



chimica

# L'interpretazione dei dati chimico- ambientali

*Le potenzialità dell'Analisi Multivariata*

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Climate-KIC is supported by the EIT, a body  
of European Union

Torino, 20 ottobre 17 – HACKADEMY



# DALL'UNIVARIATO AL MULTIVARIATO

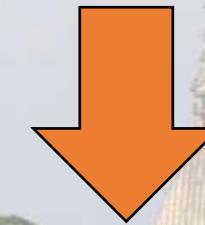
## UNIVARIATO



1 variabile  
per volta



## MULTIVARIATO

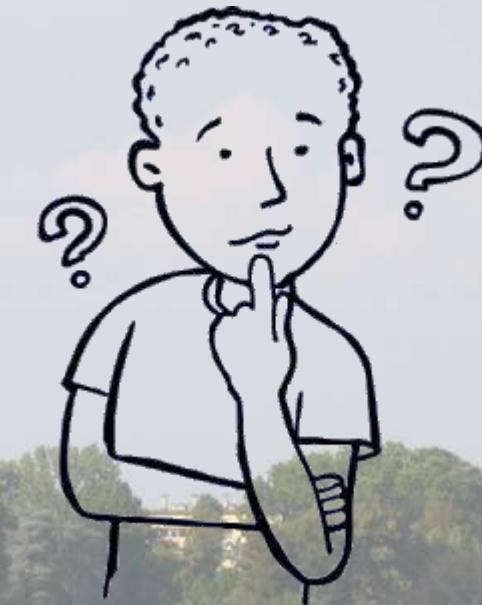


Tutte le variabili  
simultaneamente

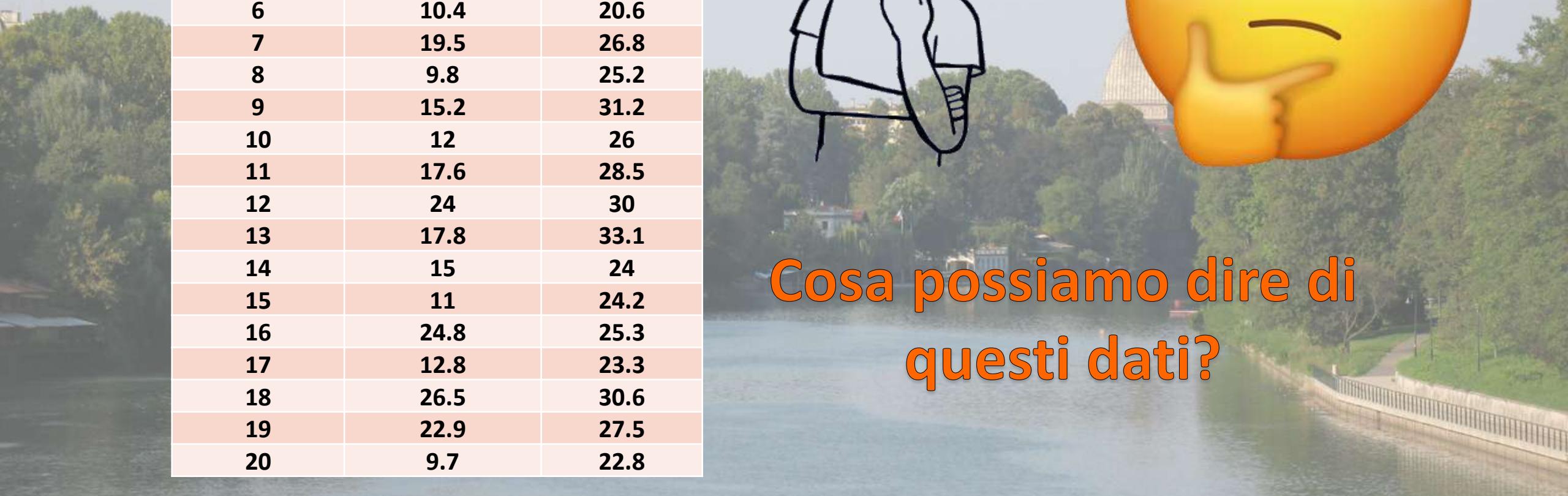


# DALL'UNIVARIATO AL MULTIVARIATO - ESEMPIO

Oggetti	Variabile 1	Variabile 2
1	21.2	32.5
2	16.2	21
3	13.1	21.7
4	11.6	21.3
5	20.8	29.9
6	10.4	20.6
7	19.5	26.8
8	9.8	25.2
9	15.2	31.2
10	12	26
11	17.6	28.5
12	24	30
13	17.8	33.1
14	15	24
15	11	24.2
16	24.8	25.3
17	12.8	23.3
18	26.5	30.6
19	22.9	27.5
20	9.7	22.8



Cosa possiamo dire di  
questi dati?



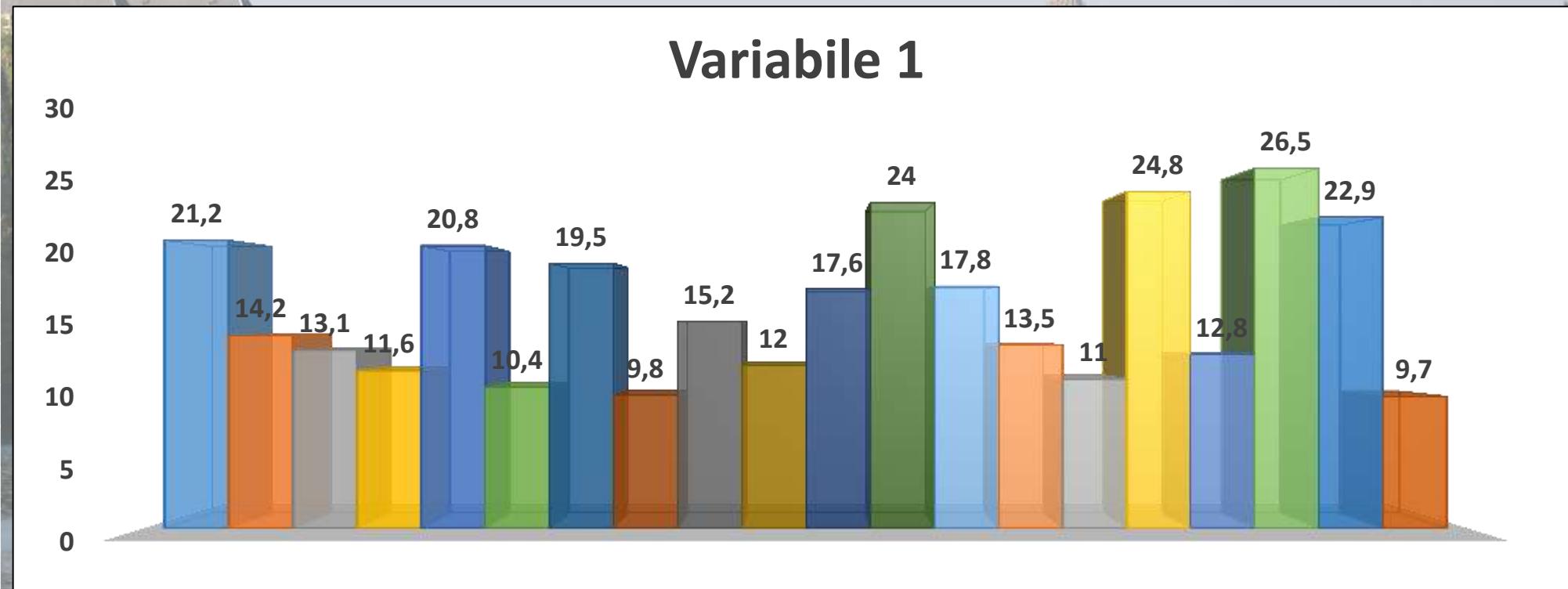
## IL MONDO UNIVARIATO

Oggetti	Variabile 1
1	21.2
2	16.2
3	13.1
4	11.6
5	20.8
6	10.4
7	19.5
8	9.8
9	15.2
10	12
11	17.6
12	24
13	17.8
14	15
15	11
16	24.8
17	12.8
18	26.5
19	22.9
20	9.7



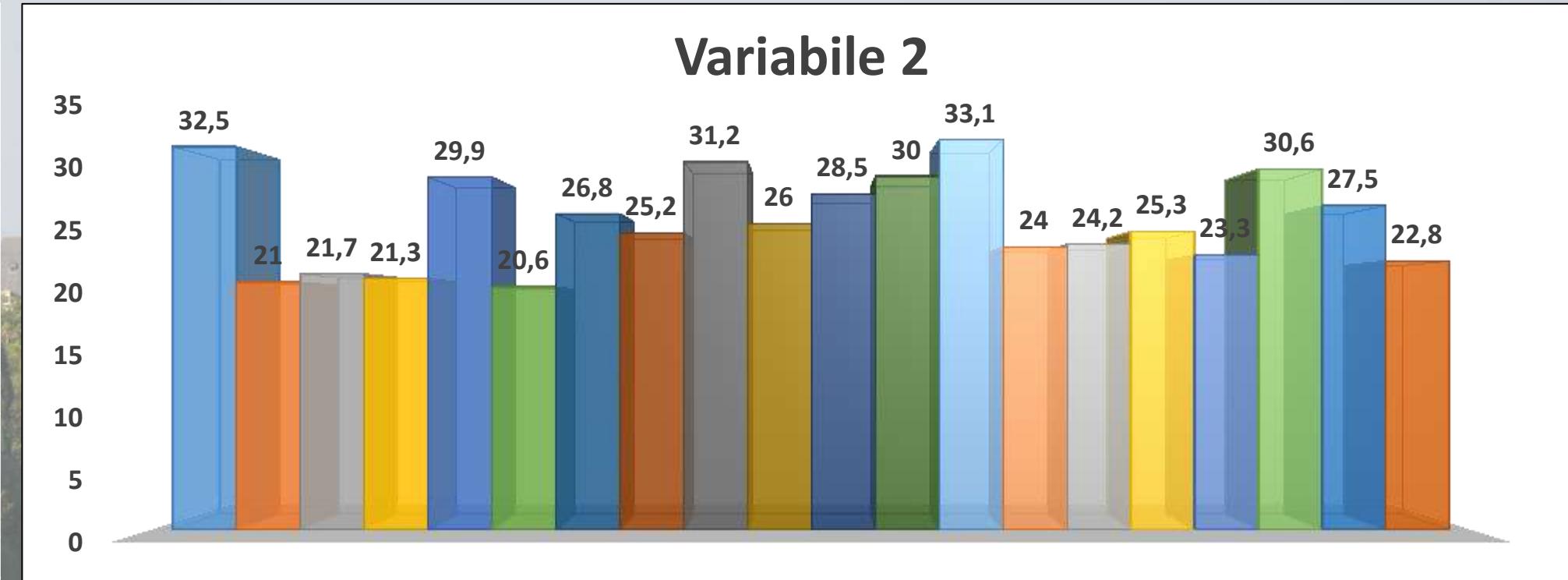
1 variabile  
per volta

Variabile 1



# IL MONDO UNIVARIATO

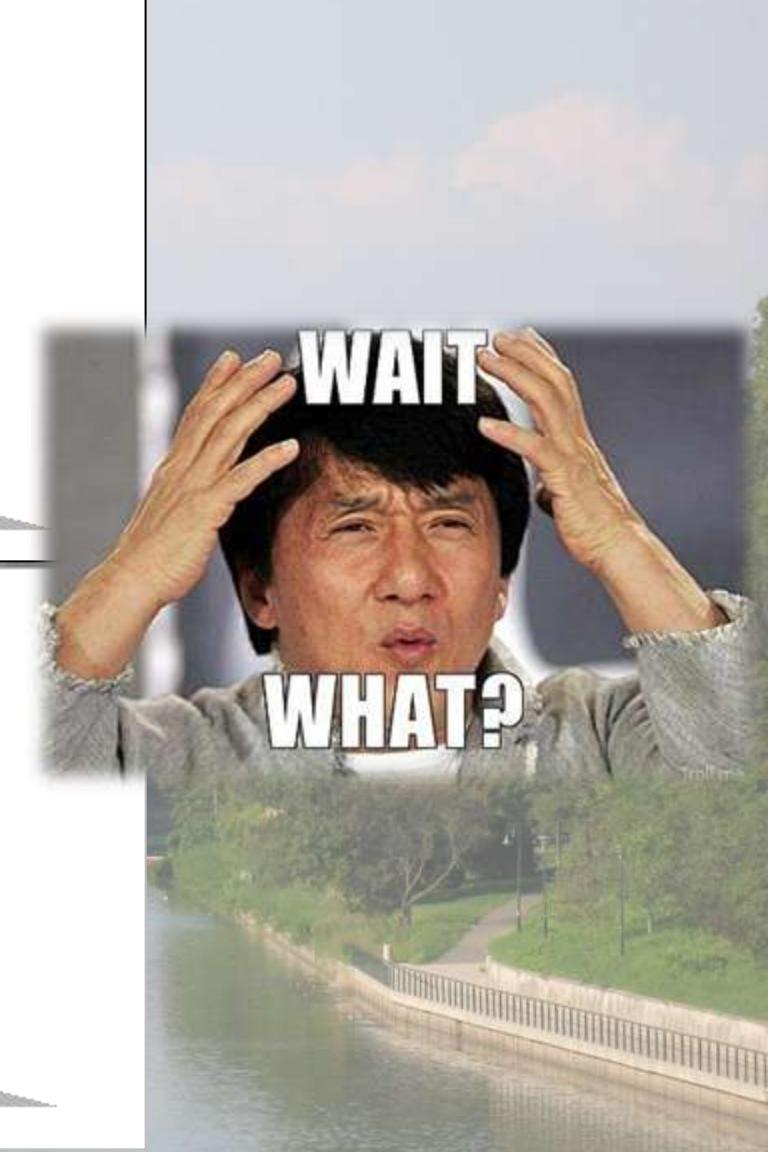
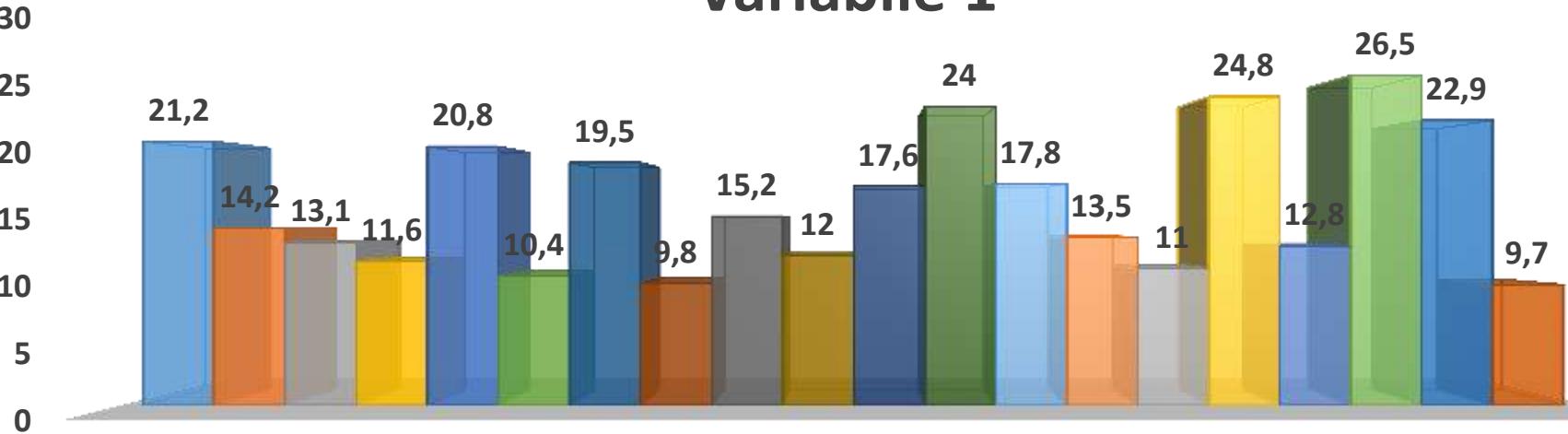
Oggetti	Variabile 2
1	32.5
2	21
3	21.7
4	21.3
5	29.9
6	20.6
7	26.8
8	25.2
9	31.2
10	26
11	28.5
12	30
13	33.1
14	24
15	24.2
16	25.3
17	23.3
18	30.6
19	27.5
20	22.8



