

Progress Report from UPMC

Theoretical foundations for complex networks analysis

Robin Lamarche-Perrin Clémence Magnien Matthieu Latapy
and all the Complex Networks team at LIP6

With the participation of...

People directly working on the project:

Robin Lamarche-Perrin (tenured researcher)

Matthieu Latapy (tenured researcher)

Clémence Magnien (tenured researcher)

People indirectly working on the project:

Audrey Wilmet (doctoral student)

Lionel Tabourier (tenured lecturer)

Fabien Tarissan (tenured lecturer)

Rémy Cazabet (post-doctoral student)

People founded by the project:

Mariana Patrício

→ master student from 02/2017 to 07/2017

→ has left the team

Léonard Panichi

→ master student from 03/2017 to 09/2017

→ research engineer from 10/2017 to 09/2018

Hong-Lan Botterman

→ has not arrived yet

→ doctoral student from 11/2017 to 09/2020

Review Article about “Mining Political Opinion on Twitter”

Marta Severo (UPD)

R. Lamarche-Perrin (UPMC)

I. Concepts: What is Political Opinion?

1. Opinion as a Preference
2. Opinion as a Sentiment
3. Opinion as an Interaction
4. Opinion as an Agenda

II. Methods: The challenges of digital traces

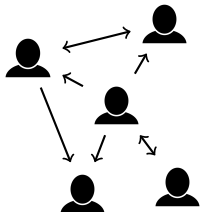
1. About Multi-scale Approaches
2. About Explanatory vs. Predictive Approaches
3. About Supervised vs. Unsupervised Approaches

Publication planned for September 2017 in *Revue française de sociologie*

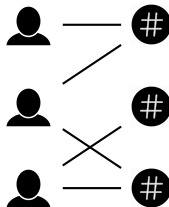
Contributes to **Deliverable 1.3**: “Conceptual grounds for the analysis of opinions about international conflicts in the media”

Work in Graph Theory

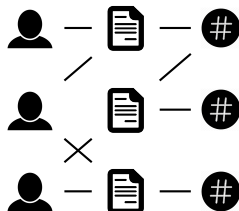
$(\text{user} \times \text{user})$



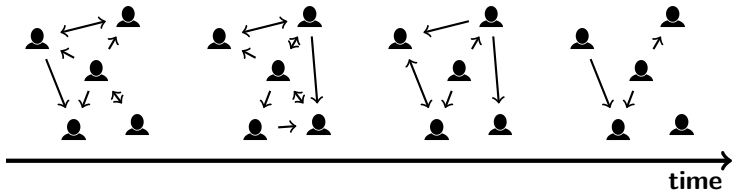
$(\text{user} \times \text{topic})$



$(\text{user} \times \text{info} \times \text{topic})$



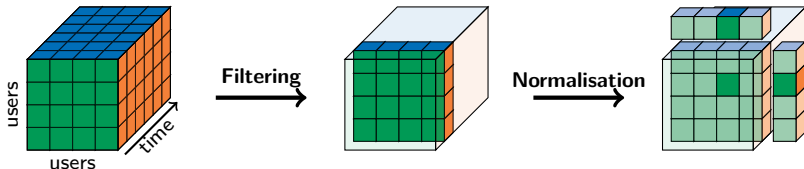
$(\text{user} \times \text{user} \times \text{time})$



Multidimensional analysis of dynamical interaction graphs

(user \times user \times time)

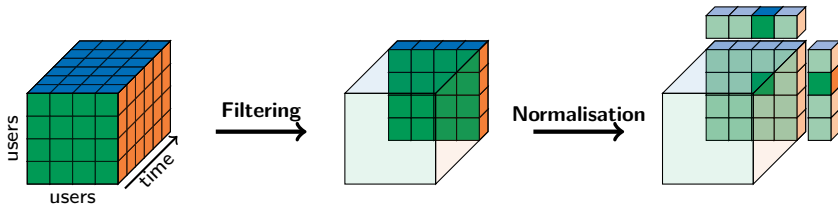
Audrey Wilmet
R. Lamarche-Perrin
Matthieu Latapy



Multidimensional analysis of dynamical interaction graphs

(user \times user \times time)

