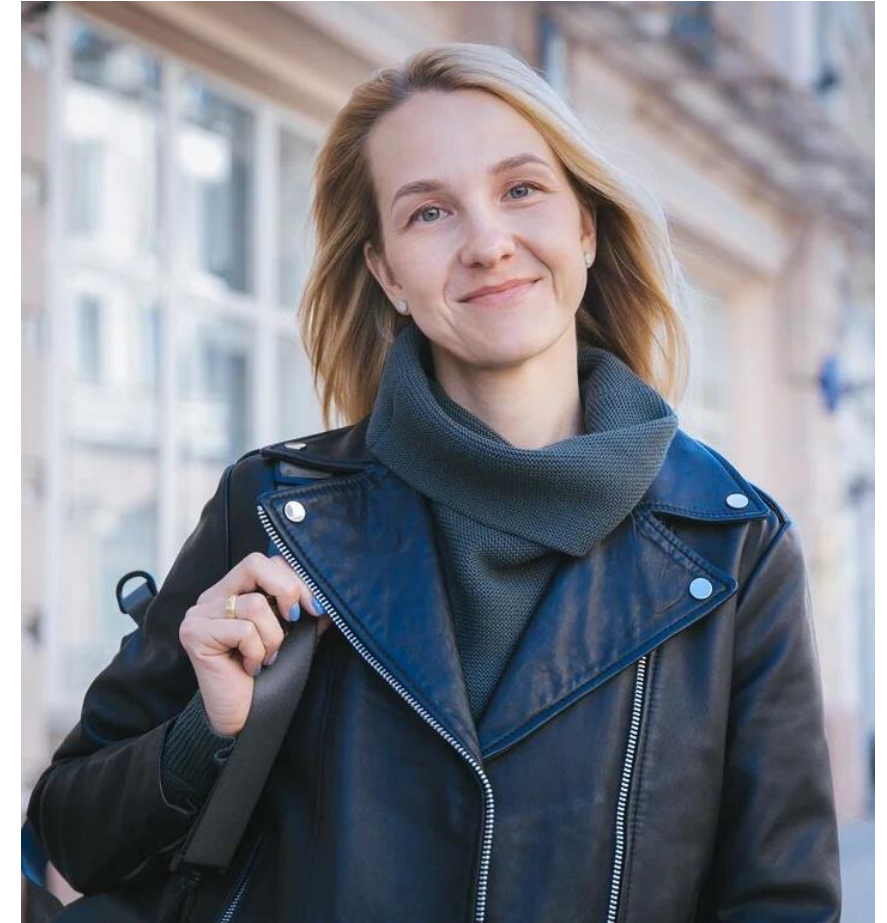
Daria Maltseva, Ph.D.





## About me

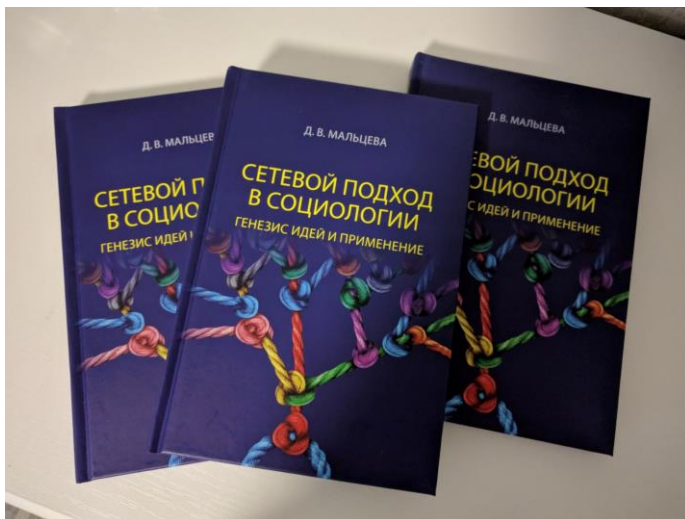
- Head of the International Laboratory for Applied Network Research
- Leading Research Fellow, Visiting Lecturer
- Ph.D. | Candidate of Sciences in Sociology
- Degree in Sociology, Russian State University for the Humanities
- Young Faculty Support Program (Group of Young Academic Professionals), Category "New Researchers" (2018-2019)
- Grant of the Russian Scientific Foundation "Collaboration patterns in the Russian sociological community: the structure of scientific schools and their growth potential" 2021-2023
- Have a 2.5-year-old son



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## Expertise



### Сетевой подход как феномен социологической теории

версия для печати

Мальцева Д. В.