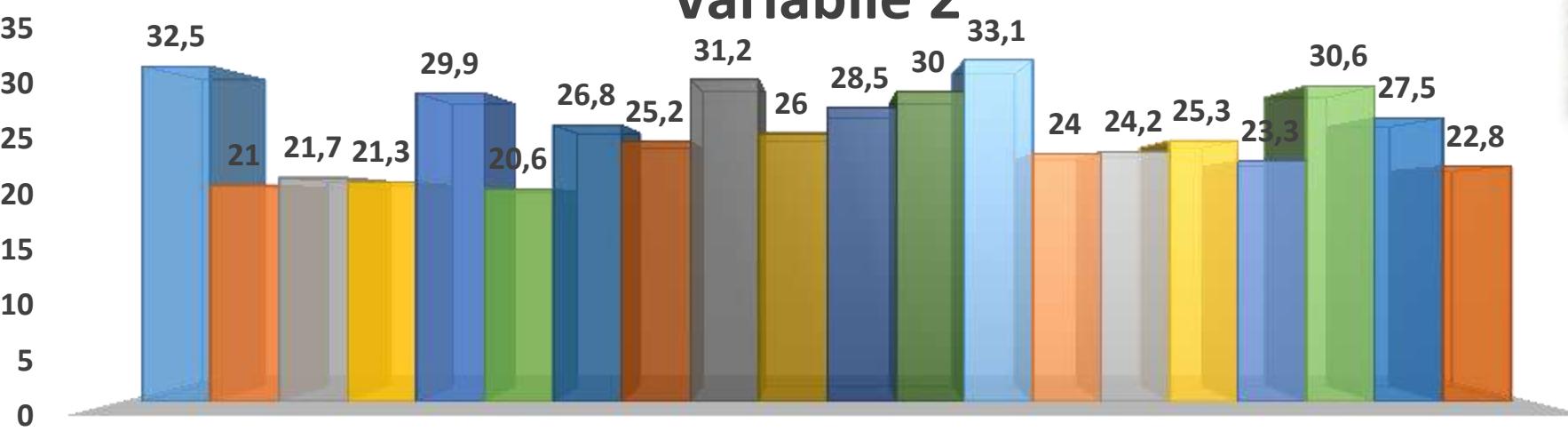
1 variabile  
per volta

# IL MONDO UNIVARIATO

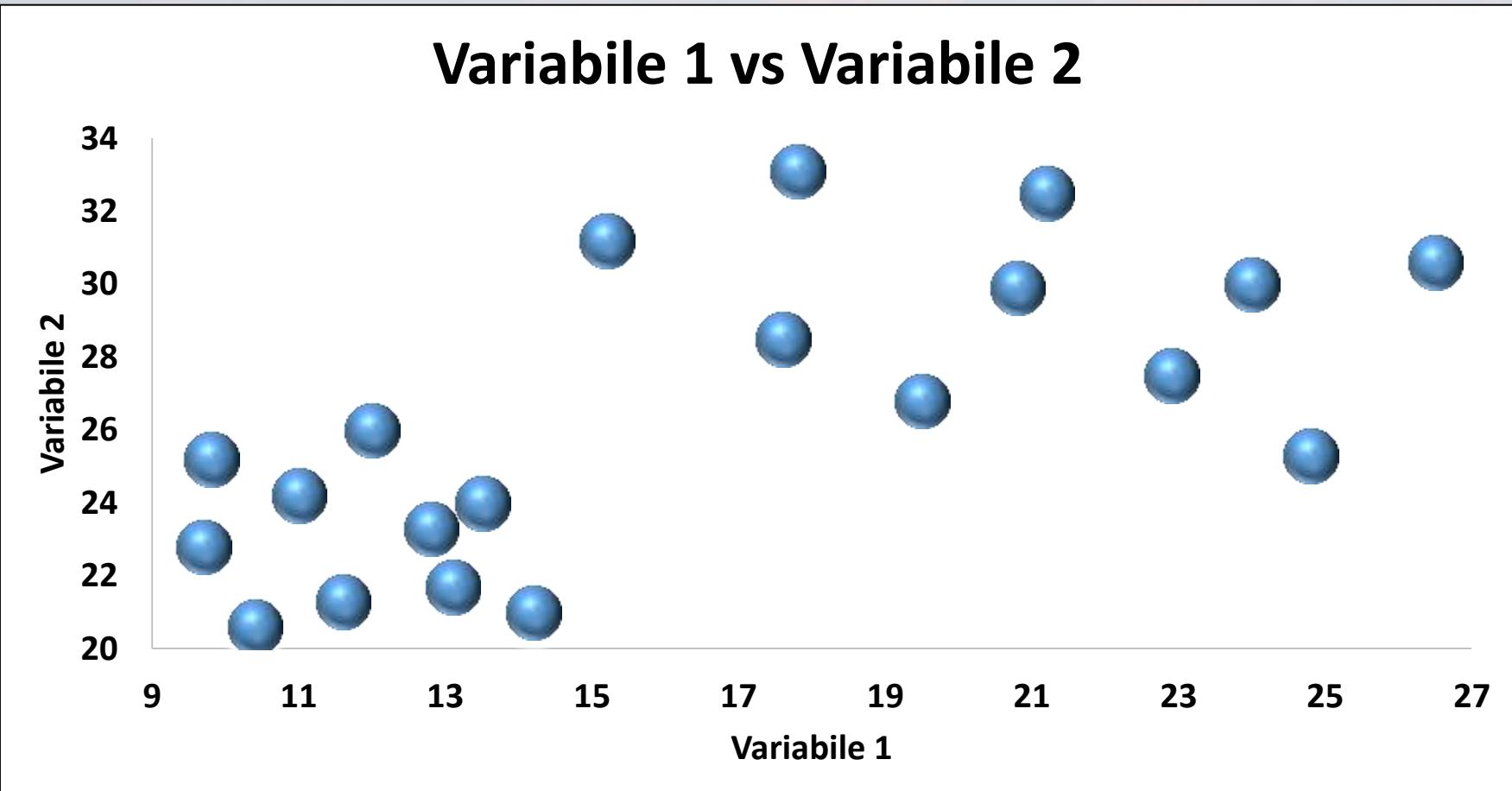
## Variabile 1



## Variabile 2

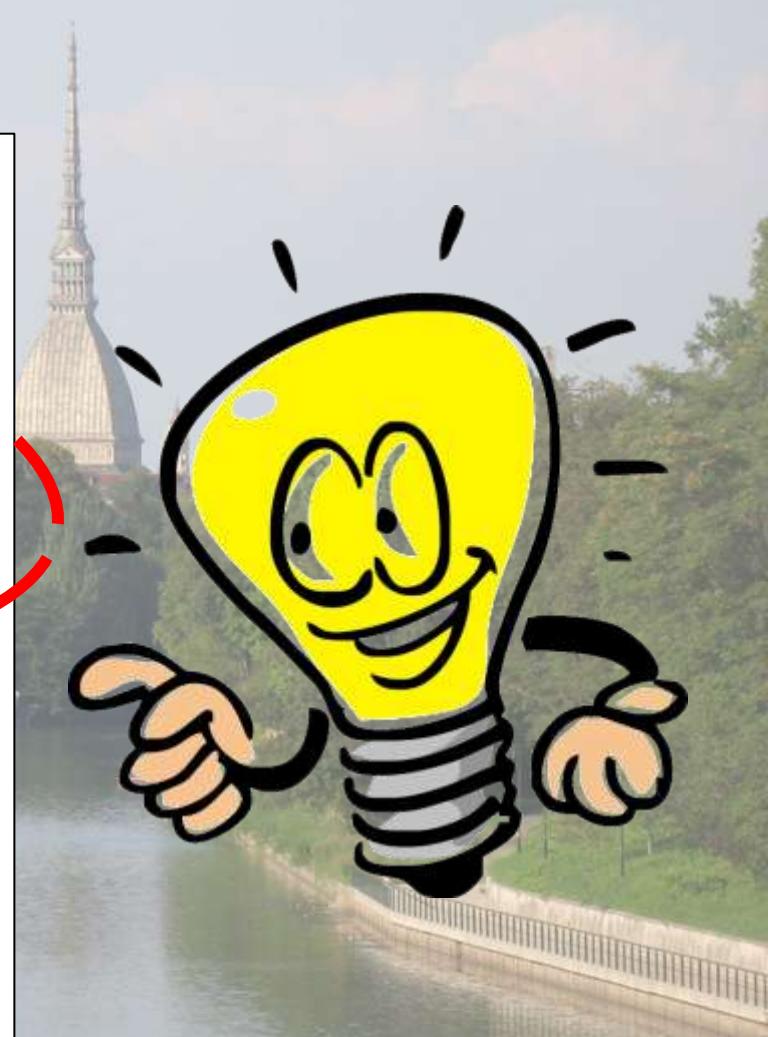
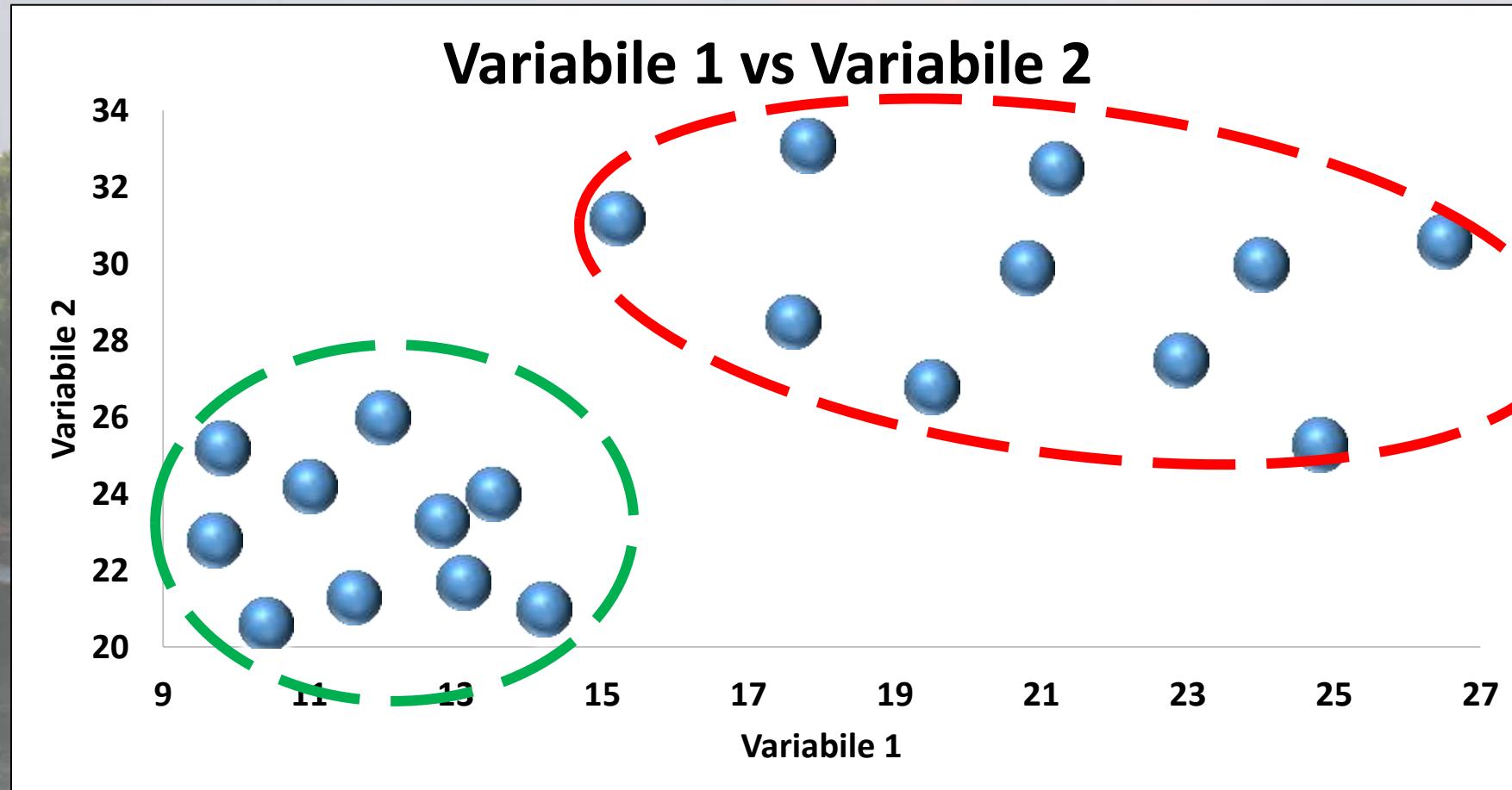


Valutiamo INSIEME le 2 variabili...

