## PAAMS'13 Salamanca, 22th May 2013

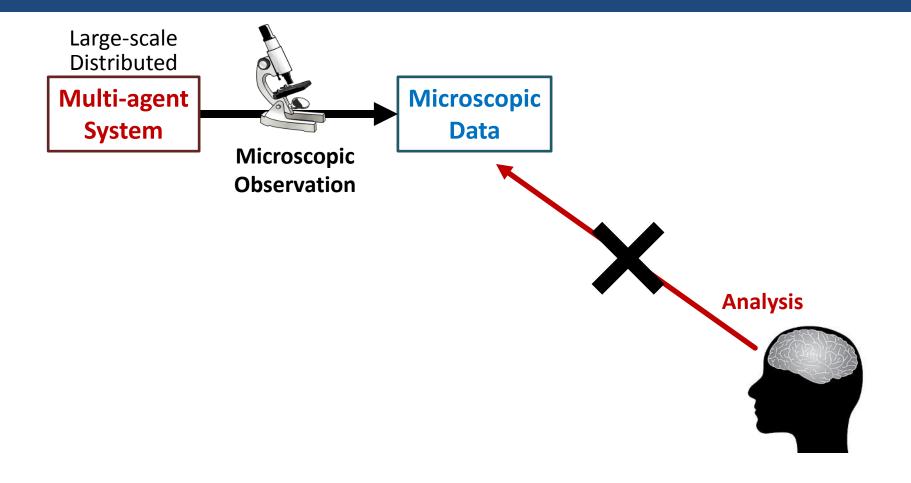
# How to Build the **Best Macroscopic Description** of your Multi-agent System?

Laboratoire d'Informatique de Grenoble

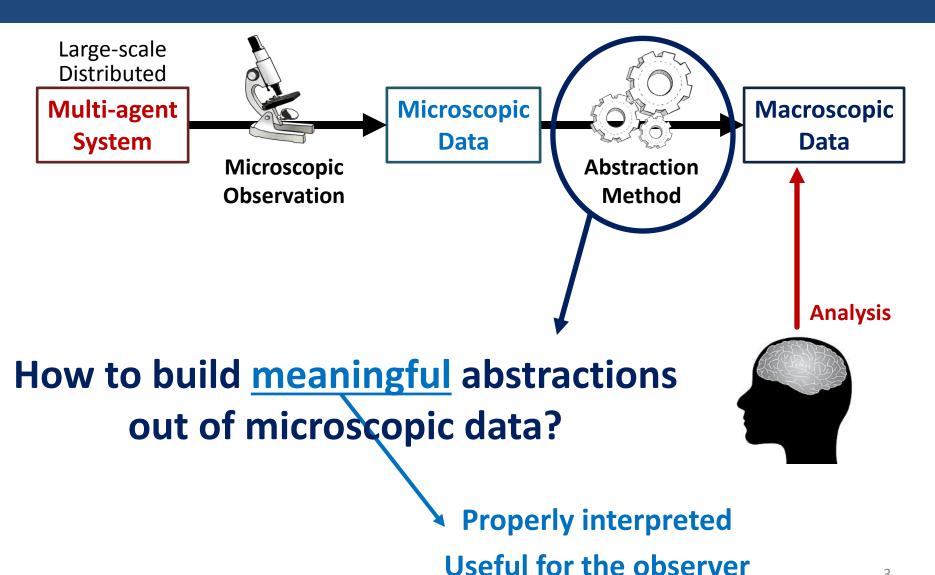
Robin Lamarche-Perrin Yves Demazeau Jean-Marc Vincent



## **Problem: Analysis of Large-scale MAS**



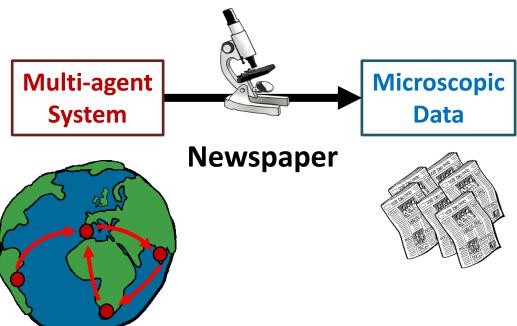
### **Problem: Analysis of Large-scale MAS**