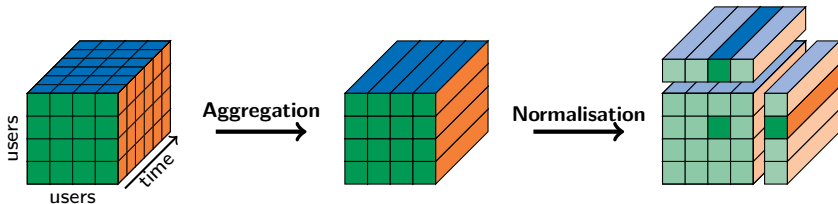
Audrey Wilmet
R. Lamarche-Perrin
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Multidimensional analysis of dynamical interaction graphs

(user \times user \times time)

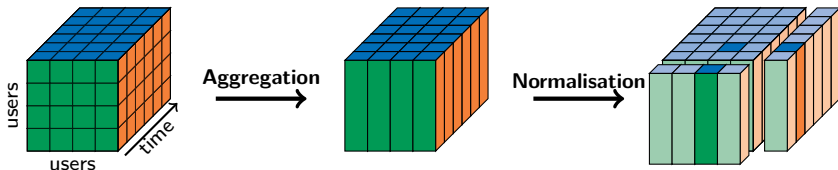
Audrey Wilmet
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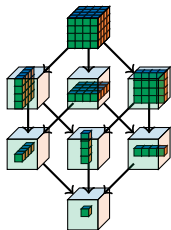
Multidimensional analysis of dynamical interaction graphs

(user \times user \times time)

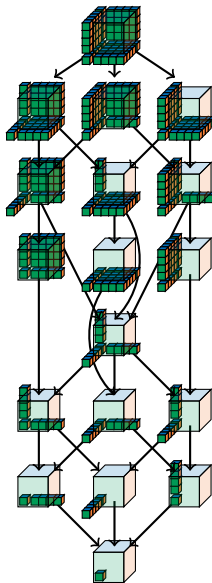
Audrey Wilmet
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Matthieu Latapy



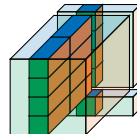
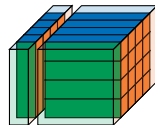
Filtering



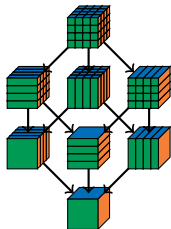
Normalisation



Many combinations



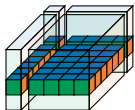
Aggregation



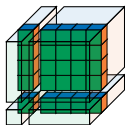


The GEOMEDIA Project

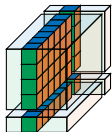
Grasland, Lamarche-Perrin, Loveluck, Pecout, "International agenda-setting, the media and geography", In *L'Espace géographique*, 45:1, p. 25-43, 2016.



Internal spatio-temporal agenda
of a given newspaper



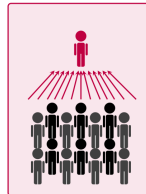
Global spatial agenda
of a given time period



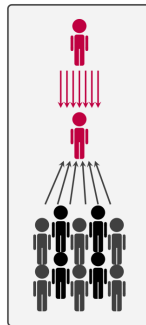
Global temporal agenda
of a given country

The ODYCCEUS Project

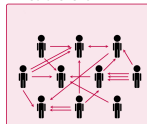
Political leader



Political activist



Media event



Multidimensional analysis of dynamical interaction graphs

(user \times user \times time)

Audrey Wilmet
R. Lamarche-Perrin
Matthieu Latapy

Contributes to **Deliverable 3.4**:

“Multidimensional and multilevel analysis of interactions in social systems”

Module for **Penelope**: Implementation of basic operations on multidimensional interaction data (and description of their semantics for the analysis)

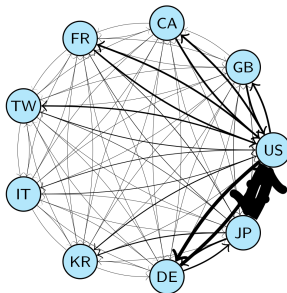
Communication on the 28th of September at the *Third European Conference on Social Networks* (EUSN'17)

Optimisation algorithms for lossy graph compression

(user \times user)