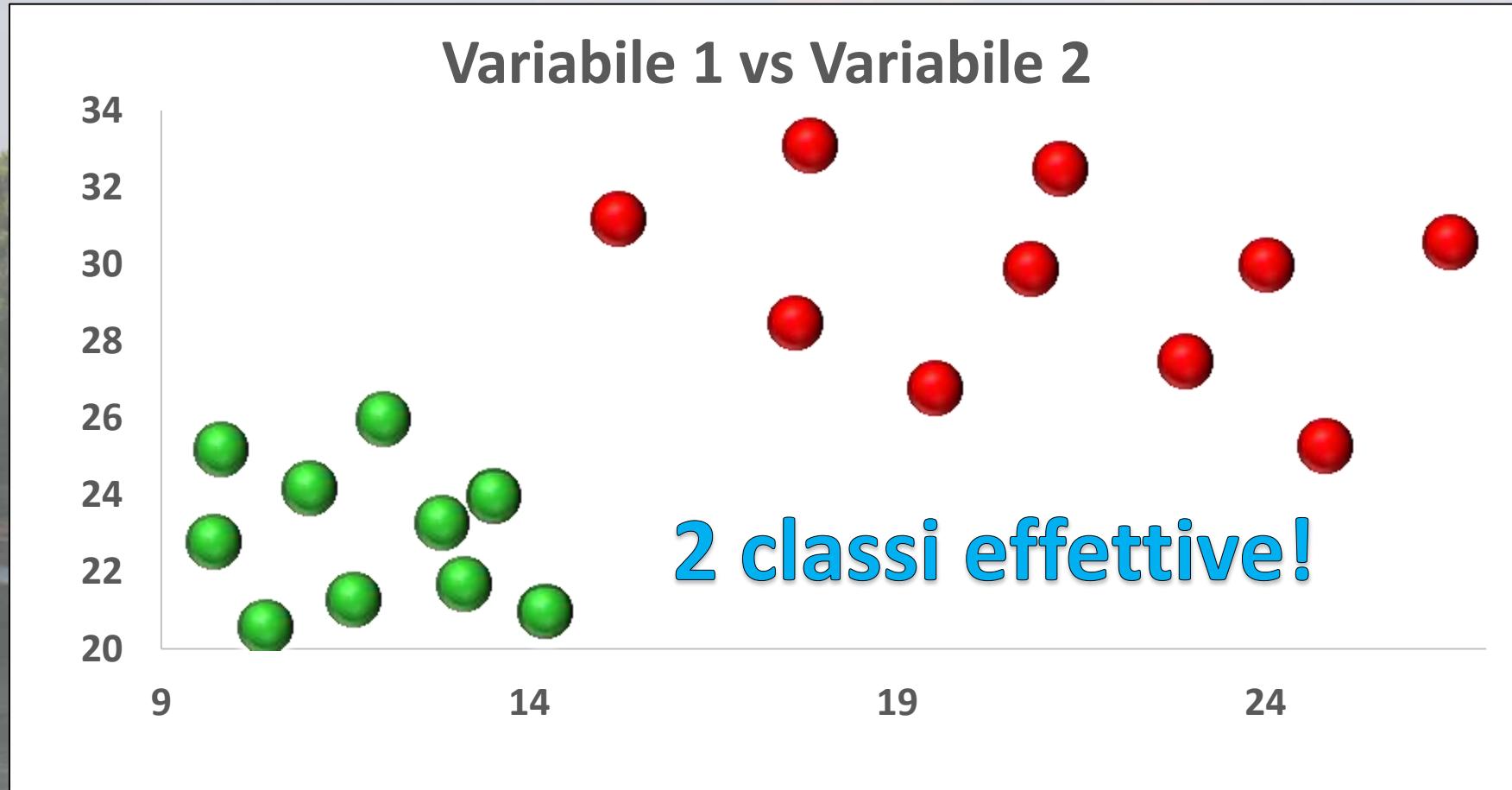


Differenze  
rispetto a  
univariato?

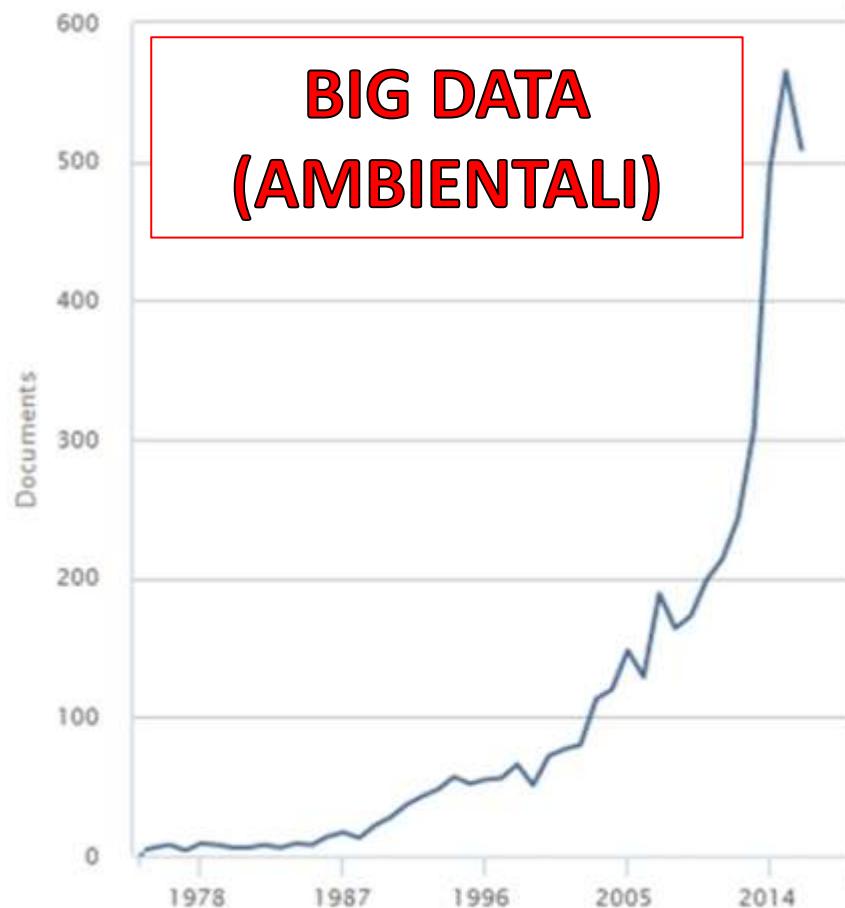
Si vedono due raggruppamenti!



Si vedono due raggruppamenti!



## Nr. di articoli scientifici per anno



**BIG DATA  
(AMBIENTALI)**

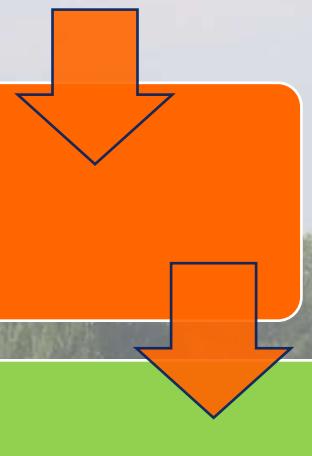


**ANALISI  
MULTIVARIATA**

<https://www.scopus.com>



# 3V-data



Velocità

Volume

Varietà



Continui progressi  
della strumentazione  
analitica

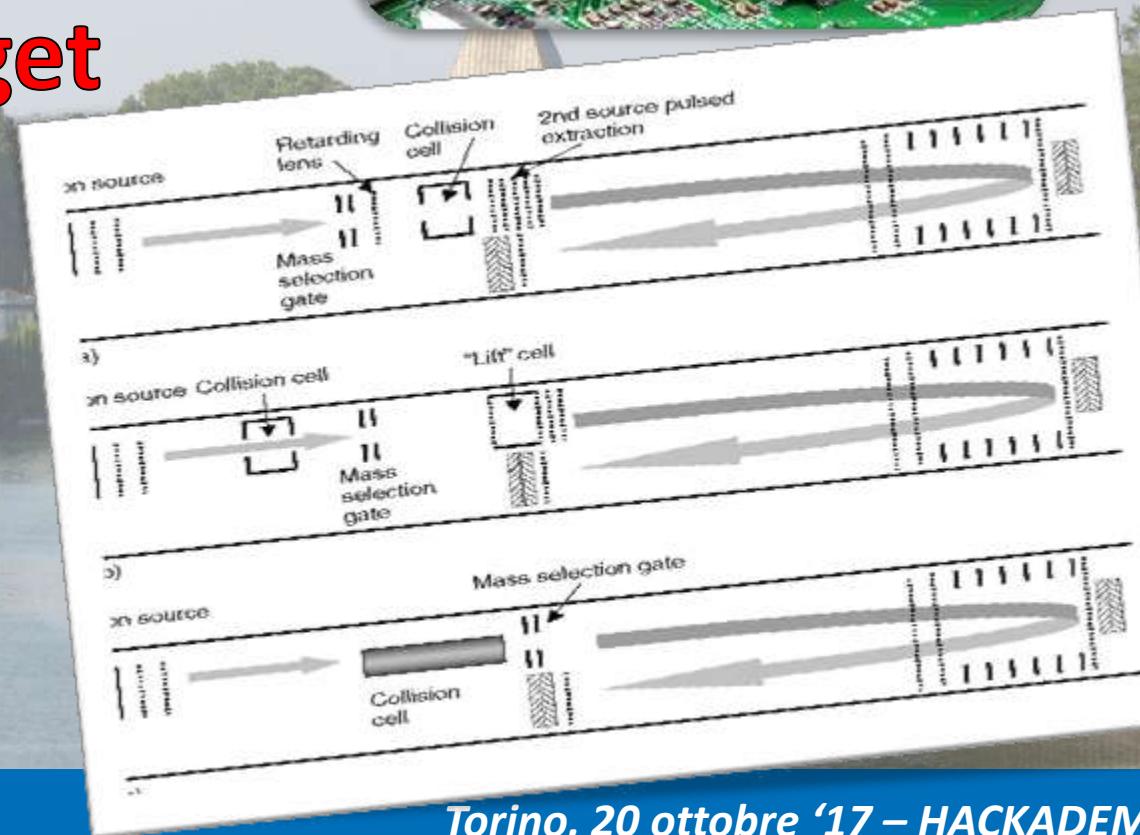
Analisi chimico –  
ambientali

## Elettronica veloce

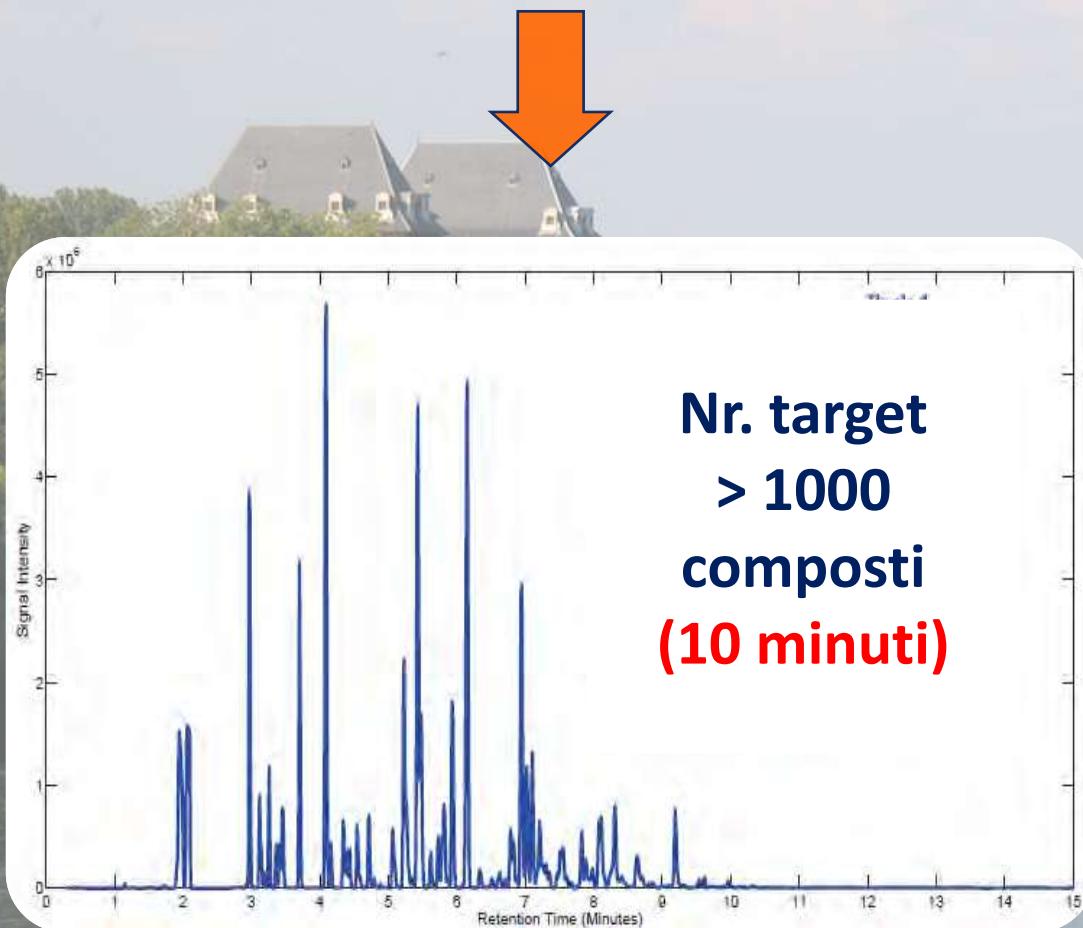


## Tecniche analitiche multi-target

- Fast Chromatography
- Multiple Mass Spectrometry (MS)<sup>n</sup>
  - Time-of-Flight
  - Orbitrap