#### **Analysis of international relations**

through print media observation

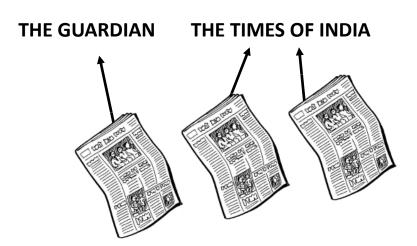


**Agents: nations** 

**Interactions:** international relations

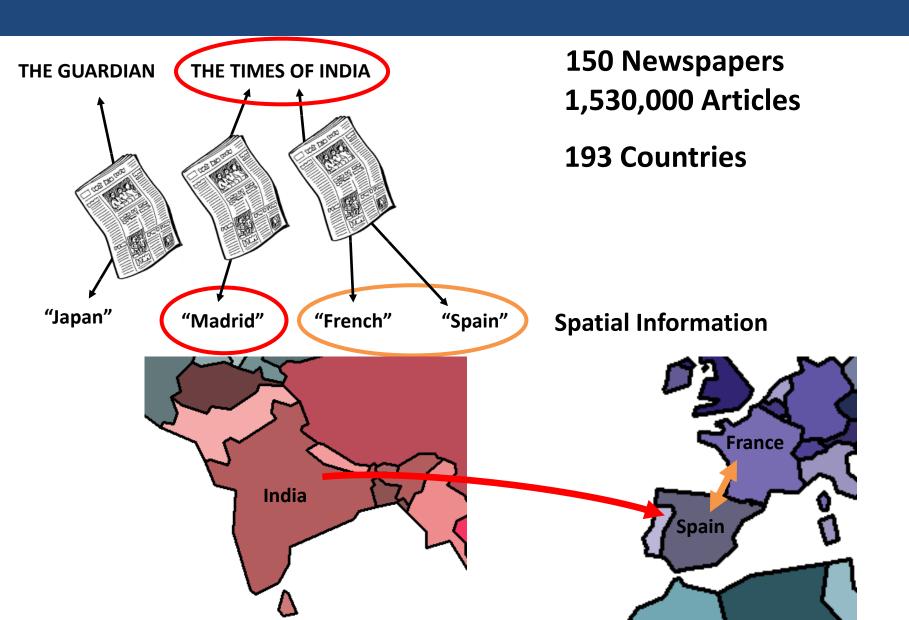
**Organisation:** geopolitical context

## **Counting Citations**

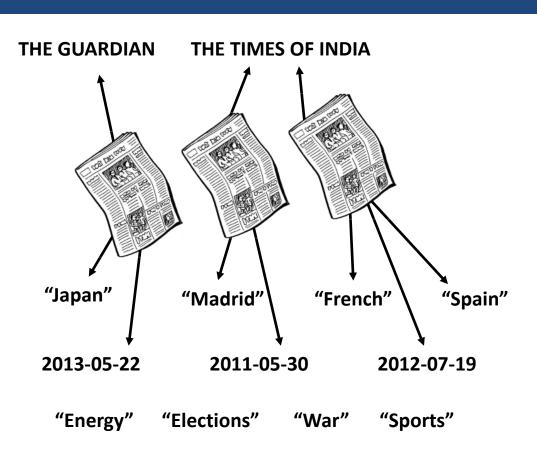


150 Newspapers1,530,000 Articles

## **Counting Citations**



#### **Counting Citations**



150 Newspapers 1,530,000 Articles

193 Countries720 Days

 $\rightarrow$  20,844,000 cells

**Spatial Information** 

**Temporal Information** 

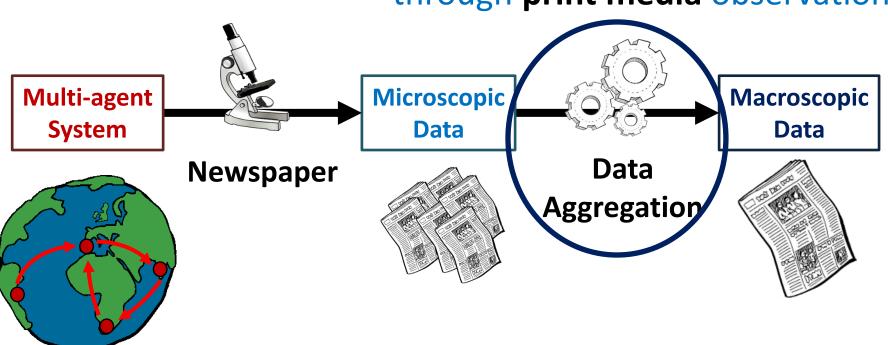
**Thematic Information** 

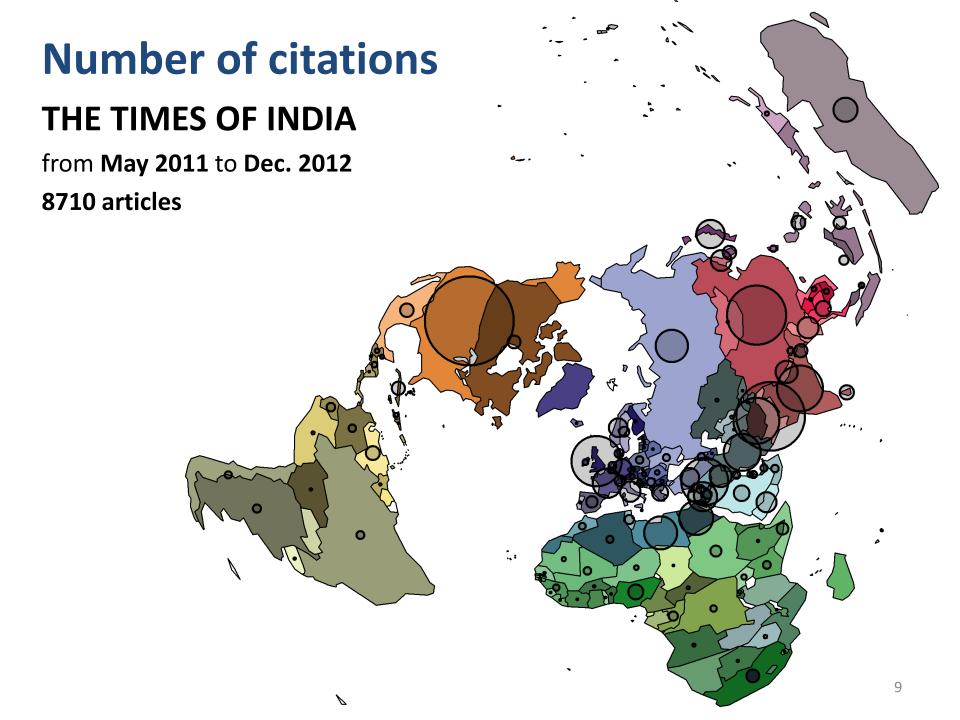
And so on...

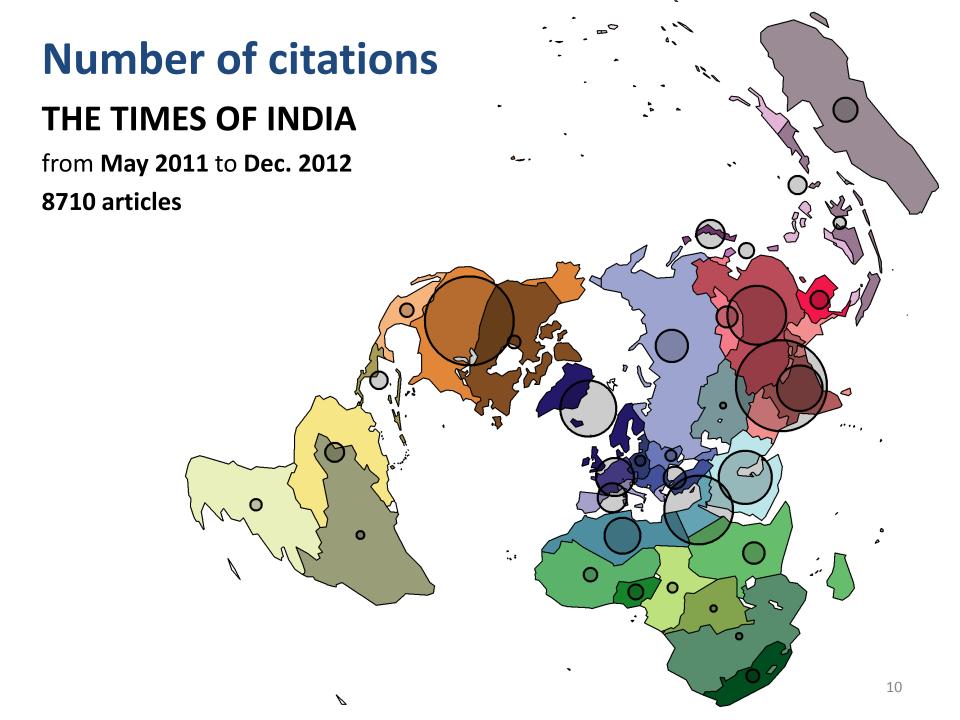


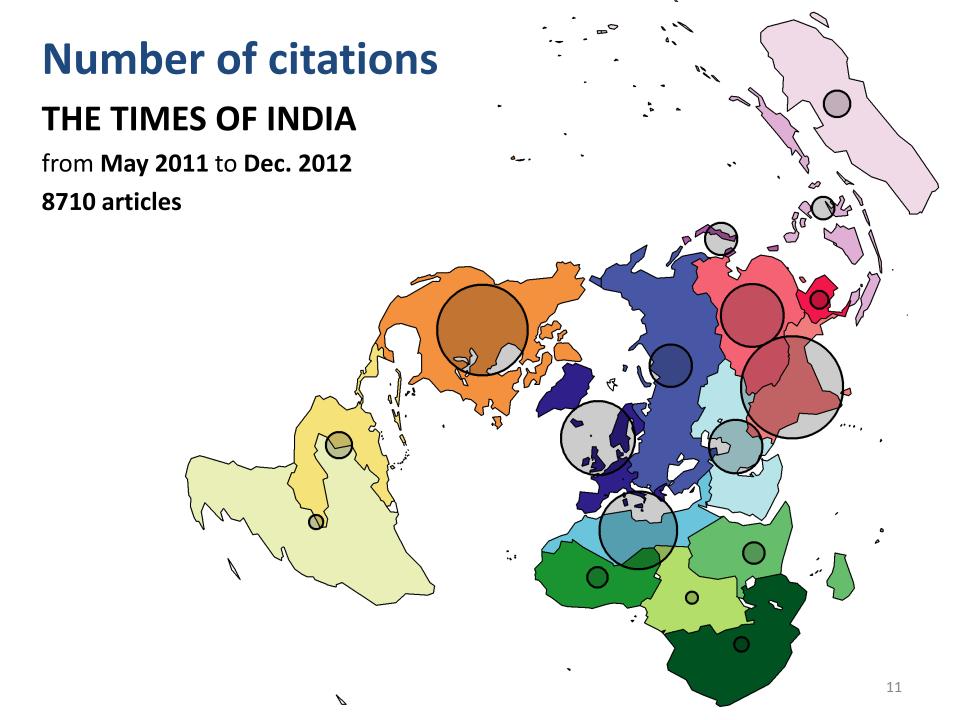
#### **Analysis of international relations**