Кандидат социологических наук, зам. заведующего, Международная лаборатория прикладного сетевого анализа НИУ «Высшая школа экономики», Москва, Россия d\_maltseva@mail.ru

DOI: 10.7868/S0132162518040013  
ID статьи на сайте журнала: 7135

Рубрика: Методология и методы социологических исследований

Ссылка при цитировании:

Мальцева Д. В. Сетевой подход как феномен социологической теории // Социологические исследования. 2018. № 4. С. 3-14.  
DOI: 10.7868/S0132162518040013

Текст статьи.

Аннотация

Представлен сравнительный анализ трех направлений сетевого подхода в социологии – анализа социальных сетей, реляционной социологии и акторно-сетевой теории. Основаниями для анализа выступают время и контекст появления, основные теоретические положения, методология и методы эмпирических исследований. Делаются выводы о сходстве (до определенной степени) направлений реляционной социологии и акторно-сетевой теории и их отличия от анализа социальных сетей. Каждое из направлений автономно и занимает определенное место в структуре социологического знания. Делается вывод о некорректности представления «сетевого подхода» как единого теоретического блока, объединения его направлений под унифицирующим названием «сетевая теория», «сетевая парадигма» и др. Подчеркнуто, что это собирательное название для разных теорий и подходов, оперирующих понятием сети в разных смыслах.

Springer Link

Published: 19 April 2022

### Collaboration between authors in the field of social network analysis

Daria Maltseva & Vladimir Batagelj

Scientometrics (2022) | Cite this article

267 Accesses | 2 Altmetric | Metrics

#### Abstract

This paper presents a study of authors writing articles in the field of SNA and groups the means of bibliographic network analysis. The dataset consists of works from the Web of Science database obtained by searching for “social network\*”, works highly cited in the field of SNA, and written by the most prolific authors (70,000+ publications and 93,000+ authors), up to and including 2018. Using a two-mode network linking publications with authors, we constructed and analysed different types of

Springer Link

Published: 30 August 2019

### Social network analysis as a field of invasions: bibliographic approach to study SNA development

Daria Maltseva & Vladimir Batagelj

Scientometrics 121, 1085–1128 (2019) | Cite this article

994 Accesses | 10 Citations | 1 Altmetric | Metrics

#### Abstract

In this paper, the results of a study on the development of social network analysis (SNA) and its evolution over time, using the analysis of bibliographic networks are presented. The dataset consists of articles from the Web of Science Clarivate Analytics database obtained by

Springer Link

Published: 25 January 2020

### Towards a systematic description of the field using keywords analysis: main topics in social networks

Daria Maltseva & Vladimir Batagelj

Scientometrics 123, 357–382 (2020) | Cite this article

806 Accesses | 8 Citations | 1 Altmetric | Metrics

#### Abstract

This paper presents the results of the analysis of keywords used in Social Network Analysis (SNA) articles included in the WoS database and main SNA journals, from 1970 to 2018.

Springer Link

Published: 25 February 2021

### Journals publishing social network analysis

Daria Maltseva & Vladimir Batagelj

Scientometrics 126, 3593–3620 (2021) | Cite this article

585 Accesses | 3 Citations | 1 Altmetric | Metrics

#### Abstract

This paper presents the analysis of journals publishing articles on social network analysis (SNA). The dataset consists of articles from the Web of Science database obtained by searching for “social network\*”, works intensively cited, written by the most prominent





## Expertise

Series of internships in Center  
for Methodology and Social  
Informatics (Faculty of Social  
Sciences, University of  
Ljubljana) – 2017, 2018(2),  
2019

### Pajek: analysis and visualization of large networks

	Ver.	32 bit	64 bit
Oct 16, 2018	5.06 a	Web Start  Install Shield Install-Zip Portable	Web Start  Install Shield Install-Zip Portable
2018	Pajek Book Edition 3		
<a href="#">Pajek mailing list</a>		<a href="#">Datasets</a>	







Programs for Analysis  
and Visualization  
of Very Large Networks  
Reference Manual  
List of commands with short explanation



Exploratory  
Social Network Analysis  
with Pajek  
REVISED AND EXPANDED EDITION  
FOR UPDATED SOFTWARE  
THIRD EDITION  
Vladimir Batagelj, Andrej Mrvar