# Numero di composti



# Big Data Storage



## VARIABILI

OGGETTI

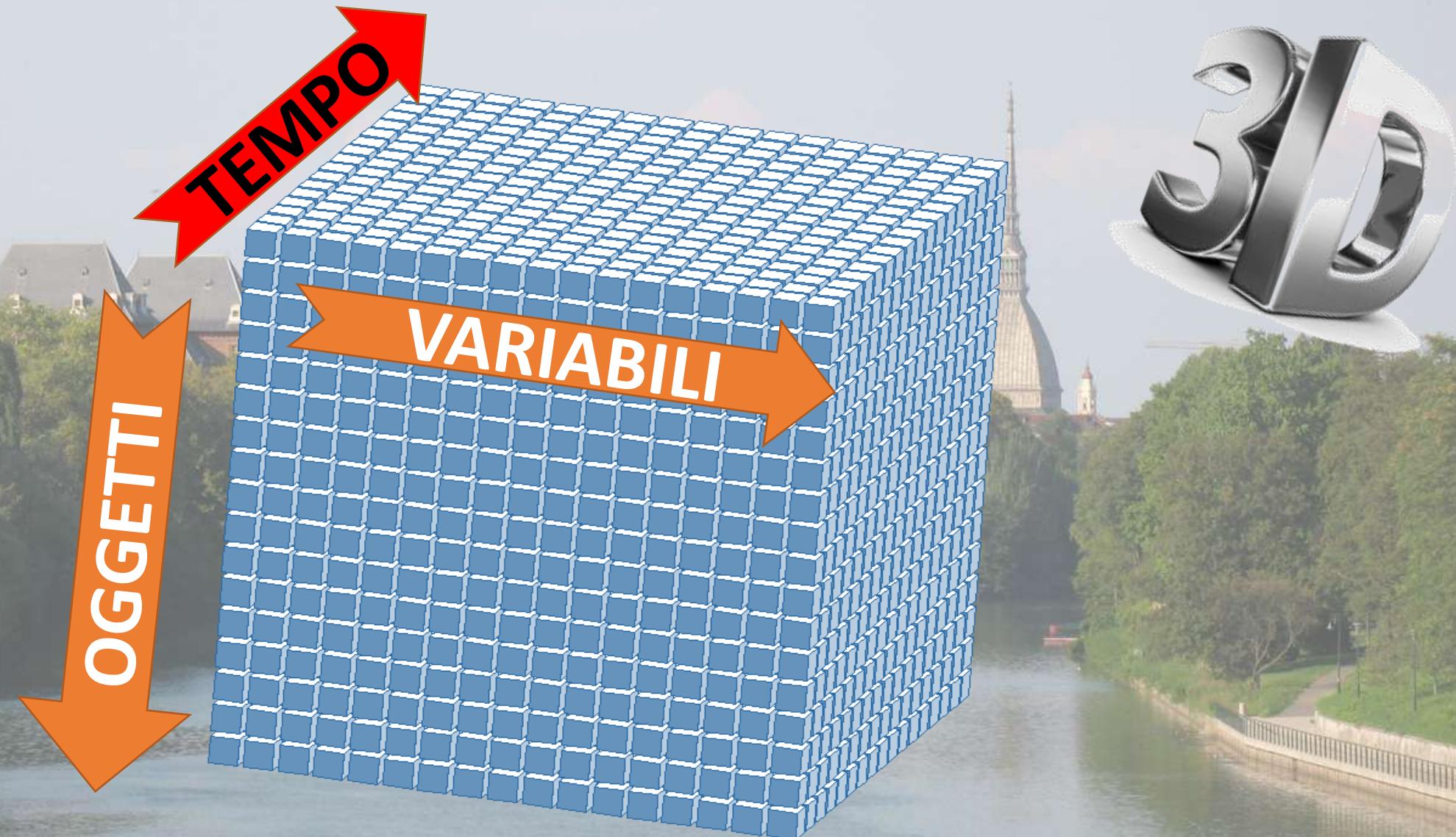
Viewer  
Relation: final

No.	Rating Numeric	Survey Numeric	Prize Numeric	Punishment Numeric	Aspen Numeric	Snowmass Numeric	Breckenridge Numeric	Keystone Numeric	ABasin Numeric	Loveland Nominal	CrestedButte Nominal	Vail Numeric	Silverton Numeric	WinterPark Numeric	Mary Jane Numeric	Eldora Numeric
1	0.675	20.0	10.0	30.0	1.0	1.0	1.0	1.0	1.0	0.0	0.0	0.0		0.0	0.0	0.0
2	1.0	20.0	10.0	30.0	1.0	1.0	1.0	1.0	1.0	1.0	1.0	1.0	1.0	1.0	1.0	1.0
3	0.9	20.0	10.0	30.0	1.0	0.0	1.0	1.0	1.0	0.0	0.0	1.0	1.0	0.0	1.0	0.0
4	0.95	20.0	10.0	30.0	1.0	1.0	1.0	1.0	1.0	1.0	1.0	1.0	1.0	0.0	1.0	0.0
5	0.6	20.0	10.0	30.0	1.0	1.0	1.0	1.0	1.0	1.0	1.0	1.0	0.0	0.0	0.0	0.0
6	0.95	20.0	10.0	30.0	1.0	1.0	1.0	1.0	1.0	1.0	1.0	1.0	0.0	0.0	0.0	0.0
7	1.0	20.0	10.0	30.0	1.0	1.0	1.0	1.0	1.0	1.0	1.0	1.0	1.0	1.0	0.0	1.0
8	0.8	20.0	10.0	30.0	1.0	1.0	1.0	1.0	1.0	1.0	1.0	Q	1.0	1.0	1.0	1.0
9	0.9	20.0	10.0	30.0	1.0	1.0	1.0	1.0	1.0	1.0	1.0	1.0	1.0	1.0	1.0	1.0
10	0.85	20.0	10.0	30.0	1.0	1.0	1.0	1.0	1.0	0.0	1.0	1.0	1.0	1.0	0.0	1.0
11	0.94	20.0	10.0	30.0	1.0	1.0	1.0	1.0	1.0	1.0	1.0	1.0	1.0	1.0	0.0	1.0
12	1.0	20.0	10.0	30.0	1.0	1.0	1.0	1.0	1.0	1.0	1.0	1.0	1.0	1.0	0.0	1.0
13	0.8	20.0	10.0	30.0	1.0	1.0	1.0	1.0	1.0	1.0	1.0	Q	1.0	1.0	1.0	1.0
14	1.0	20.0	10.0	30.0	0.0	0.0	1.0	1.0	0.0	1.0	1.0	1.0	1.0	1.0	1.0	1.0
15	0.95	20.0	10.0	30.0	1.0	0.0	1.0	1.0	1.0	0.0	1.0	0.0	0.0	1.0	1.0	0.0
16	0.9	20.0	10.0	30.0	1.0	1.0	1.0	1.0	1.0	0.0	0.0	1.0	0.0	0.0	0.0	0.0
17	0.85	20.0	10.0	30.0	1.0	1.0	1.0	1.0	0.0	1.0	1.0	1.0	1.0	0.0	1.0	1.0
18	0.9	20.0	10.0	30.0	1.0	0.0	1.0	1.0	1.0	0.0	0.0	1.0	1.0	0.0	1.0	0.0
19	1.0	20.0	10.0	30.0	1.0	1.0	1.0	1.0	1.0	1.0	1.0	1.0	1.0	1.0	1.0	1.0
20	0.675	20.0	10.0	30.0	1.0	1.0	1.0	1.0	1.0	1.0	0.0	0.0	0.0	0.0	0.0	0.0
21	0.575	20.0	1.0	30.0	1.0	1.0	1.0	1.0	1.0	1.0	1.0	1.0	1.0	1.0	0.0	0.0
22	0.925	20.0	10.0	30.0	1.0	1.0	1.0	1.0	1.0	1.0	1.0	1.0	1.0	1.0	1.0	1.0
23	0.9	20.0	10.0	30.0	1.0	1.0	1.0	1.0	1.0	1.0	1.0	1.0	0.0	0.0	0.0	0.0
24	0.6	20.0	10.0	30.0	1.0	1.0	1.0	1.0	1.0	1.0	1.0	1.0	0.0	0.0	0.0	0.0

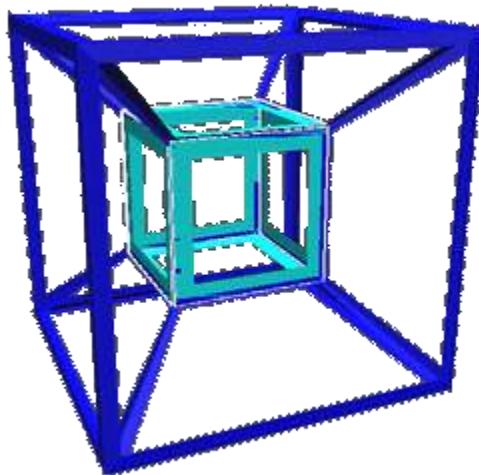
Undo OK Cancel



2D



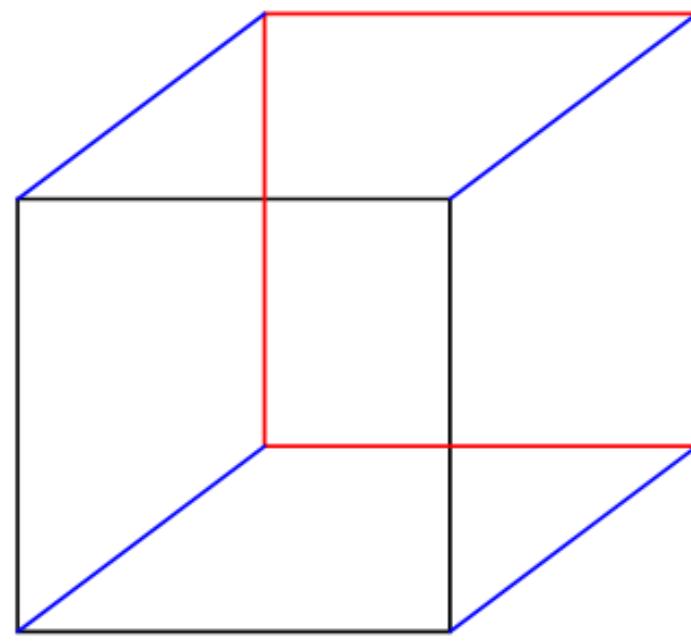
# VARIETA'



- 1. Oggetti
- 2. Variabili
- 3. Tempo di campionamento
- 4. Luogo di campionamento