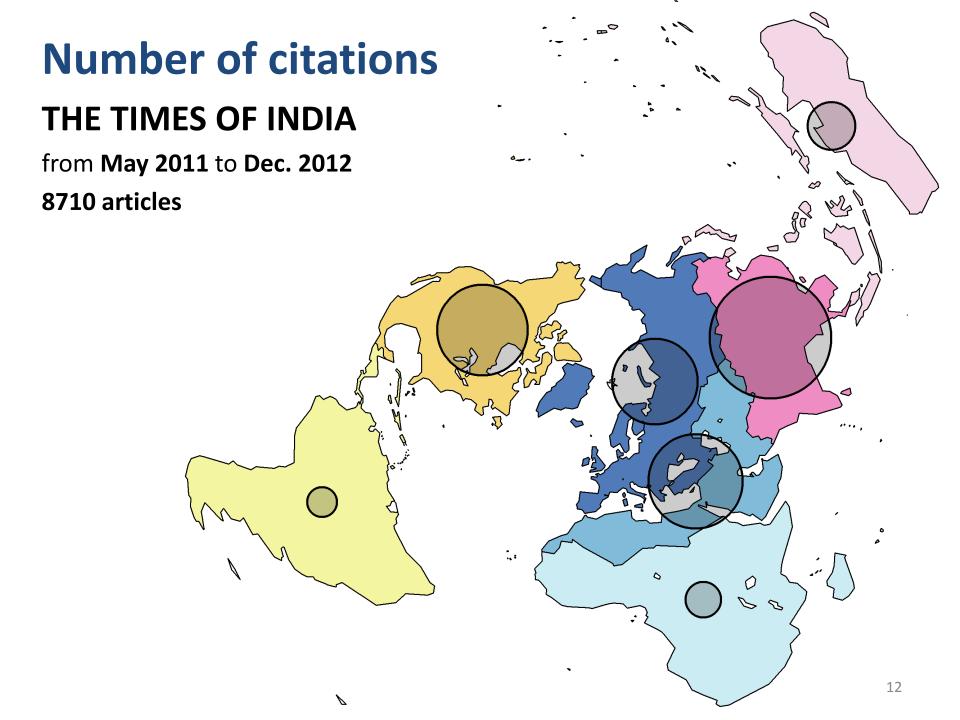
#### through print media observation

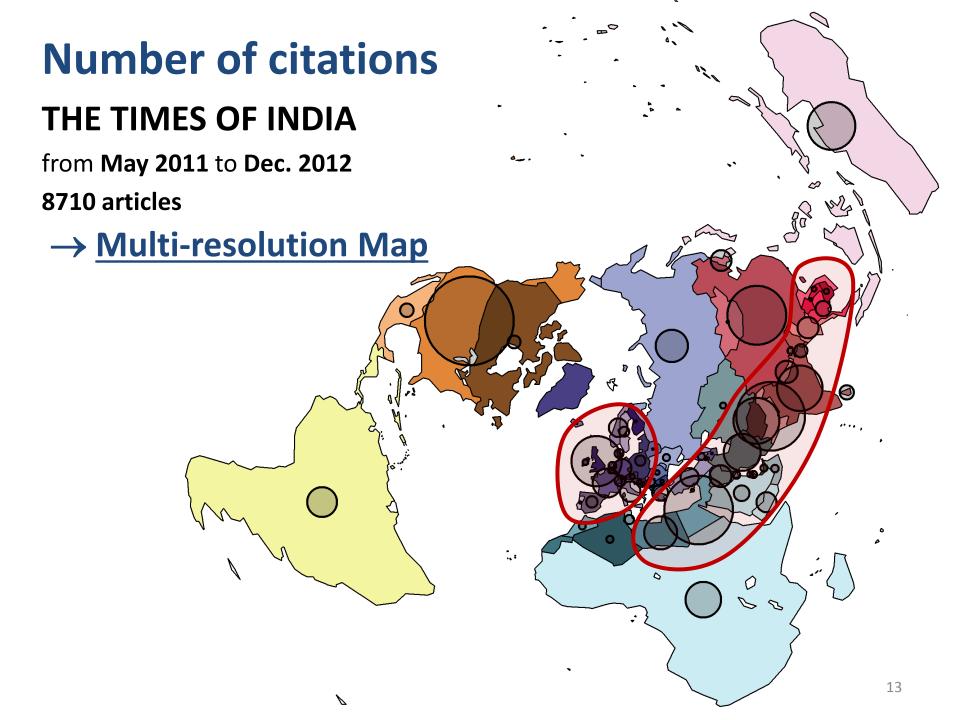


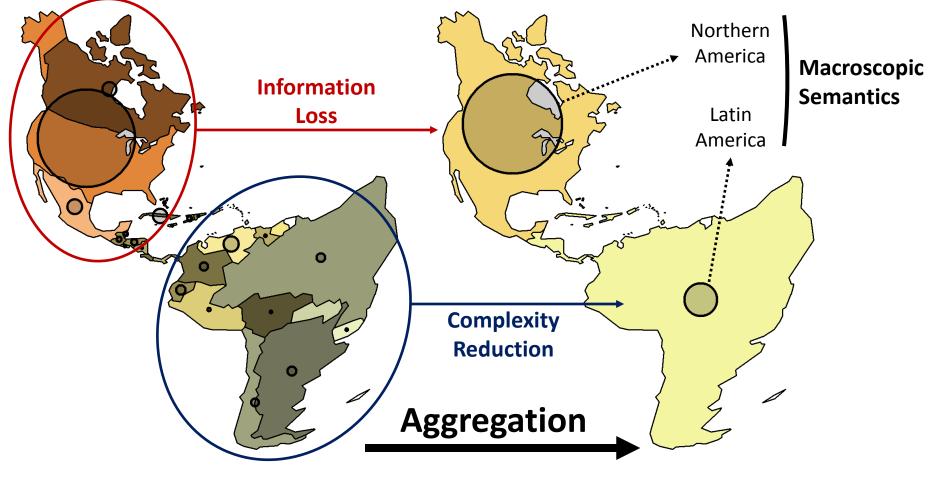












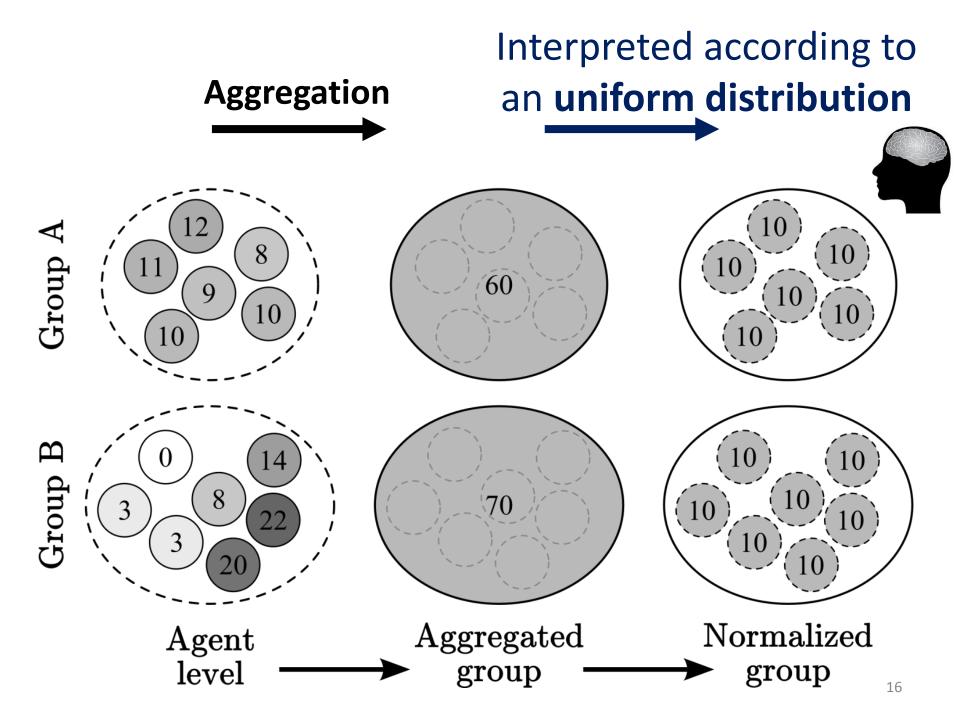
#### Outline:

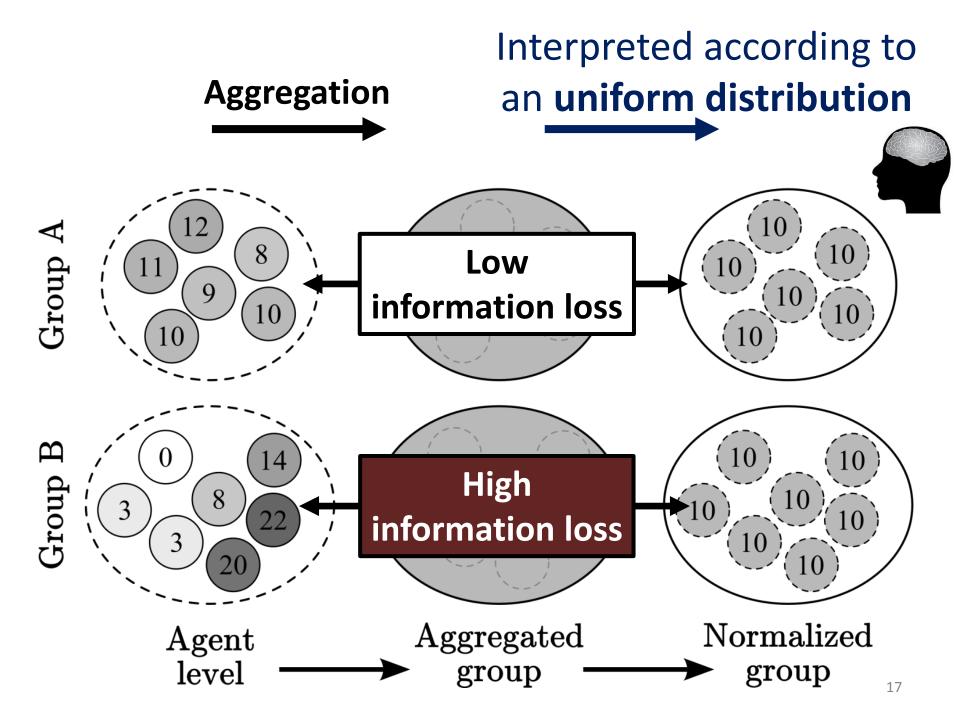
1. Information Loss

**Information Theory** 

- 2. Complexity Reduction
- 3. Macroscopic Semantics

## MEASURING THE INFORMATION LOSS



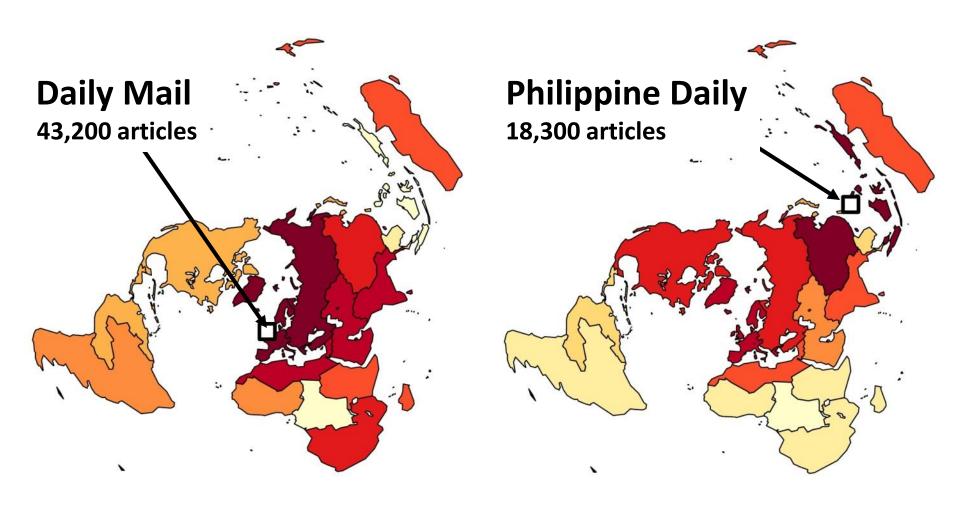


### Kullback-Leibler Divergence

$$loss(p \parallel q) = \sum_{} p(x) \times \log_2\left(\frac{p(x)}{q(x)}\right)$$