Exploratory  
Social Network  
Analysis with Pajek  
Pajekを活用した  
社会ネットワーク  
分析  
Batagelj, Vladimir  
Mrvar, Andrej  
定田 雪 著



PAJEK  
蜘蛛:  
社会网络分析技术  
Exploratory Social Network Analysis with Pajek (Second Edition)  
Batagelj, Vladimir  
Mrvar, Andrej  
定田 雪 著



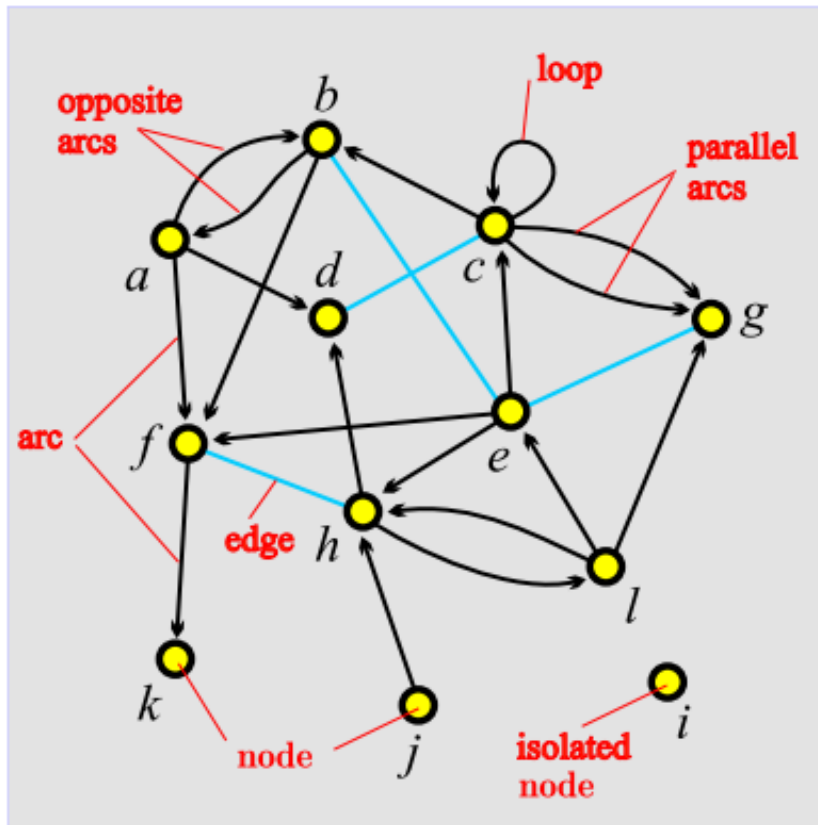
## Aim of the seminar

To **perform basic operations** in Pajek in practice:

- generate a set of network data and modify the resulting networks,
- calculate the main metrics for individual nodes and the whole network,
- visualize the resulting networks.

To **practice working in Pajek** with the real empirical data collected by the ANR-Lab members.