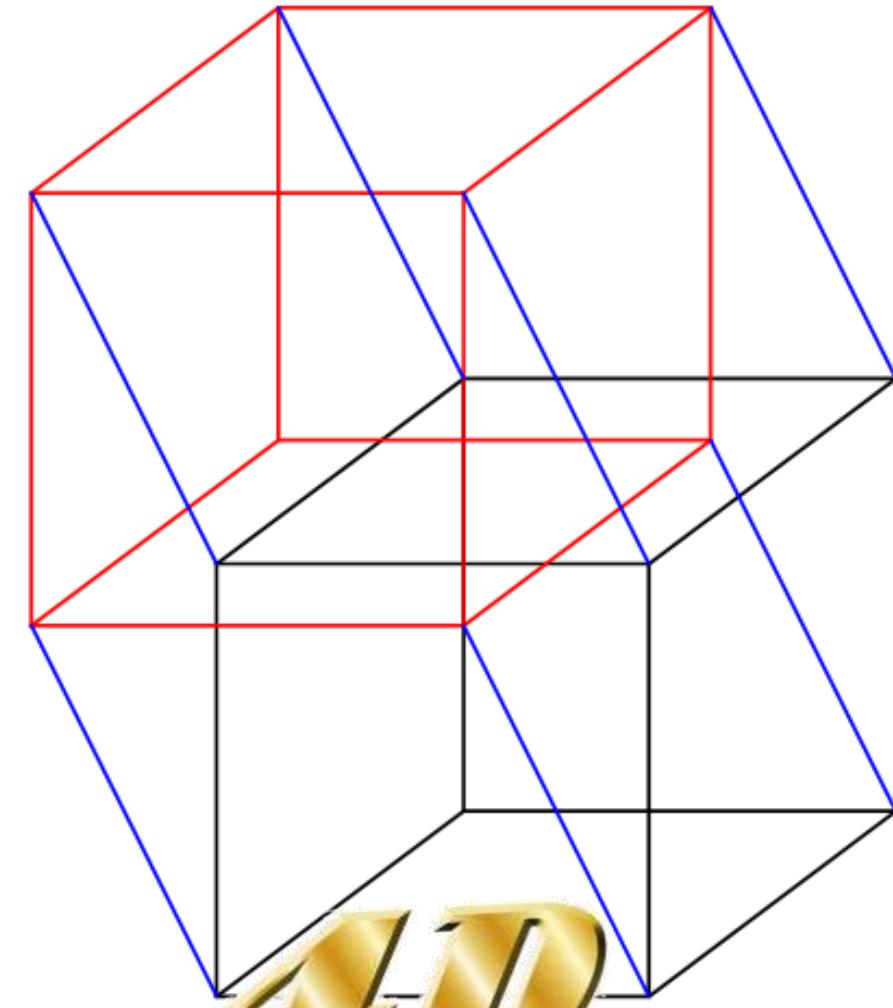


0D → 1D



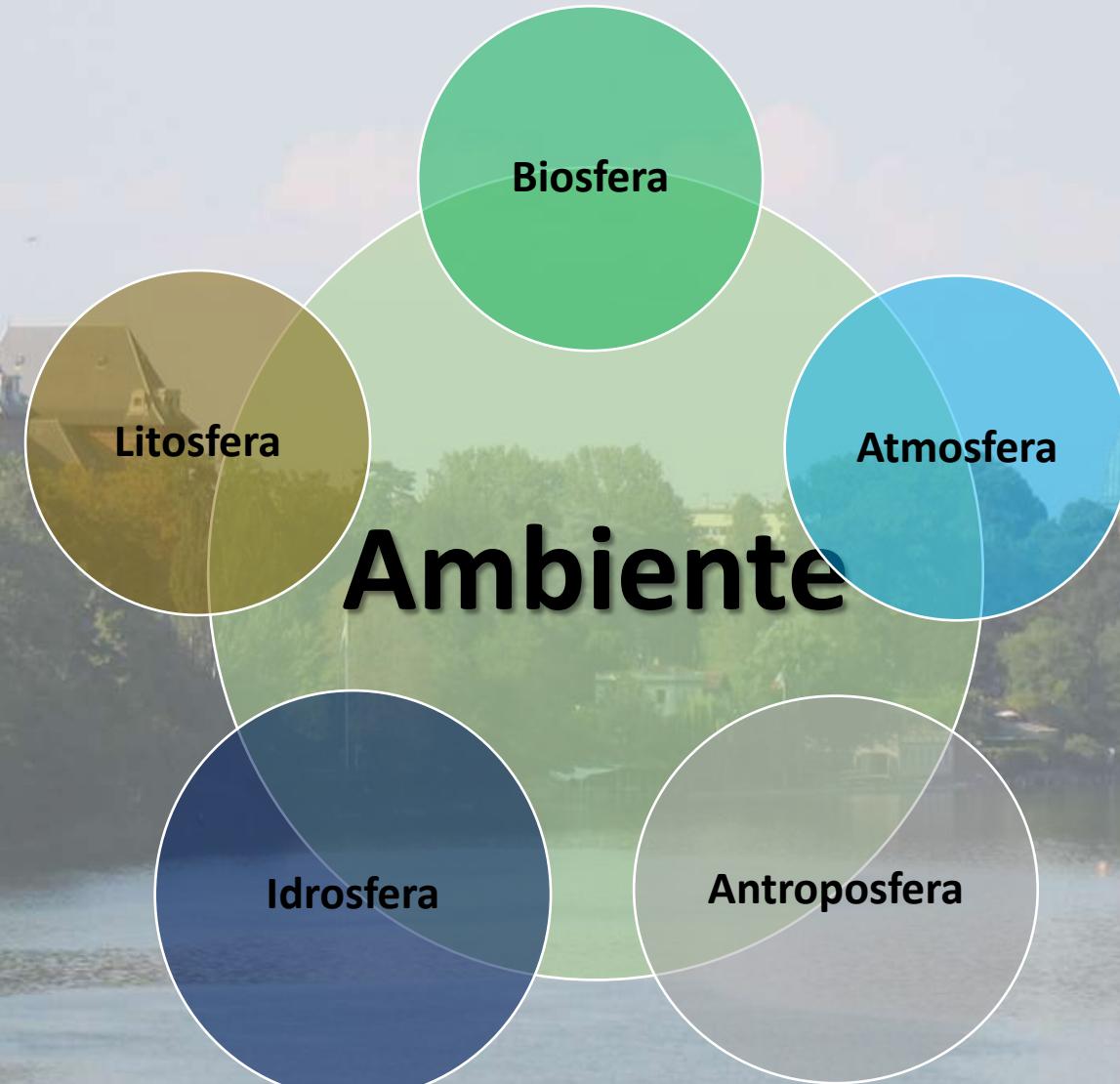
1D → 2D

2D → 3D

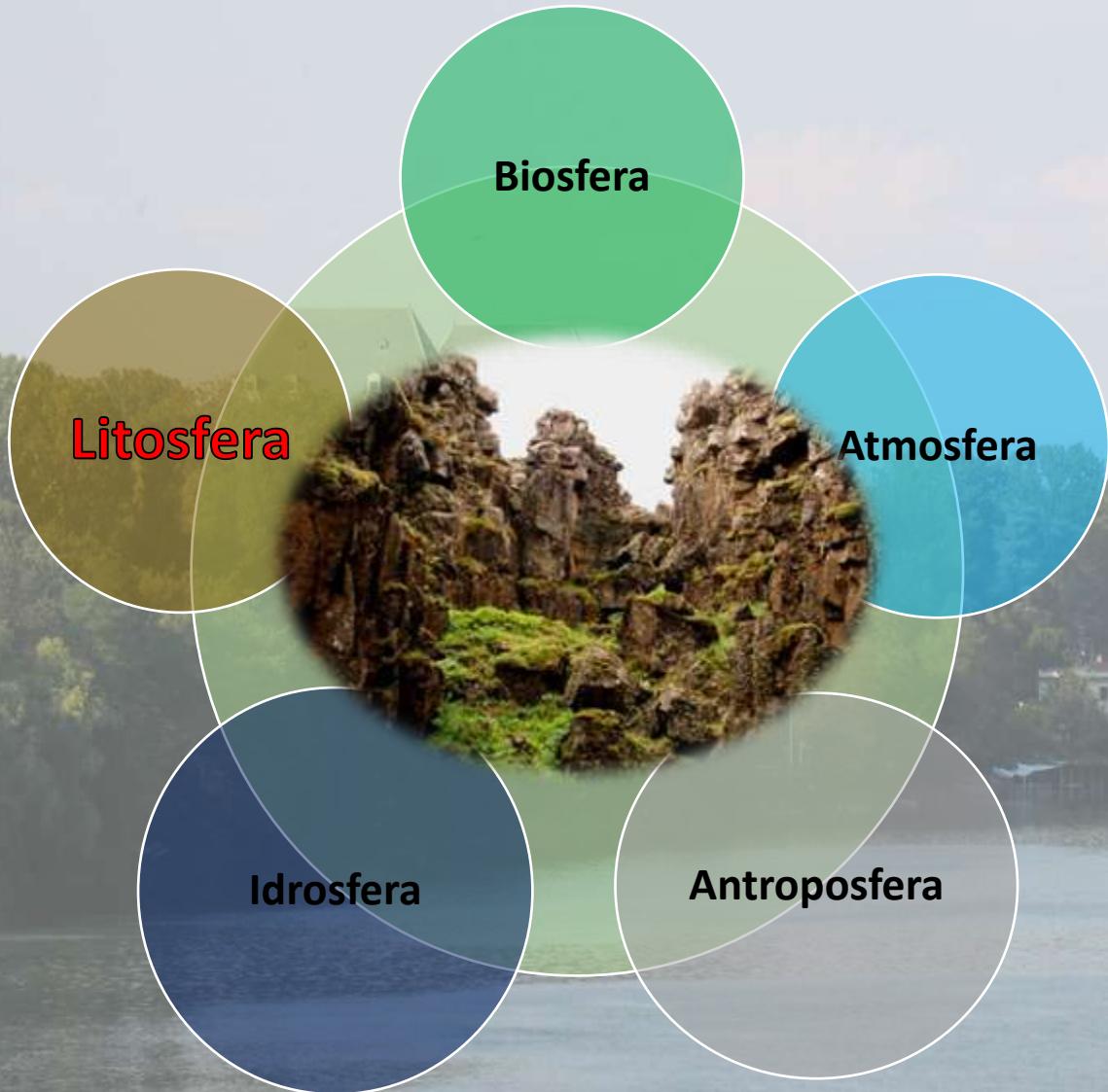


3D → 4D

# MA QUALI DATI?

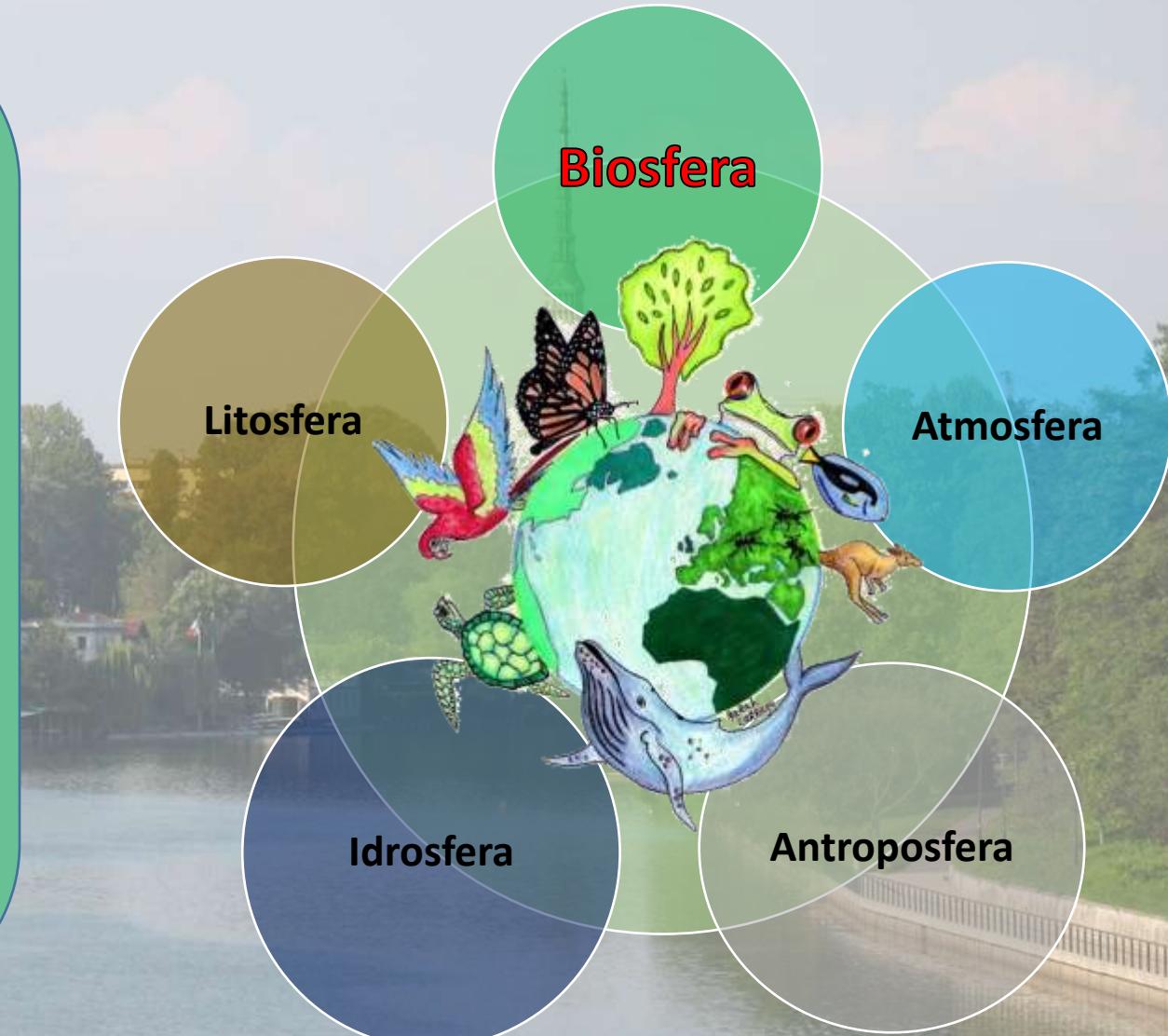


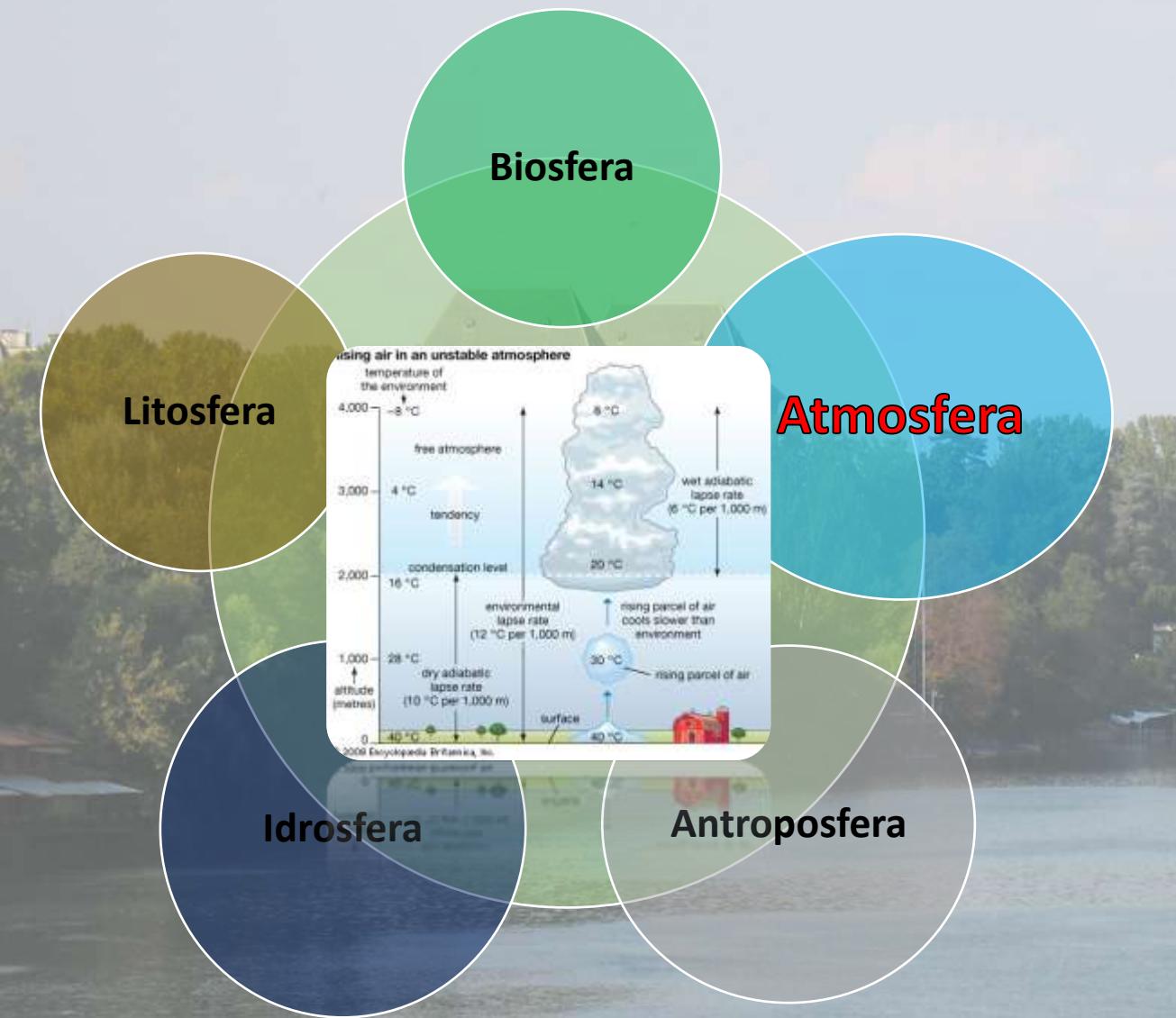
# LITOSFERA



- Parametri del suolo
  - Geologia
- Rocce dei letti dei fiumi
  - Composizione
  - Chimica del suolo