 in bits/citation

Microscopic Aggregated distribution

Quantity of information that one loses by using an aggregated description instead of the microscopic description





## MEASURING THE COMPLEXITY REDUCTION

## **Shannon Entropy**

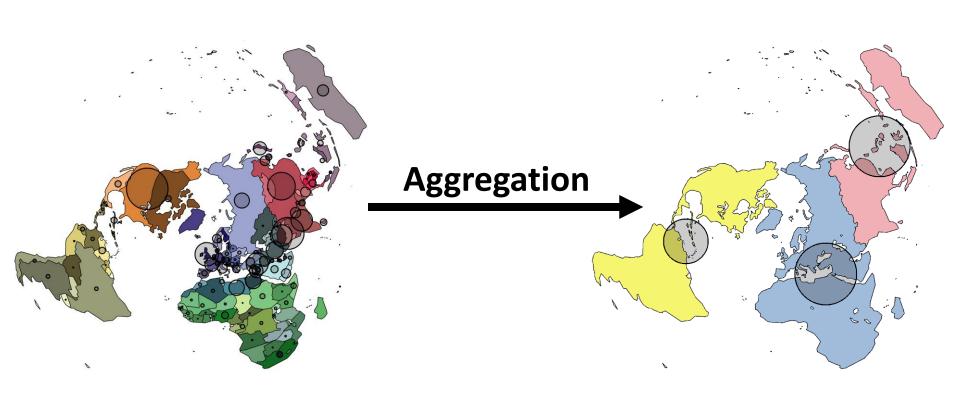
$$H(p) = \sum p(x) \times \log_2 p(x)$$
 in bits/citation

**Entropy Reduction:** 

$$gain(p \parallel q) = H(p) - H(q)$$

Microscopic Aggregated distribution distribution

Quantity of information that one saves by encoding the aggregated description instead of the microscopic description