Léonard Panichi
R. Lamarche-Perrin
Clémence Magnien

	GB	CA	FR	TW	IT	KR	DE	JP	US
GB		3	5	1	2	0	11	23	82
CA	3		3	2	1	0	6	15	89
FR	5	3		1	3	1	14	28	83
TW	2	3	2		1	3	4	22	62
IT	2	1	3	1		0	7	12	31
KR	2	1	2	2	1		3	47	44
DE	11	6	12	2	6	1		78	167
JP	24	14	23	9	9	14	66		504
US	86	87	75	37	29	16	161	519	

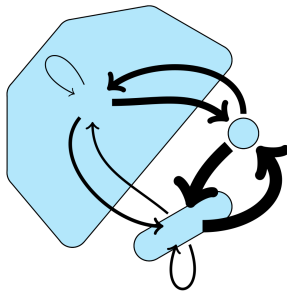


Optimisation algorithms for lossy graph compression

(user \times user)

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R. Lamarche-Perrin
Clémence Magnien

	GB	CA	FR	TW	IT	KR	DE	JP	US
GB									
CA									
FR									
TW				59			192		391
IT									
KR									
DE							131	144	671
JP									
US				330			680		



Classical block model \rightarrow Aggregation of vertices

	v_1	v_2	v_3	v_4	v_5
v_1	1	1	3	18	6
v_2	0	2	0	19	11
v_3	1	0	9	19	11
v_4	8	9	10	21	19
v_5	11	12	10	20	20

Empirical Distribution: $X \in V^2$

$$p_X(v, v') = \frac{w(v, v')}{|E|}$$

Information Loss
 $D_{KL}(p_X \| q_X)$

	v_1	v_2	v_3	v_4	v_5
v_1	1	2	2	14	10
v_2	2	2	2	16	11
v_3	2	3	2	20	14
v_4	8	12	9	23	16
v_5	8	13	10	25	17

Decompressed Distribution

$$q_X(v, v') = \frac{w(M_i, M_j) w(v, \cdot) w(\cdot, v')}{w(M_i, \cdot) w(\cdot, M_j) |E|}$$

	v_1	v_2	v_3	v_4	v_5
v_1					
v_2					
v_3					
v_4					
v_5					

Compression Variable: $\hat{X} \in \mathcal{V}^2$

$$p_{\hat{X}|X}(M_i, M_j | v, v') = \mathbf{1}_{M_i \times M_j}(v, v')$$

	$\{v_1, v_2, v_3\}$	$\{v_4, v_5\}$
$\{v_1, v_2, v_3, v_1\}$	18	84
$\{v_5, v_4\}$	60	80

Compressed Distribution

$$p_{\hat{X}}(M_i, M_j) = \frac{w(M_i, M_j)}{|E|}$$

	v_1	v_2	v_3	v_4	v_5
v_1	3	4	3	12	8
v_2	3	4	3	13	9
v_3	4	6	4	17	11
v_4	6	9	7	27	19
v_5	6	10	7	29	20

Decompression Variable: $X^* \in V^2$

$$u_{X^*}(v, v') = \frac{w(v, \cdot) w(\cdot, v')}{|E|}$$

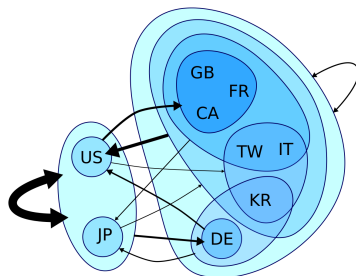
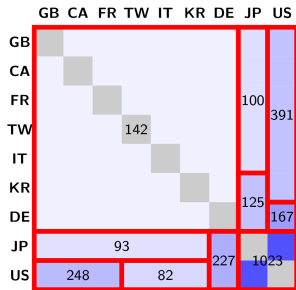
	v_1	v_2	v_3	v_4	v_5
v_1					29
v_2					32
v_3					41
v_4					67
v_5					73

External Information

Optimisation algorithms for lossy graph compression

(user \times user)

Léonard Panichi
R. Lamarche-Perrin
Clémence Magnien



Power graph decomposition

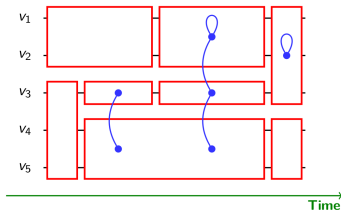
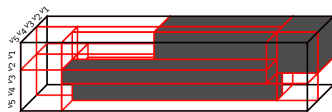
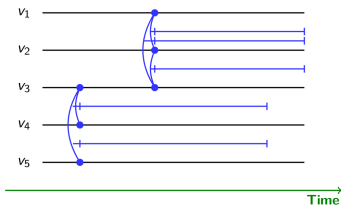
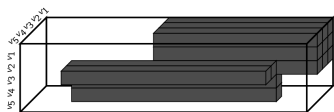