- Abbondanza delle specie
- Condizioni fisiologiche
  - Patologie
- Contenuto elementare
  - Dati microbici

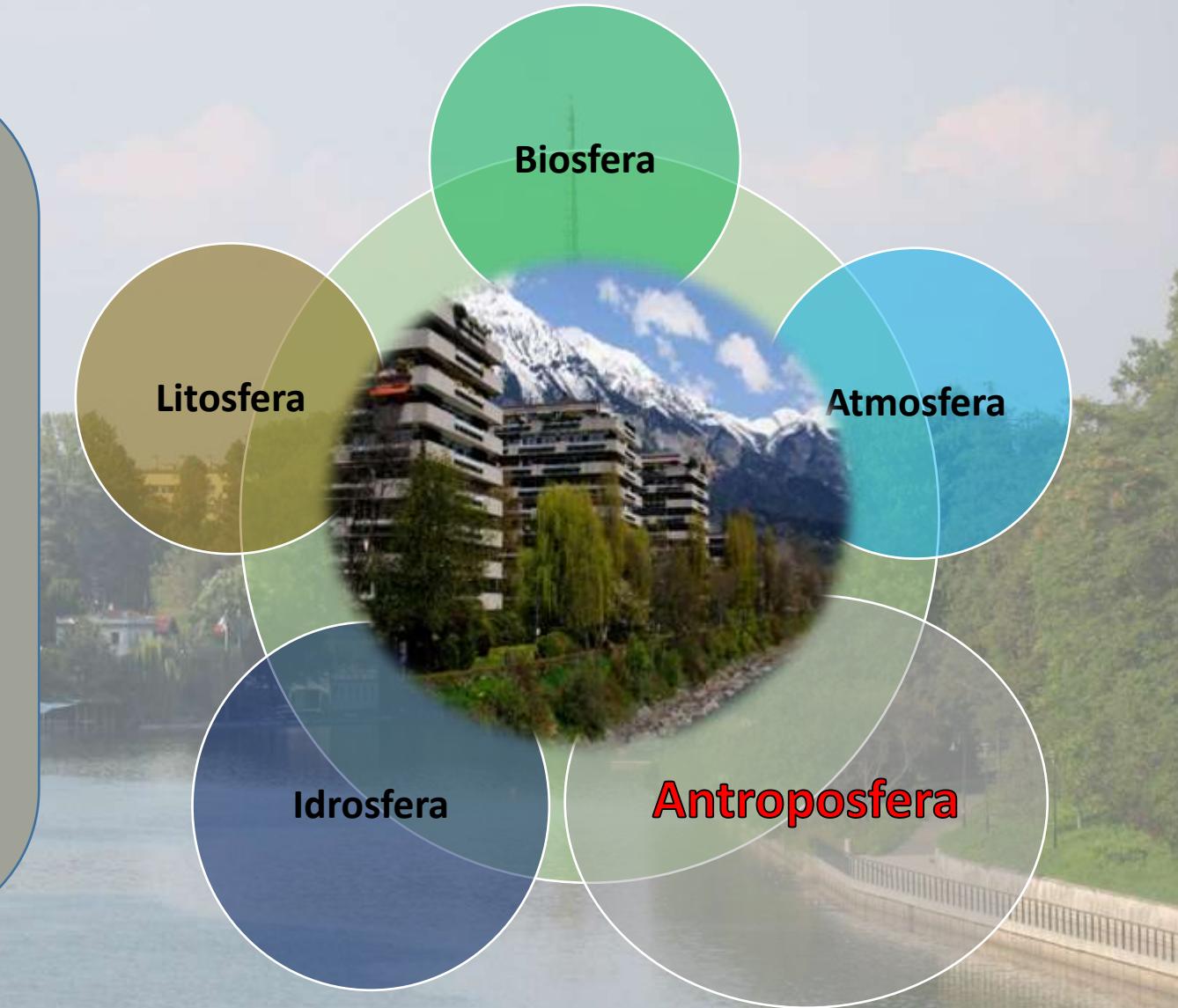




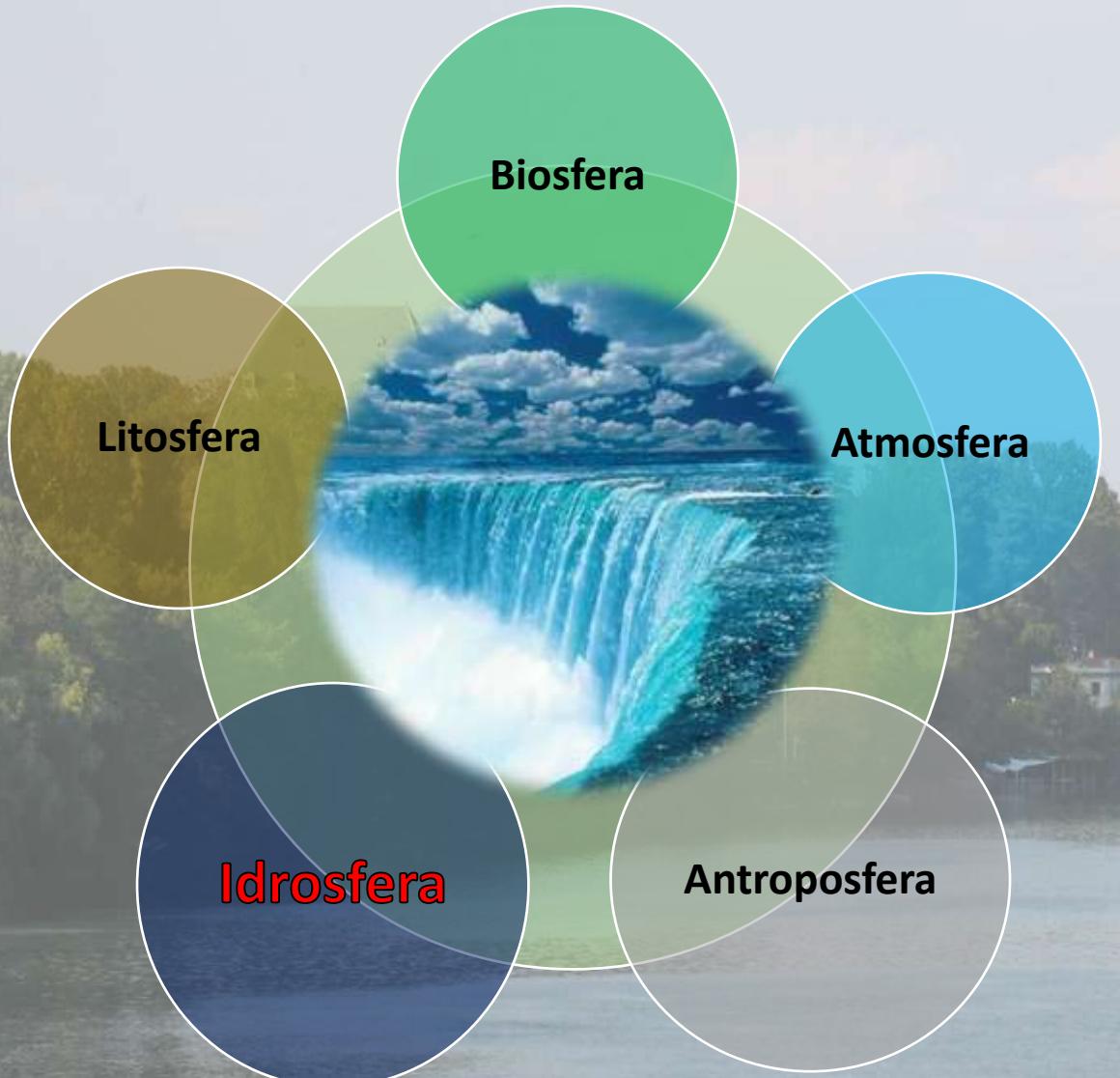
- Concentrazione inquinanti
- Velocità e direzione dei venti
  - Emissioni
  - Frazioni isotopiche

# ANTROPOSFERA

- Dati relativi ai trasporti
  - Sfruttamento dei terreni
  - Informazioni economiche
  - Dati relativi alle discariche



# IDROSFERA

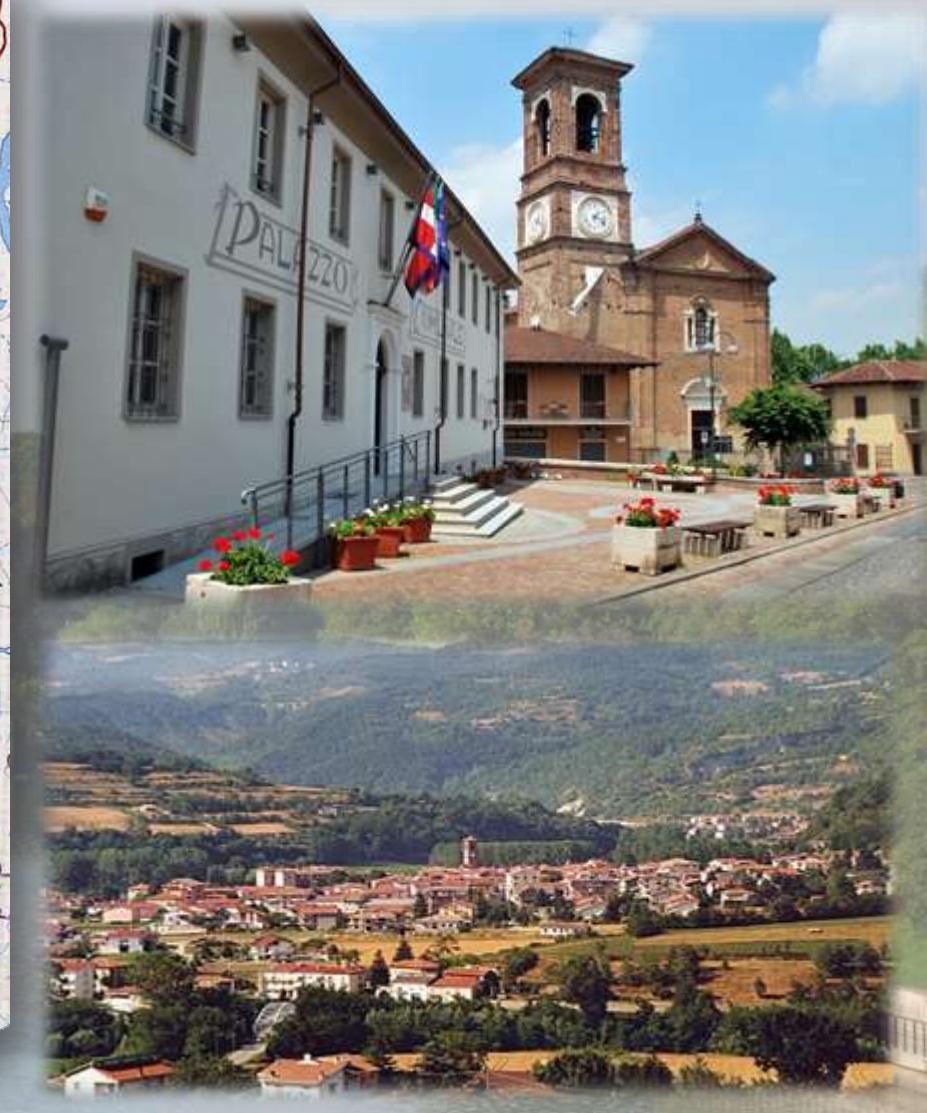


- Contaminazione acque di falda
- Flusso in superficie
  - Laghi
- Dati relativi alla formazione di sedimenti

## 1. Atmosfera: Monitoraggio dei metalli in traccia nel particolato (PM10) in aree urbane e rurali in Piemonte



# ATMOSFERA – METALLI in PIEMONTE





**Raccolta campioni:**  
**Ogni giorno (2011) da ARPA**  
**Piemonte;**

- **5 stazioni selezionate;**
- **28 campioni per ogni stazione;**
- **7 per ogni stagione (febbraio, maggio, agosto e novembre)**