## Network Conceptualization



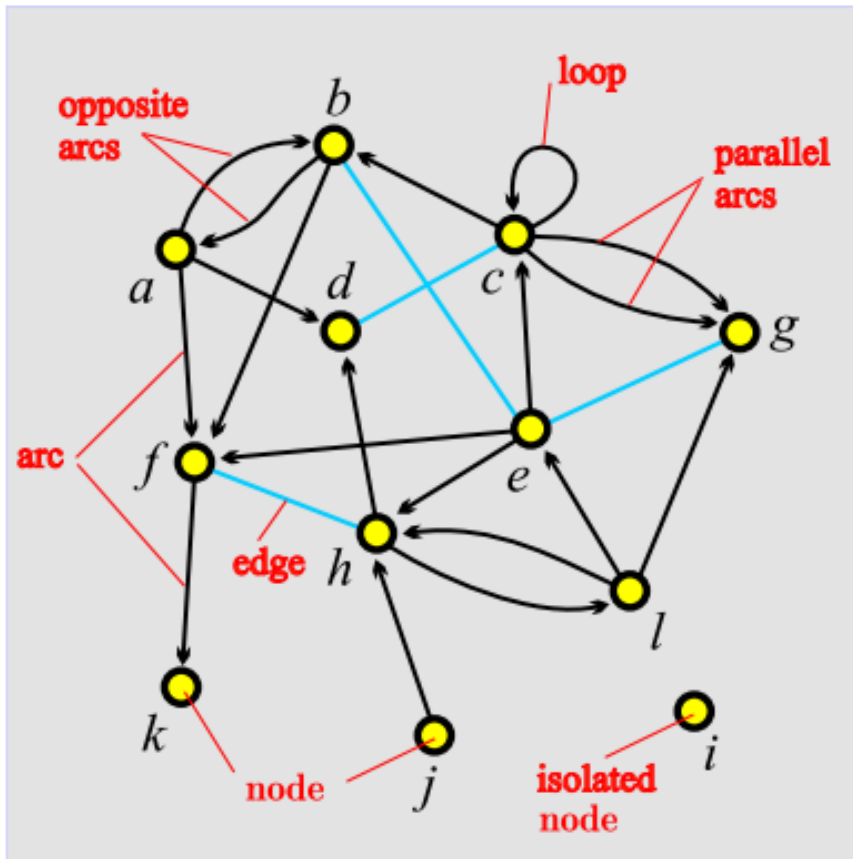
The **network** is based on two sets - a set of **nodes** (vertices) representing the selected units of analysis and a set of **lines** (links) representing the connections between the units of analysis, which together form a **graph**.

The line can be directed (**arc**) or undirected (**edge**).

Nodes and lines can contain additional data - characteristics / **attributes** (name, type, value) - that can be measured or calculated.

**Network = Graph + Data**

## Network data format: set of nodes and links



$$\mathcal{V} = \{a, b, c, d, e, f, g, h, i, j, k, l\}$$

$$\mathcal{A} = \{(a, b), (a, d), (a, f), (b, a), (b, f), (c, b), (c, c), (c, g)_1, (c, g)_2, (e, c), (e, f), (e, h), (f, k), (h, d), (h, l), (j, h), (l, e), (l, g), (l, h)\}$$

$$\mathcal{E} = \{(b: e), (c: d), (e: g), (f: h)\}$$

$$\mathcal{G} = (\mathcal{V}, \mathcal{A}, \mathcal{E})$$

$$\mathcal{L} = \mathcal{A} \cup \mathcal{E}$$

*Vertices	12		
1 "a"	0.1020	0.3226	
2 "b"	0.2860	0.0876	
3 "c"	0.5322	0.2304	
4 "d"	0.3259	0.3917	
5 "e"	0.5543	0.4770	
6 "f"	0.1552	0.6406	
7 "g"	0.8293	0.3249	
8 "h"	0.4479	0.6866	
9 "i"	0.8204	0.8203	
10 "j"	0.4789	0.9055	
11 "k"	0.1175	0.9032	
12 "l"	0.7095	0.6475	

\*Arcs

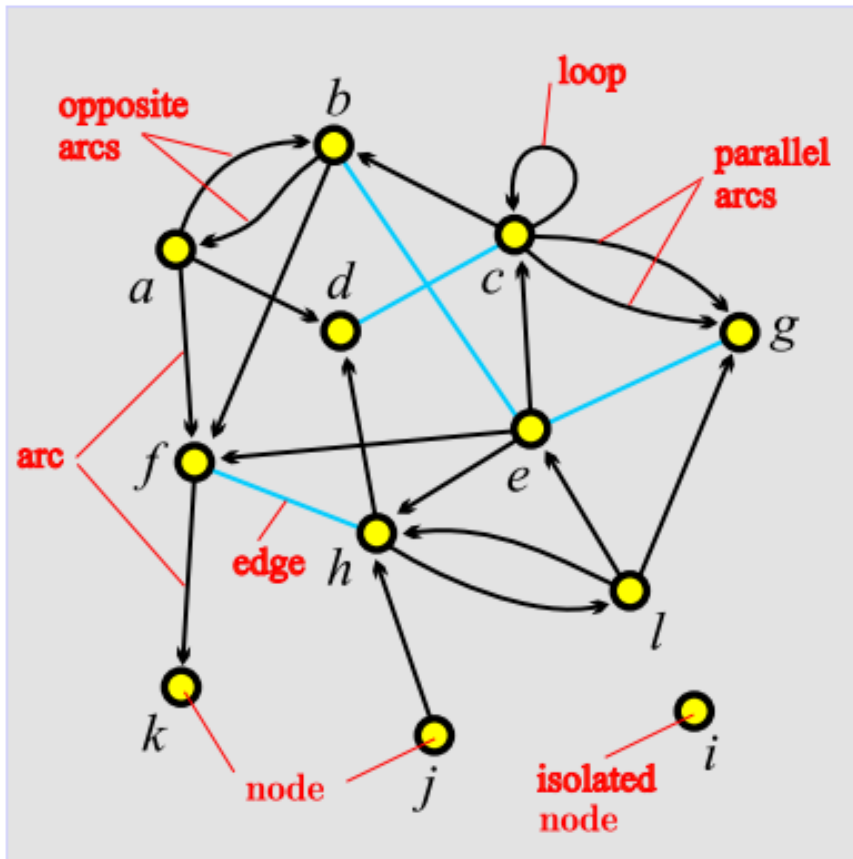
1	2
2	1
1	4
1	6
2	6
3	2
3	3
3	7
3	7
5	3
5	6
5	8
6	11
8	4
10	8
12	5
12	7
8	12
12	8