Aggregation of edges

Optimisation algorithms for lossy graph compression

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Clémence Magnien



Optimisation algorithms for lossy graph compression

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R. Lamarche-Perrin
Clémence Magnien

Contributes to **Deliverable 3.4**:

“Multidimensional and multilevel analysis of interactions in social systems”

Module for **Penelope**: Implementation of efficient algorithms for the multiscale compression of interaction data (with parametrised information loss)

Master thesis by Léonard Panichi:

“Algèbre et algorithmes pour la compression de graphes”

Article planned for October 2017 in *Theoretical Computer Science*:

“A General Framework for Lossy Graph Compression”

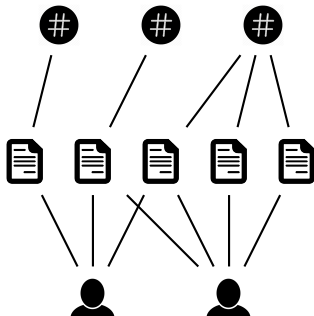
Article planned for Spring 2018:

“Heuristics for the Lossy Graph Compression Problem”

Measuring informational diversity in digital media

(user \times item \times topic)

R. Lamarche-Perrin
Lionel Tabourier
Fabien Tarissan
Rémy Cazabet

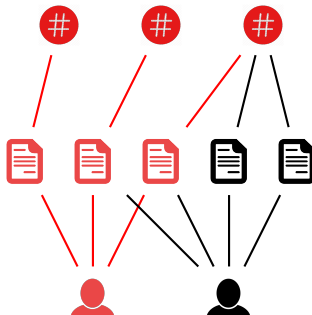


In collaboration with the French **ANR AlgoDiv Project**:
“Algorithmic recommandation and diversity of information on the web”

Measuring informational diversity in digital media

(user \times item \times topic)

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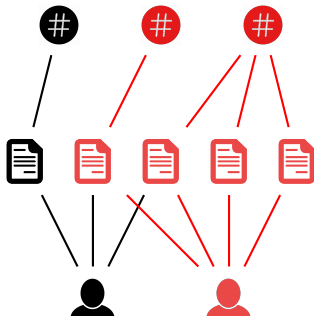


In collaboration with the French **ANR AlgoDiv Project**:
“Algorithmic recommendation and diversity of information on the web”

Measuring informational diversity in digital media

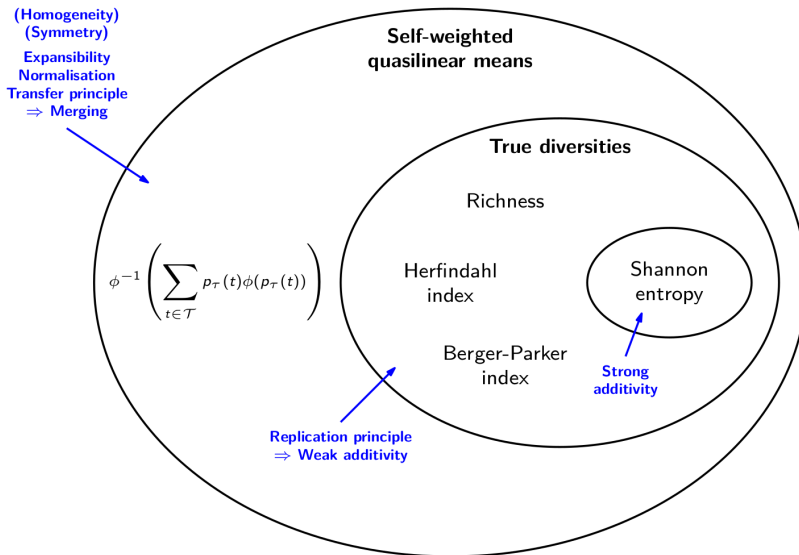
(user \times item \times topic)