# ATMOSFERA – METALLI in PIEMONTE

**Medie ed intervalli per ogni metallo nei campioni di PM10 per ogni stazione.**

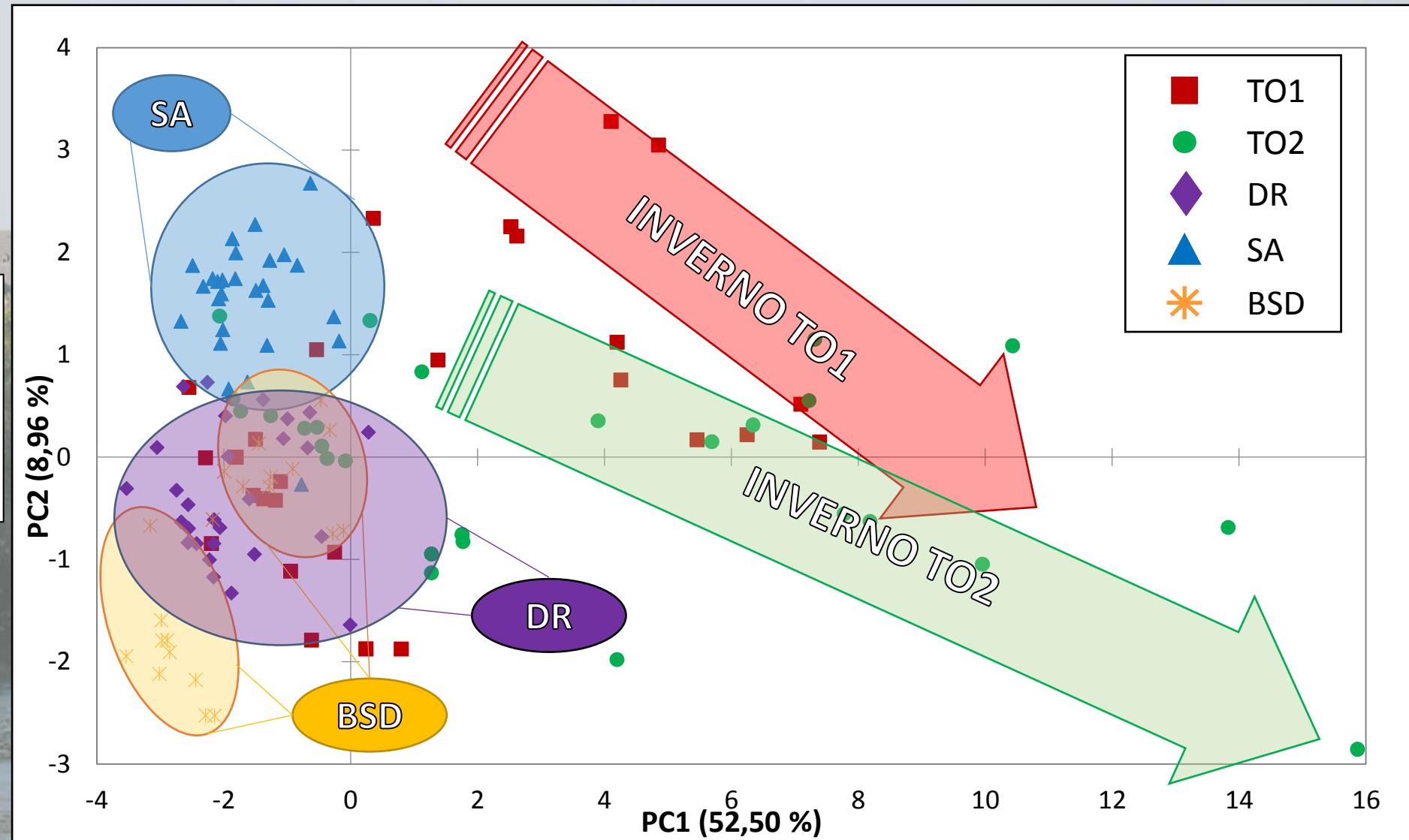
**Tutti i valori sono in ng/m<sup>3</sup>, ad eccezione del PM10 espresso in µg/m<sup>3</sup>.**



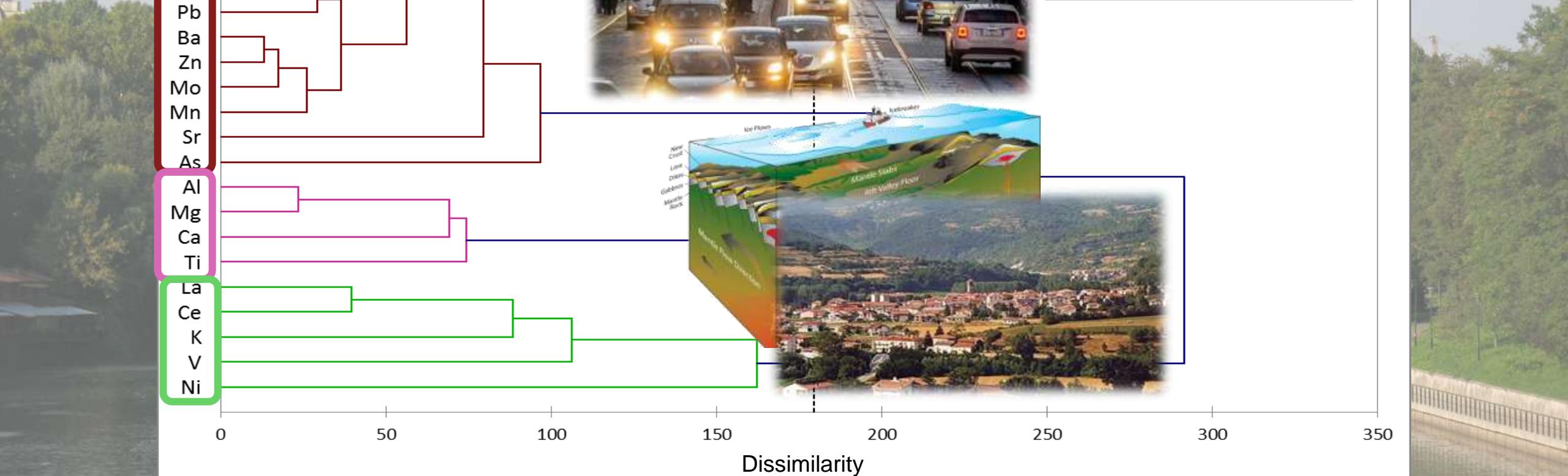
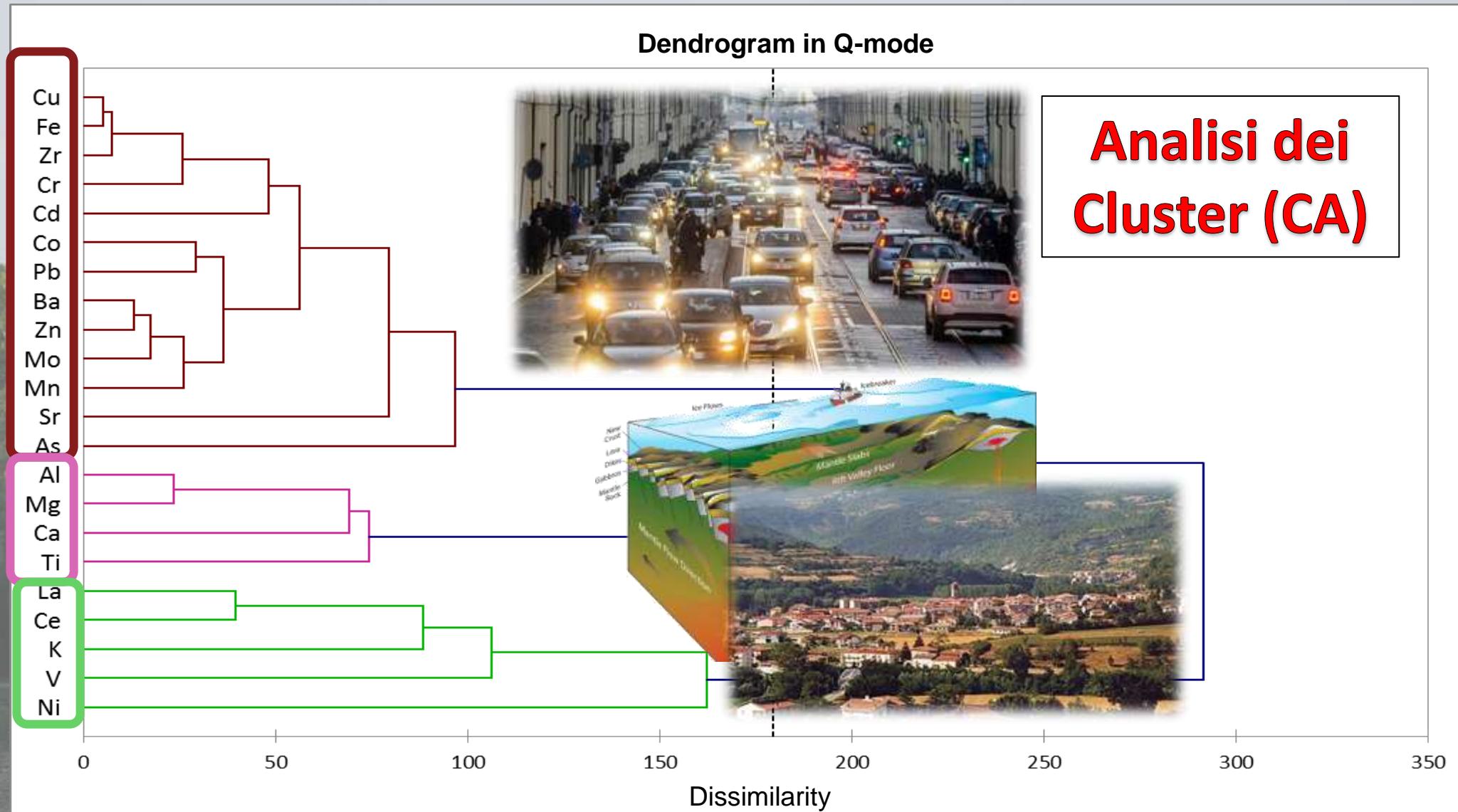
**Analisi Multivariata**

	TO1		TO2		DR		BSD		SA	
	Mean	Range	Mean	Range	Mean	Range	Mean	Range	Mean	Range
PM <sub>10</sub>	58	23-110	65	16-125	32	7-66	26	15-48	32	15-72
Mg	254	19-738	522	53-1592	148	6.77-314	400	48.9-1891	173	53.7-367
Al	203	17.8-428	383	11.9-1127	137	4.08-531	211	7.44-824	123	10.4-344
K	486	79.4-1285	395	130-909	232	56.8-472	325	60.8-851	459	128-1143
Ca	749	18.7-1517	1041	271-2721	482	146-1460	1925	328-7332	735	279-1416
Fe	1316	272-3164	2487	431-6810	356	57.4-658	382	105-848	259	93-391
Ti	23.5	2.29-54	26.7	5.7-65.4	18.5	4.99-33.7	23.9	6.33-63.2	19	8.2-49.5
Mn	17.3	3.63-37.5	28.4	6.2-95.8	8.23	2.04-31.3	9.61	3.51-45.8	7.14	3.9-12.5
Cu	22.3	5.04-52.4	67.3	13.4-176.4	3.9	0-15.1	11.4	3.37-33.2	1.73	0-8.46
Zn	64.3	19.6-164	83	14.6-228.8	37.9	4.81-79.3	30.9	0-79.4	26.1	6.4-64
Sb	11	1.9-48.3	10.1	2.6-27.5	2.03	0-5.92	4.23	0.6-12.8	0.16	0-1.2
Ba	32.1	12.4-76.9	40.2	7.4-101.5	16.7	7.39-54.5	13.8	7.74-40.3	6.01	0-15.5
Pb	16.3	3.8-44.6	13.7	0-39.9	6.06	1.7-13.2	10.9	1.13-171	6.18	1.91-18.8
Cr	8.24	1.9-14.3	12.1	2.6-34.3	5.22	0.51-12.5	3.58	0.83-10.1	3.21	1.84-7.82
V	3.15	1.06-5.73	2.77	0.73-5.71	1.44	0.67-2.5	1.97	0.39-7.83	3.21	0.6-8.93
Co	0.7	0.06-1.85	0.65	0.09-1.54	0.18	0-0.87	0.3	0.05-2.43	0.11	0.02-0.52
Ni	5.74	0-16.2	5.97	2.2-15.1	6.45	0-41.9	8.88	0.68-94.2	3.3	1.97-631
As	0.71	0.18-1.48	1.03	0.19-4.66	0.38	0.14-0.7	0.43	0.12-1.04	0.39	0.1-4.16
Sr	1.88	0.04-4.37	239	0.44-11.15	0.72	0-1.39	0.33	0-1.98	0.78	0.34-1.22
Zr	1.66	0.29-4.01	3.21	0.55-7.96	0.38	0-3.43	0.43	0-1.9	0.36	0.14-0.62
Mo	4.86	083-16.02	5.35	1.3-14.21	1.09	0.24-3.03	0.48	0.06-1.51	0.92	0.56-1.73
Cd	0.62	0,19-1,8	1.1	0.32-5.51	0.31	0.05-1.01	0.31	0.01-1.36	0.33	0.15-0.5
Ce	0.22	0-0.88	2.57	2.12-5.95	0.15	0-1.53	1.52	0.43-3.71	2.77	2.55-3.23
La	<0.007	<0.007	2.39	2.09-4	0.02	0-0.47	1.16	0.05-2.76	3.08	2.83-3.41
Hg	0.44	0-2.77	4.49	0.45-6.9	0.91	0-3.42	0.75	0-9.4	4.13	232-16.44