\*Edges

2	5
3	4
5	7
6	8

Link weight can be added  
(third column)

## Network data format: links of nodes with “neighbors”



$N_A(a) = \{b, d, f\}$   
 $N_A(b) = \{a, f\}$   
 $N_A(c) = \{b, c, g, g\}$   
 $N_A(e) = \{c, f, h\}$   
 $N_A(f) = \{k\}$   
 $N_A(h) = \{d, l\}$   
 $N_A(j) = \{h\}$   
 $N_A(l) = \{e, g, h\}$   
 $N_E(e) = \{b, g\}$   
 $N_E(c) = \{d\}$   
 $N_E(f) = \{h\}$

```

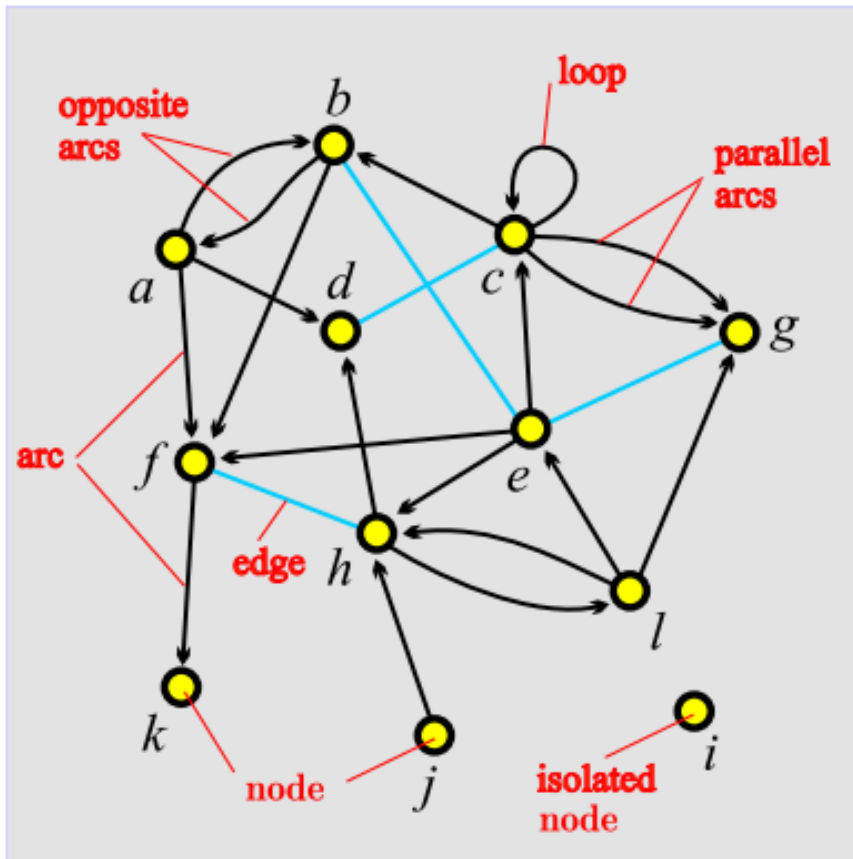
*Vertices 12
1 "a" 0.1020 0.3226
2 "b" 0.2860 0.0876
3 "c" 0.5322 0.2304
4 "d" 0.3259 0.3917
5 "e" 0.5543 0.4770
6 "f" 0.1552 0.6406
7 "g" 0.8293 0.3249
8 "h" 0.4479 0.6866
9 "i" 0.8204 0.8203
10 "j" 0.4789 0.9055
11 "k" 0.1175 0.9032
12 "l" 0.7095 0.6475

*Arcslist
1 2 4 6
2 1 6
3 2 3 7 7
5 3 6 8
6 11
8 4 12
10 8
12 5 7 8

*Edgeslist
2 5
3 4
5 7
6 8
    
```