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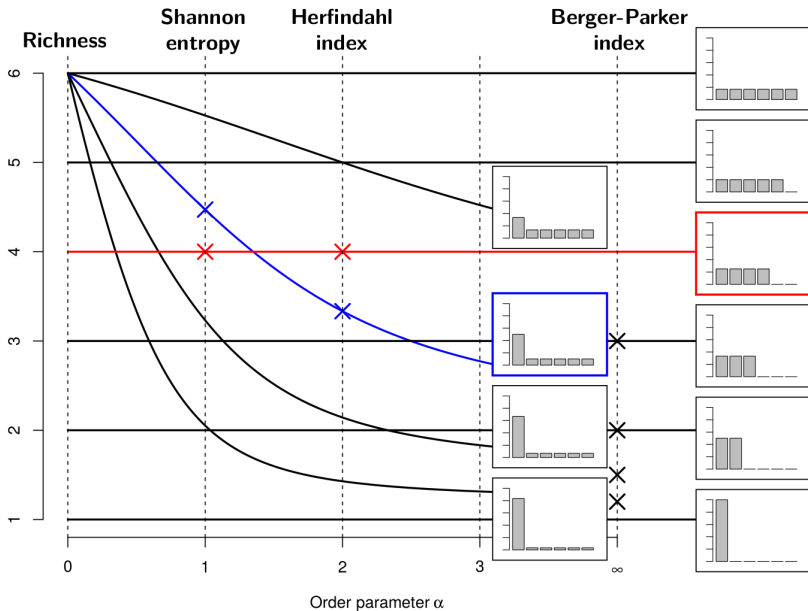


In collaboration with the French **ANR AlgoDiv Project**:
“Algorithmic recommendation and diversity of information on the web”

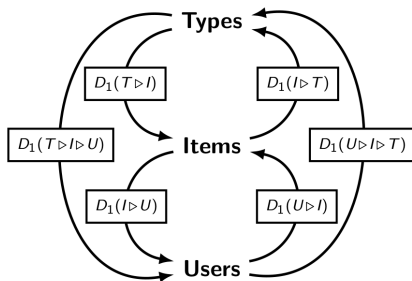
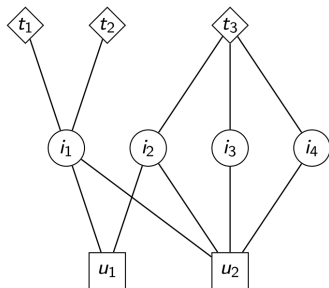
Axiomatic characterisation of diversity measures



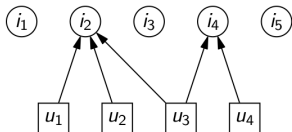
The parametrised class of “true diversity” measures



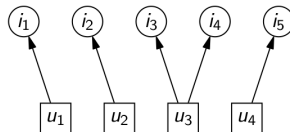
Applying diversity measures to tripartite networks



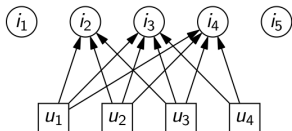
Applying diversity measures to tripartite networks



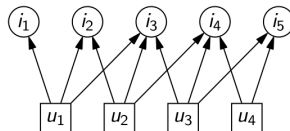
Weak individual diversity
Weak system diversity



Weak individual diversity
Strong system diversity

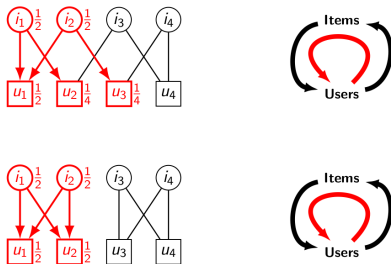


Strong individual diversity
Weak system diversity



Strong individual diversity
Strong system diversity

Applying diversity measures to tripartite networks



Same system diversity
Same individual diversity

Different “retroactive” individual diversity!

Measuring informational diversity in digital media

(user \times item \times topic)

R. Lamarche-Perrin
Lionel Tabourier
Fabien Tarissan
Rémy Cazabet

Contributes to **Deliverable 3.4**:

“Multidimensional and multilevel analysis of interactions in social systems”

Module for **Penelope**: Implementation of such measures to quantify and analyse information diversity in digital media

Article planned for Spring 2018 in *Theoretical Computer Science*

Thank you for your attention



complexnetworks.fr

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