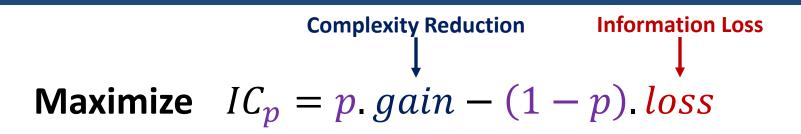


**Low Information Loss** 

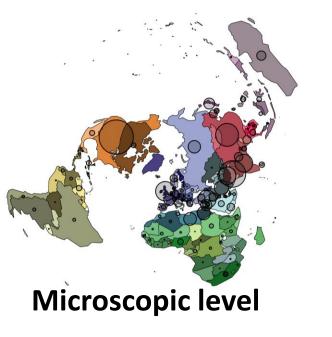
Kullback-Leiber Divergence

High Information Loss

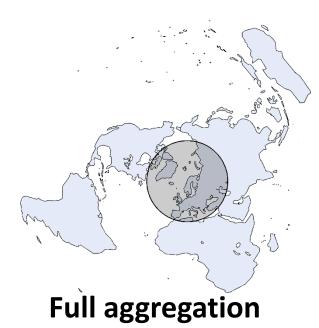
#### **Parameterized Information Criterion**



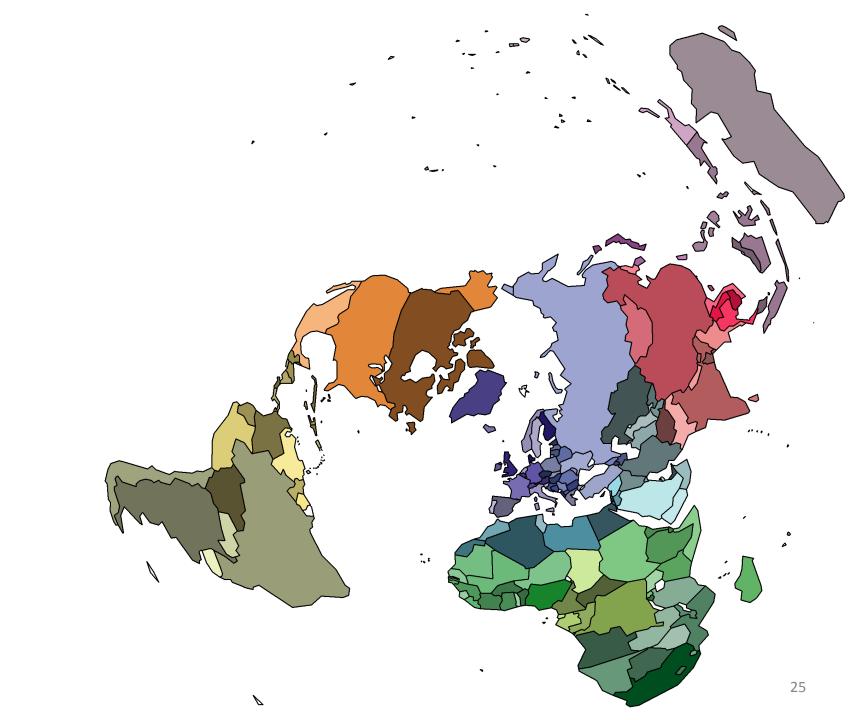
$$IC_0 = -\frac{loss}{p \in ]0,1[} \qquad IC_1 = gain$$