## Network data format: adjacency matrix



	a	b	c	d	e	f	g	h	i	j	k	l
a	0	1	0	1	0	1	0	0	0	0	0	0
b	1	0	0	0	1	1	0	0	0	0	0	0
c	0	1	1	1	0	0	2	0	0	0	0	0
d	0	0	1	0	0	0	0	0	0	0	0	0
e	0	1	1	0	0	1	1	1	0	0	0	0
f	0	0	0	0	0	0	0	1	0	0	1	0
g	0	0	0	0	1	0	0	0	0	0	0	0
h	0	0	0	1	0	1	0	0	0	0	0	1
i	0	0	0	0	0	0	0	0	0	0	0	0
j	0	0	0	0	0	0	0	1	0	0	0	0
k	0	0	0	0	0	0	0	0	0	0	0	0
l	0	0	0	0	1	0	1	1	0	0	0	0

Difficulty with distinguishing between displaying  
two reciprocal links (a, b) and non-directional  
links (b, e)

```
*Vertices 12
1 "a" 0.1020 0.3226
2 "b" 0.2860 0.0876
3 "c" 0.5322 0.2304
4 "d" 0.3259 0.3917
5 "e" 0.5543 0.4770
6 "f" 0.1552 0.6406
7 "g" 0.8293 0.3249
8 "h" 0.4479 0.6866
9 "i" 0.8204 0.8203
10 "j" 0.4789 0.9055
11 "k" 0.1175 0.9032
12 "l" 0.7095 0.6475

*Matrix
0 1 0 1 0 1 0 0 0 0 0 0 0
1 0 0 0 1 1 0 0 0 0 0 0 0
0 1 1 1 0 0 2 0 0 0 0 0 0
0 0 1 0 0 0 0 0 0 0 0 0 0
0 1 1 0 0 1 1 1 0 0 0 0 0
0 0 0 0 0 0 0 1 0 0 1 0
0 0 0 0 1 0 0 0 0 0 0 0 0
0 0 0 1 0 1 0 0 0 0 0 0 1
0 0 0 0 0 0 0 0 0 0 0 0 0
0 0 0 0 0 0 0 1 0 0 0 0 0
0 0 0 0 0 0 0 0 0 0 0 0 0
0 0 0 0 1 0 1 1 0 0 0 0 0
```



## Additional information

- **clu** – clustering: partition of nodes – nominal or ordinal data about nodes (node belongs to the cluster/group)
- **vec** – vector: numeric data about nodes (the property has value on node);
- **per** – permutation: ordering of nodes (node is at the certain position)

When collecting the network data consider to provide as much properties as possible.

### Wolfe Monkey Data

inter.net	inter.net	sex.clu	age.vec	rank.per
*Vertices 20		*vertices 20	*vertices 20	*vertices 20
1 "m01"	1 6 5	1	15	1
2 "m02"	1 7 9	1	10	2
3 "m03"	1 8 7	1	10	3
4 "m04"	1 9 4	1	8	4
5 "m05"	1 10 3	1	7	5
6 "f06"	1 11 3	2	15	10
7 "f07"	1 12 7	2	5	11
8 "f08"	1 13 3	2	11	6
9 "f09"	1 14 2	2	8	12
10 "f10"	1 15 5	2	9	9
11 "f11"	1 16 1	2	16	7
12 "f12"	1 17 4	2	10	8
13 "f13"	1 18 1	2	14	18
14 "f14"	2 3 5	2	5	19
15 "f15"	2 4 1	2	7	20
16 "f16"	2 5 3	2	11	13
17 "f17"	2 6 1	2	7	14
18 "f18"	2 7 4	2	5	15
19 "f19"	2 8 2	2	15	16
20 "f20"	2 9 6	2	4	17
*Edges	2 10 2			
1 2 2	2 11 5			
1 3 10	2 12 4			
1 4 4	2 13 3			
- - -	2 14 2			
	...			