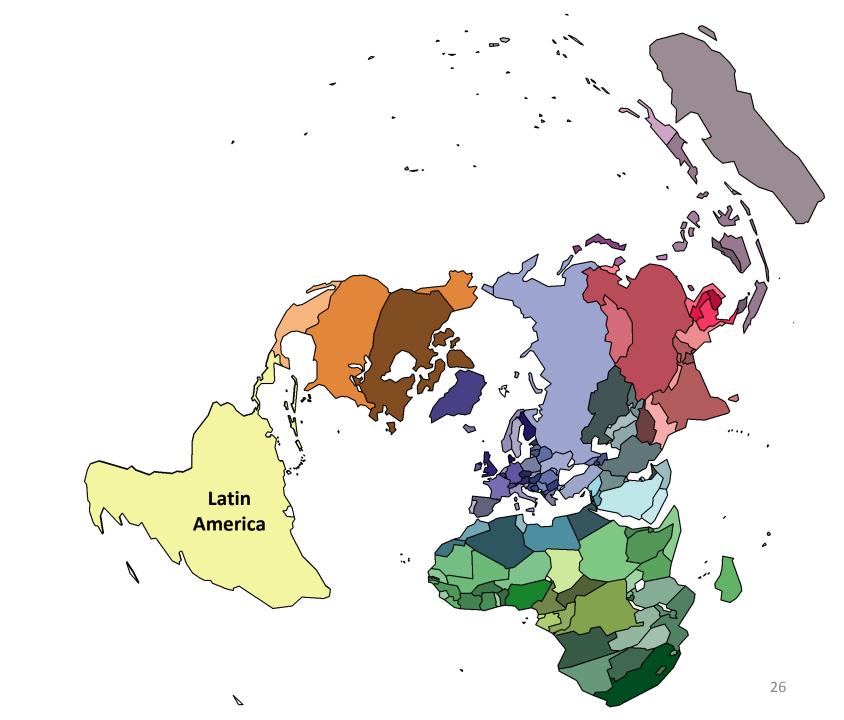


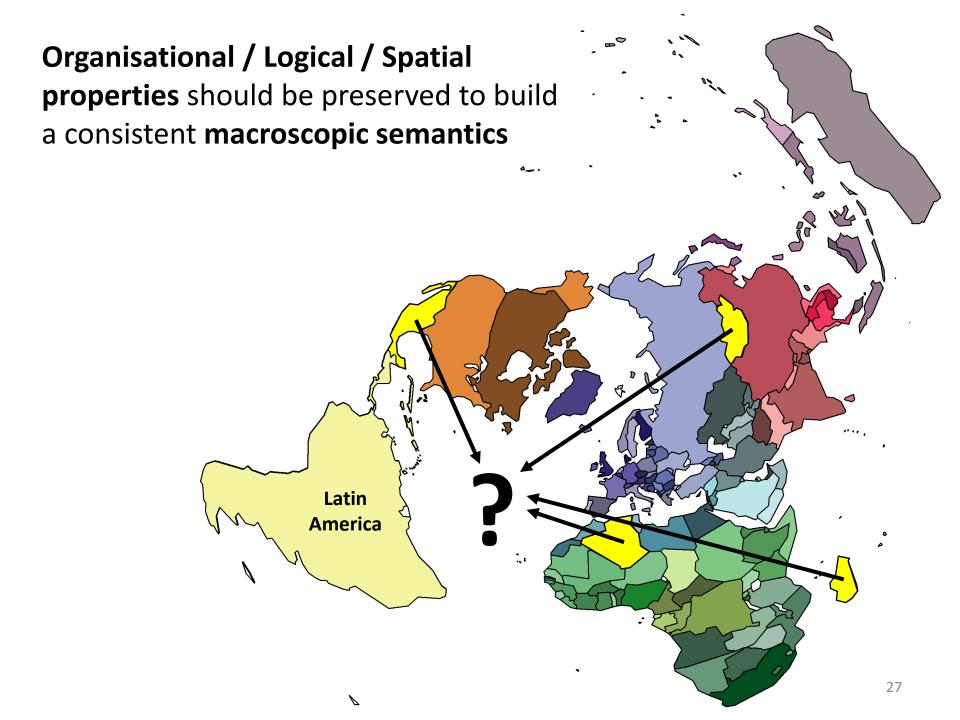




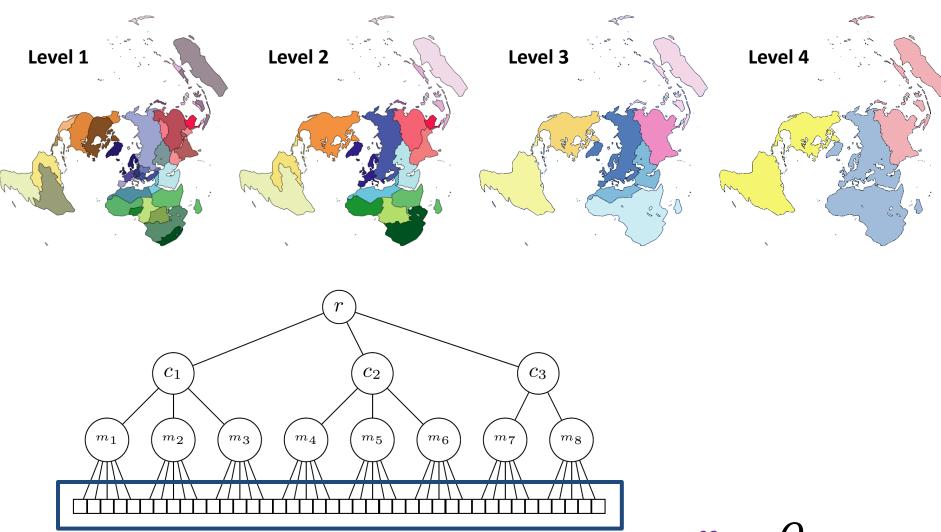
#### **MACROSCOPIC SEMANTICS**



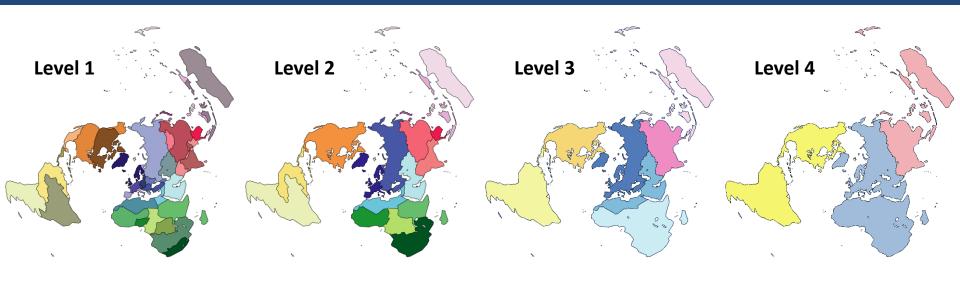


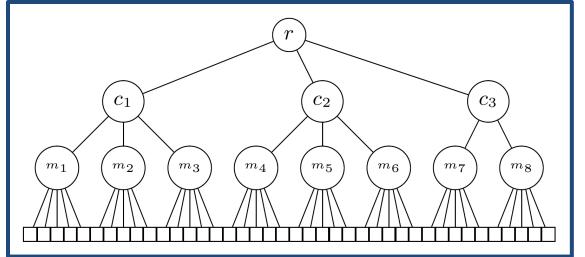


### **Hierarchical MAS**



## **Hierarchical MAS**

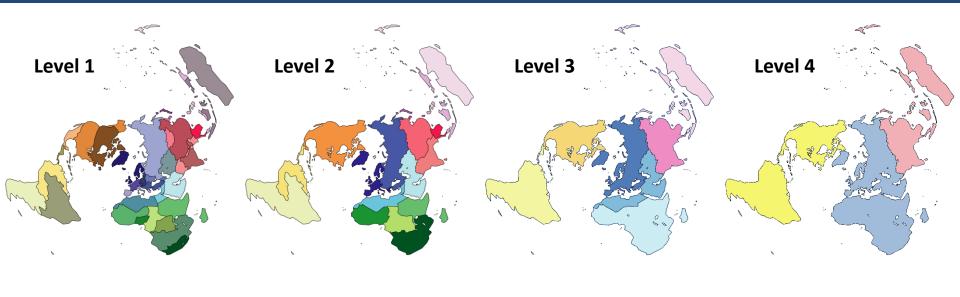


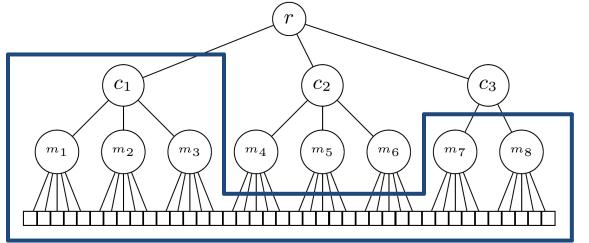


$$p=1$$

$$p = 0$$

## **Hierarchical MAS**

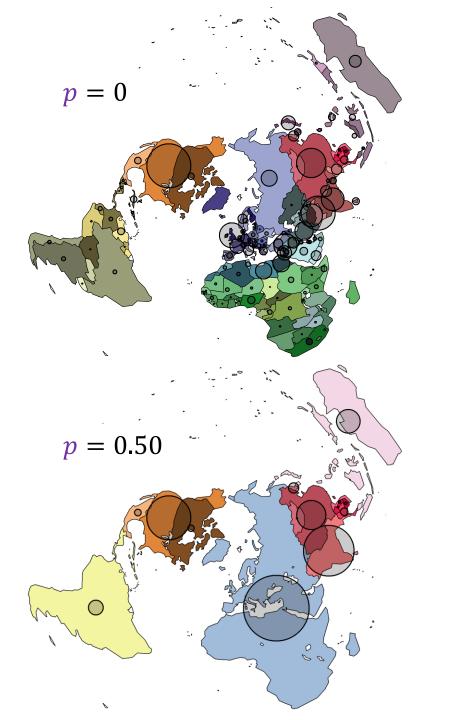


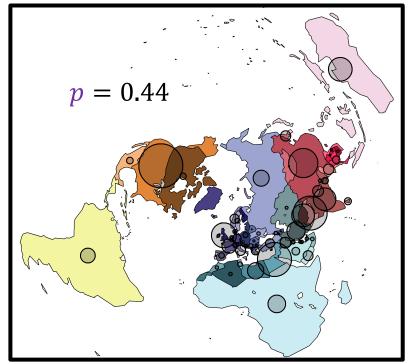


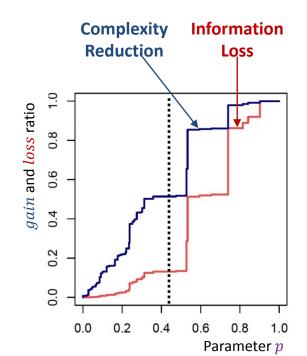
$$p = 1$$

$$\downarrow$$

$$p = 0$$

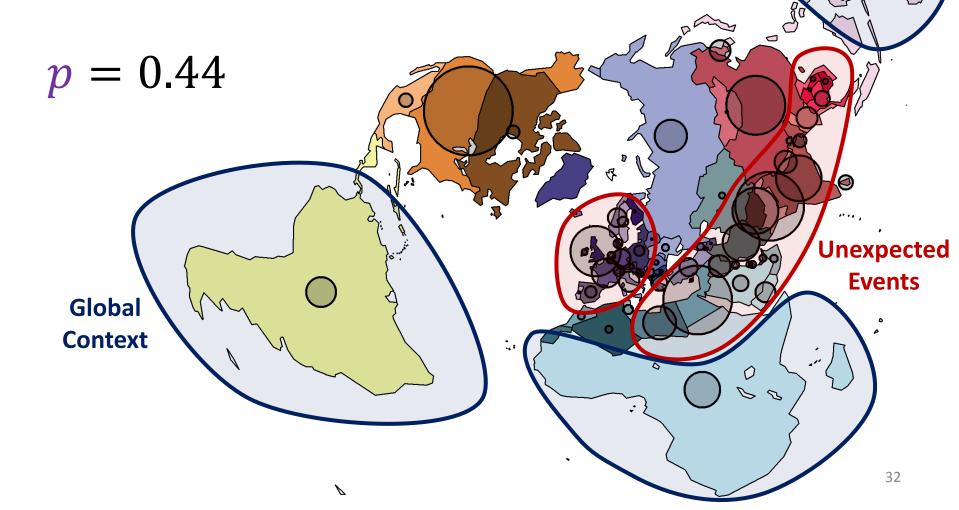




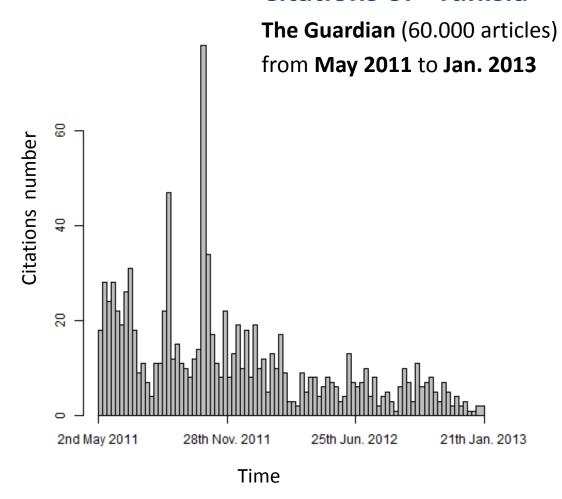


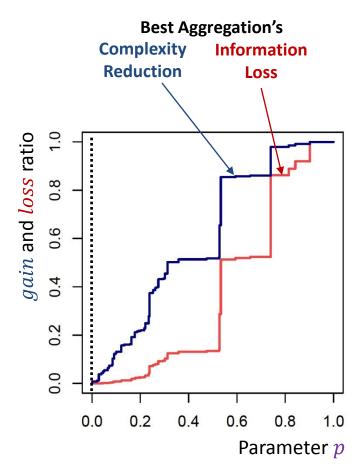
#### **Number of citations**

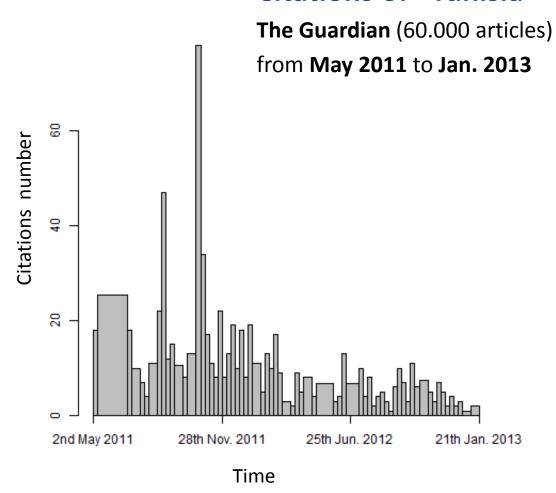
The Times of India – "World" RSS Feed from 30<sup>th</sup> May 2011 to 30<sup>th</sup> Dec. 2012 8710 articles