0 is not allowed as node number



## Pajek

- Pajek is a program, for Windows, for analysis and visualization of large networks having some thousands or even millions of vertices. The latest version of Pajek is freely available, for noncommercial use.
- Link: <http://mrvar.fdv.uni-lj.si/pajek/>
- Creators: Andrej Mrvar and Vladimir Batagelj



### Pajek: analysis and visualization of large networks

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2018	Pajek Book Edition 3		
<a href="#">Pajek mailing list</a>		<a href="#">Datasets</a>	

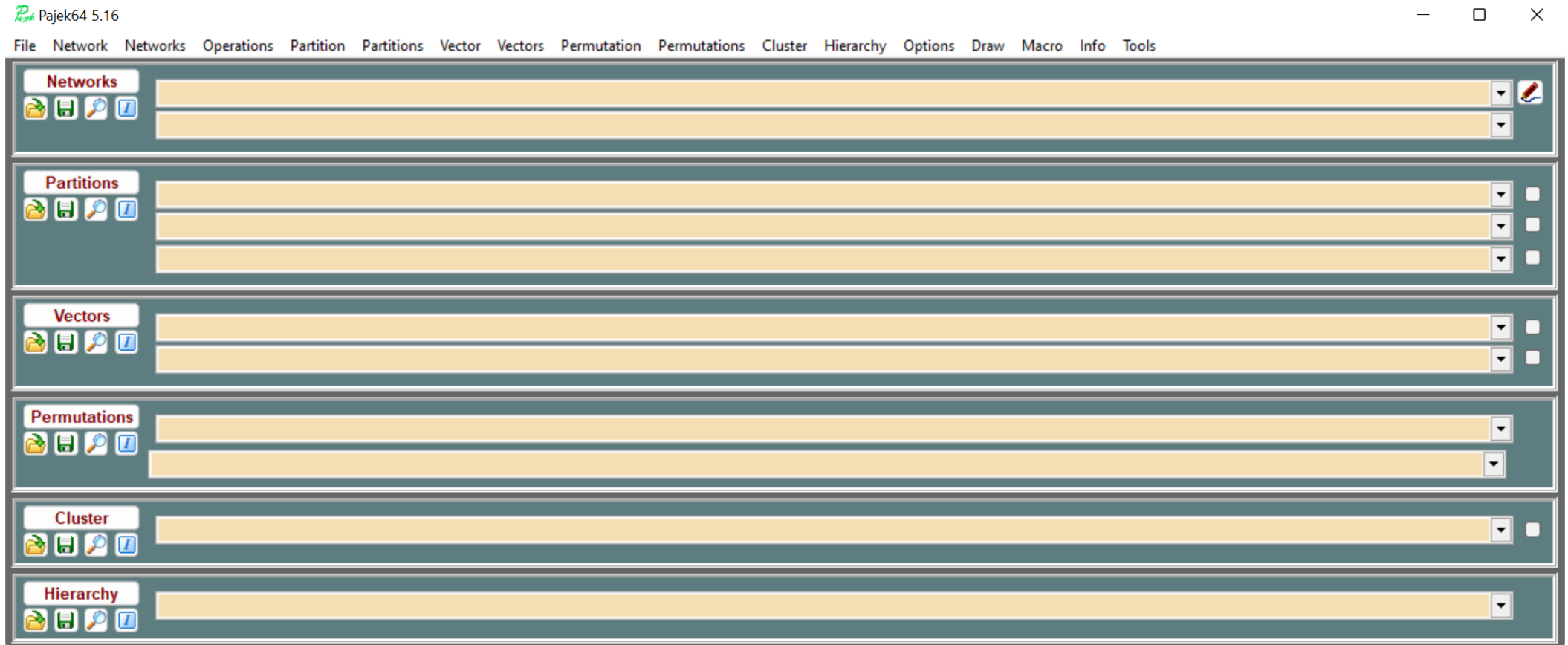








Pajek



Link to the workshop materials:

[https://github.com/Daria-Maltseva/pajek/wiki/workshop\\_masna2023](https://github.com/Daria-Maltseva/pajek/wiki/workshop_masna2023)

# 14th Summer School 'Methods and tools of social network analysis'

Date

**July 4-8**



**Save the date:** July 4, 5.45 – 7.15 PM (Moscow)

Daria Maltseva, Analysis and visualization of complex networks in Pajek