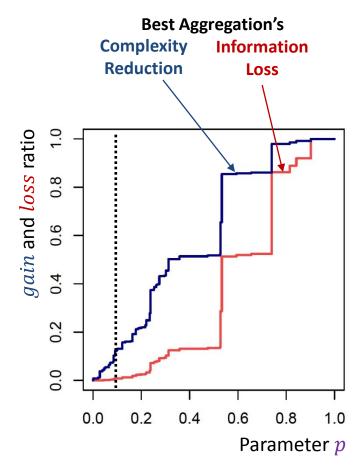


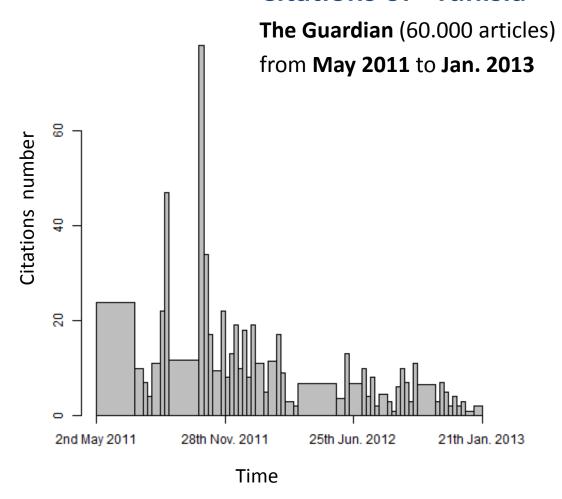
#### **TEMPORAL AGGREGATION**

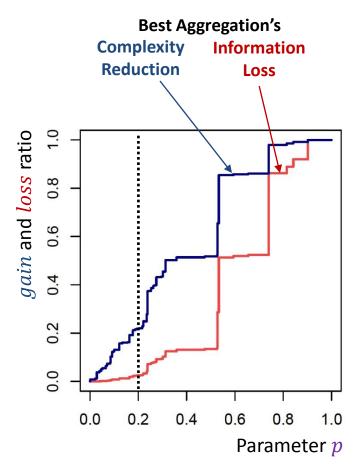


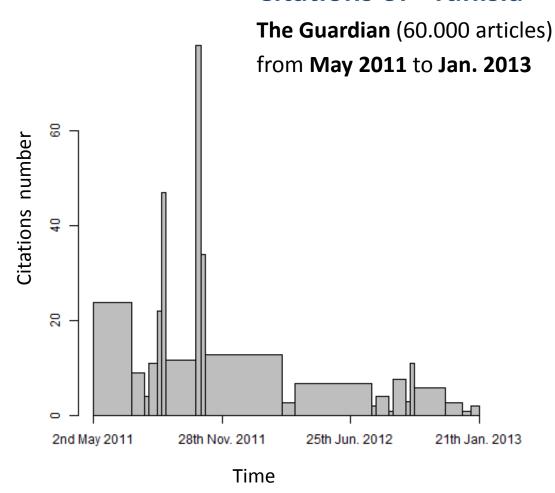


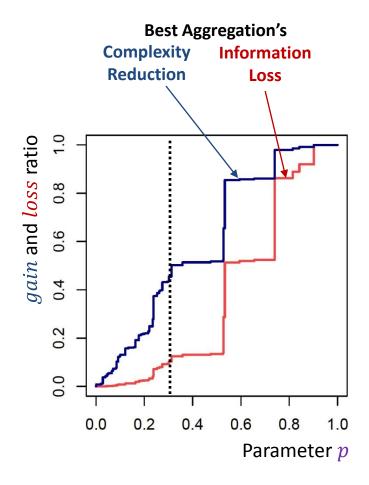


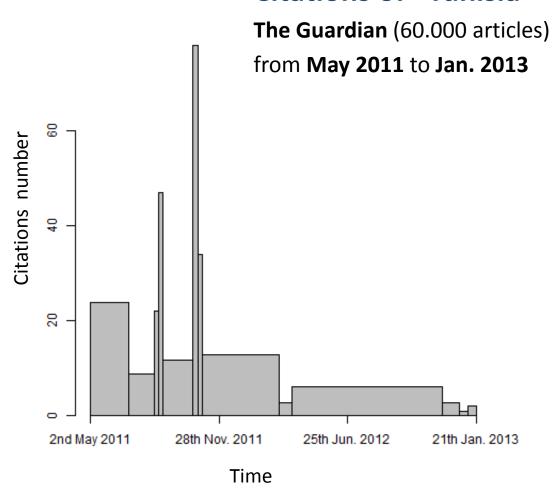


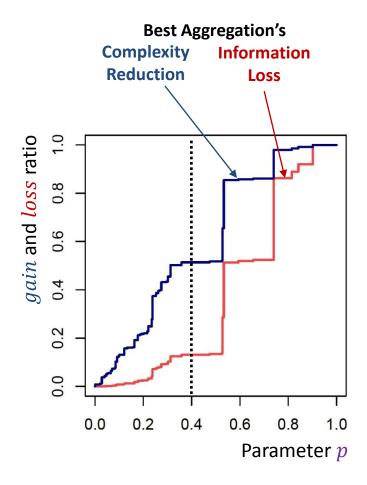


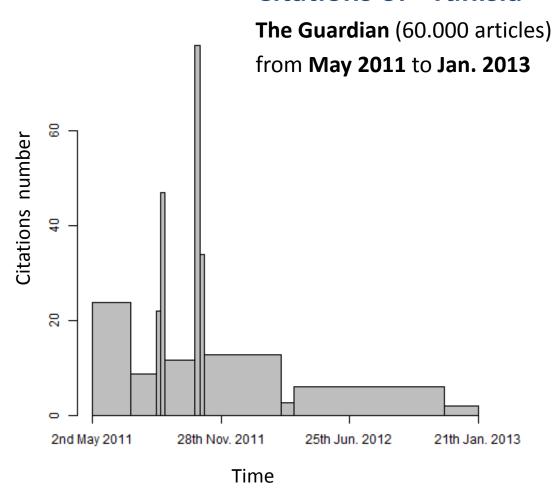


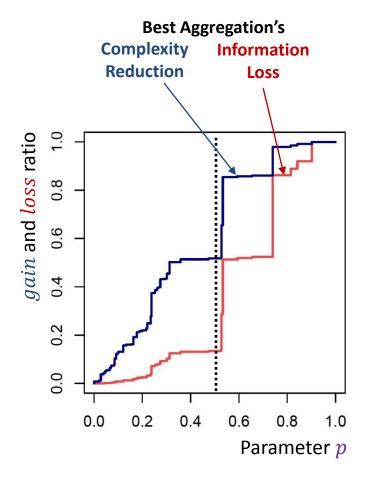


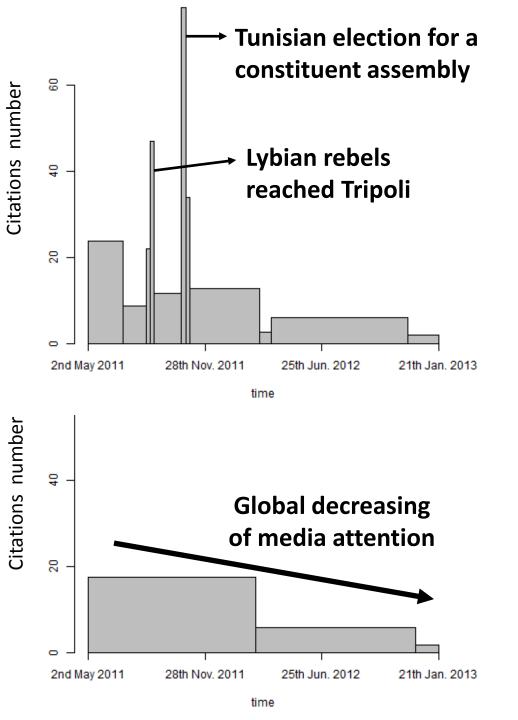


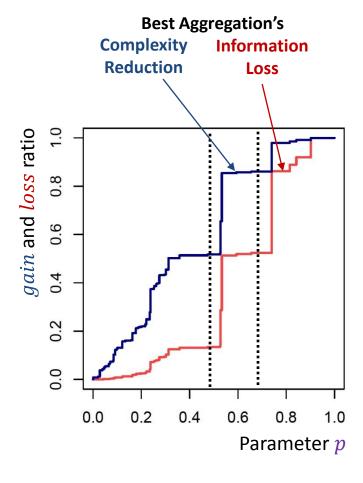












#### **CONCLUSION AND PERSPECTIVES**

#### Results

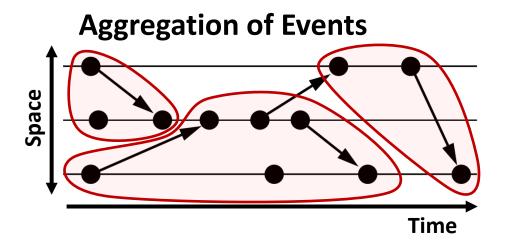
## Multi-resolution descriptions of systems from data aggregation

needs the careful control of

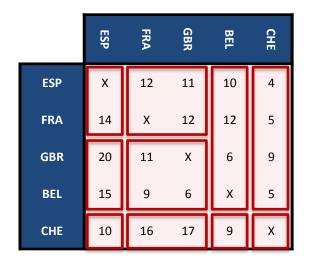
Information Content

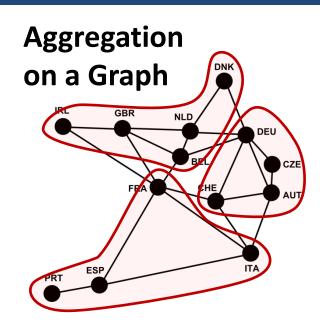
Macroscopic Semantics

## **Perspectives**



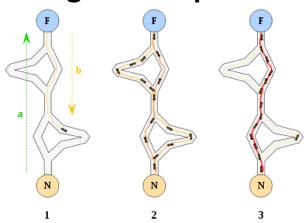
#### **Aggregation of Interactions**



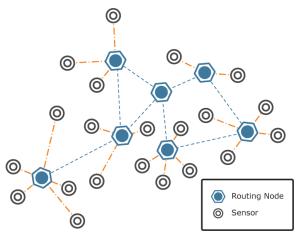


## Perspectives

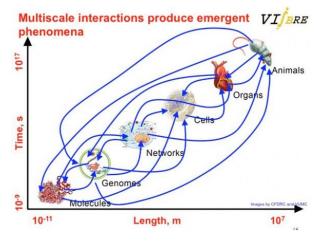
#### **Emergent Computation**



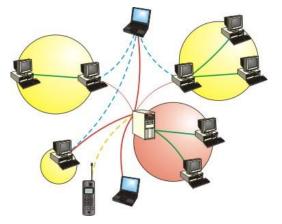
#### **Sensor Networks**



#### **Multi-scale Agent-based Simulation**



#### **Grid Computing**



## **DEMO SESSION TODAY 17:30-18:00**

#### THANK YOU FOR YOUR ATTENTION

Email: Robin.Lamarche-Perrin@imag.fr

Page: magma.imag.fr/content/robin-lamarche-perrin