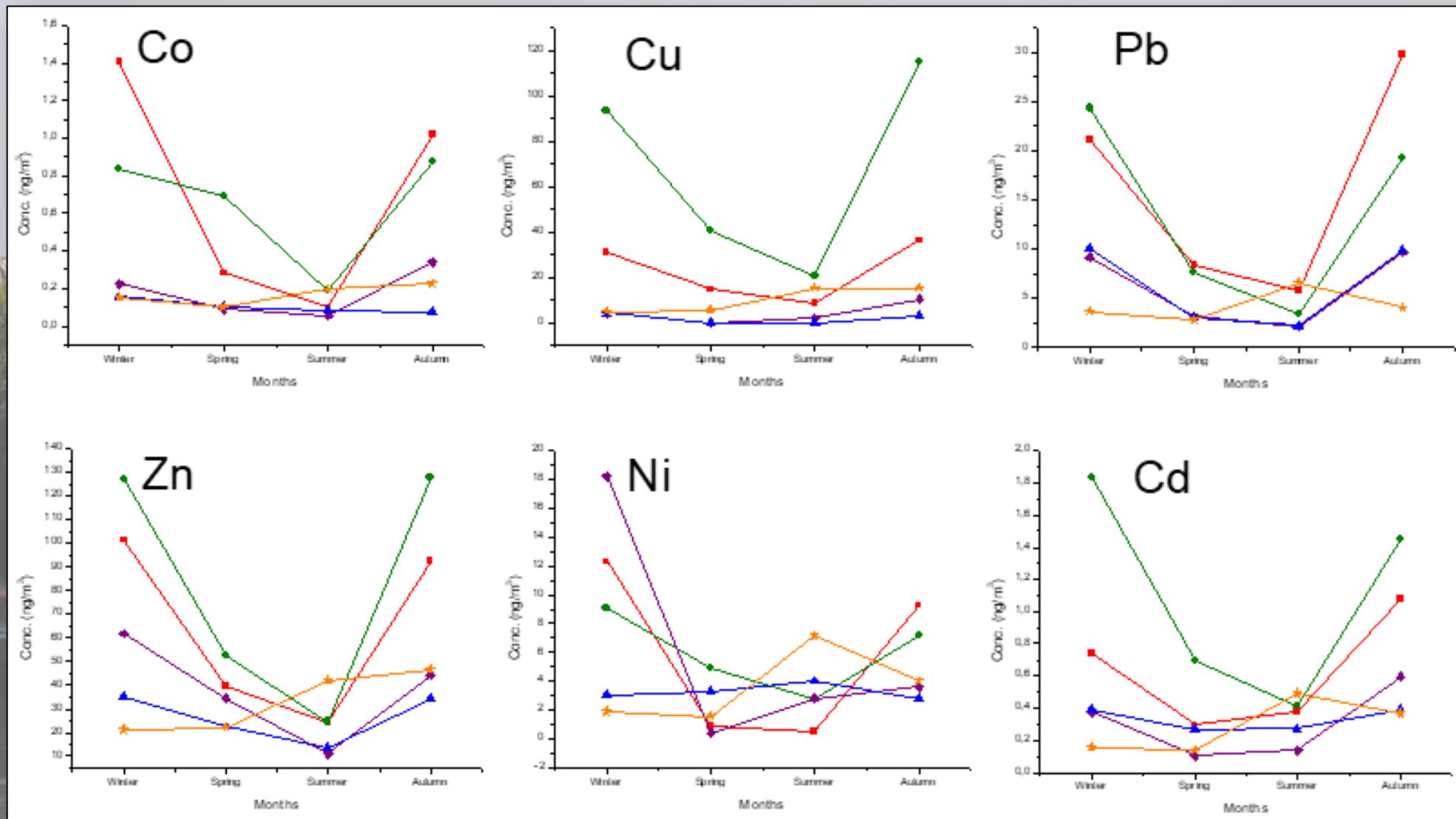
## Analisi delle Componenti Principali (PCA)



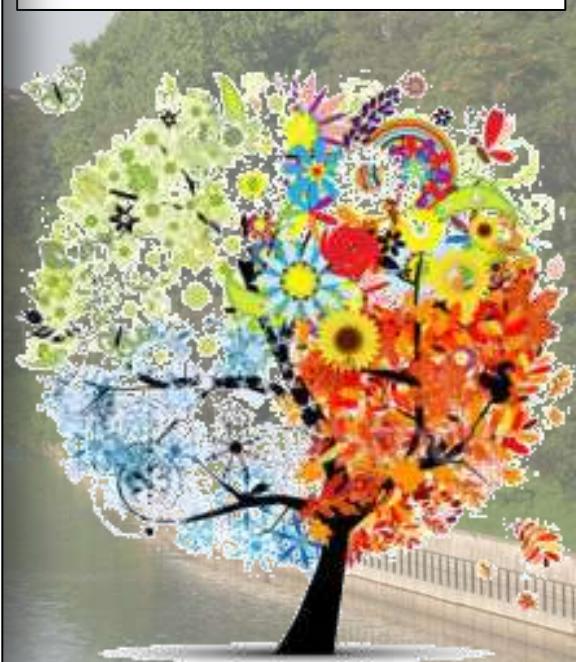
# ATMOSFERA – METALLI in PIEMONTE



# ATMOSFERA – METALLI in PIEMONTE



**Stagionalità:  
tendenze nel  
tempo**



## 2. Idrosfera: Monitoraggio di parametri chimico-fisici in fiumi piemontesi e svizzeri



# ESEMPI di ANALISI di DATI AMBIENTALI

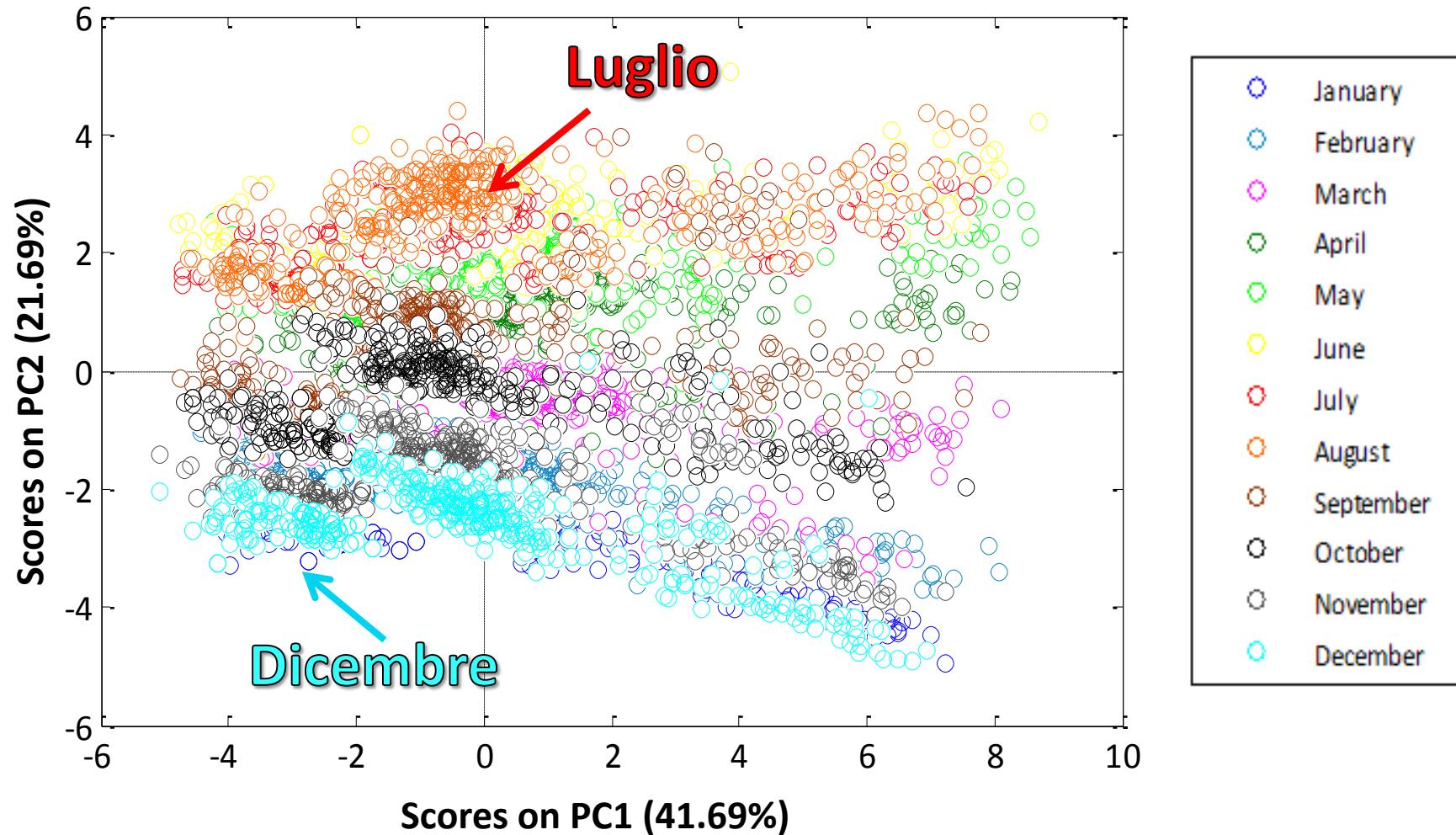
- 15 fiumi;
- 19 variabili;
- 39 anni (1977-2016)

Ricerca di tendenze ed andamenti nei dati raccolti

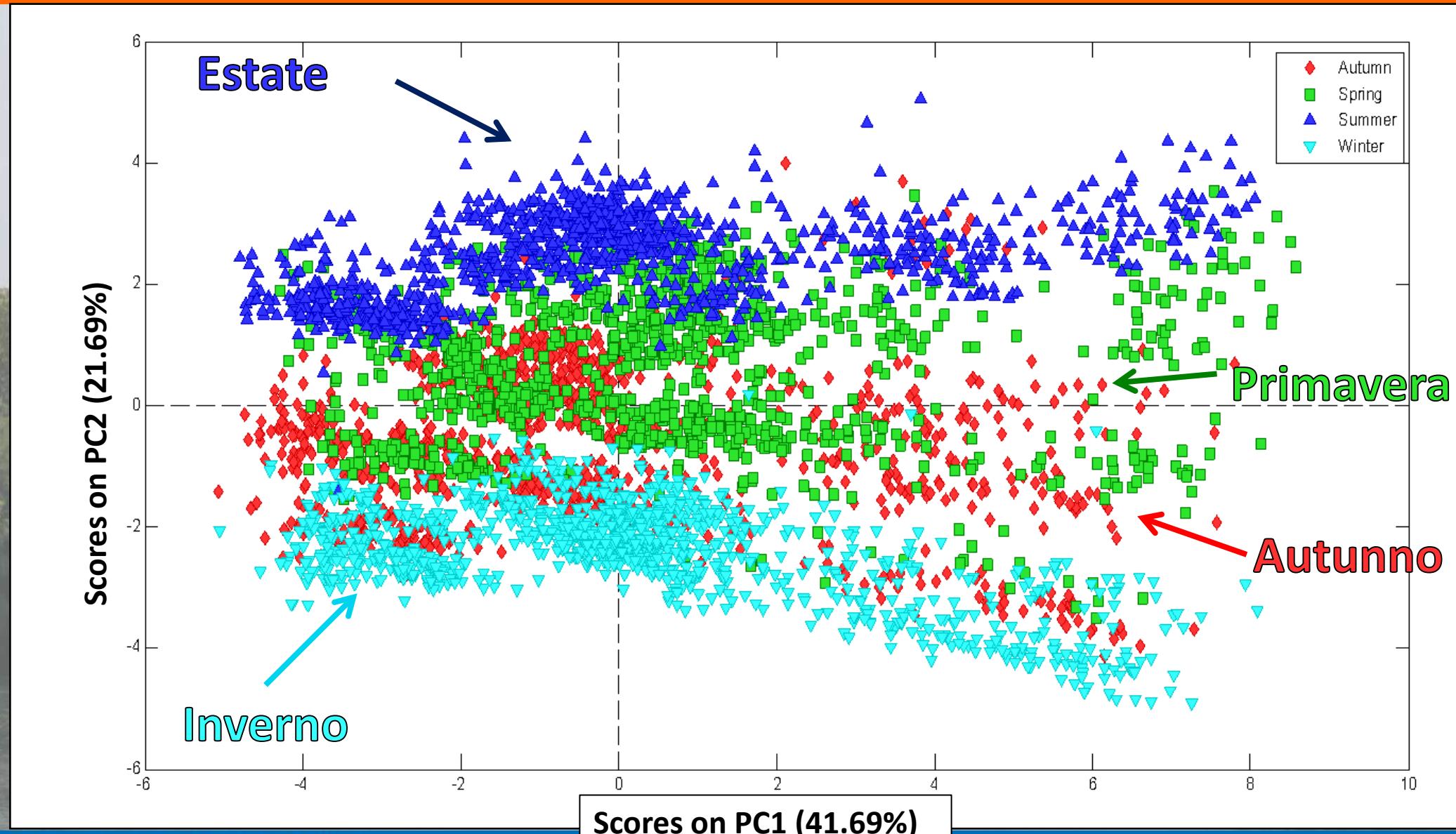


$\text{NO}_3^-$ , M
NPOC, mg C/L
$\text{HCO}_3^-$ , M
$\text{CO}_3^{2-}$ , M
pH
Alkalinity, eq L <sup>-1</sup>
Conductivity, 25°C (LHG), $\mu\text{S cm}^{-1}$
$\text{Ca}^{+2}$ , mg L <sup>-1</sup>
$\text{Mg}^{+2}$ , mg L <sup>-1</sup>
$\text{Cl}^-$ , mg L <sup>-1</sup>
$\text{H}_4\text{SiO}_4$ , mg L <sup>-1</sup>
$\text{SO}_4^{2-}$ , mg L <sup>-1</sup>
T, °C
Flow, m <sup>3</sup> /s
$\cdot\text{OH}$ , M
$\text{CO}_3^{2-}$ , M
$^1\text{O}_2$ , M
$^3\text{CDOM}^*$ , M

# ESEMPI di ANALISI di DATI AMBIENTALI

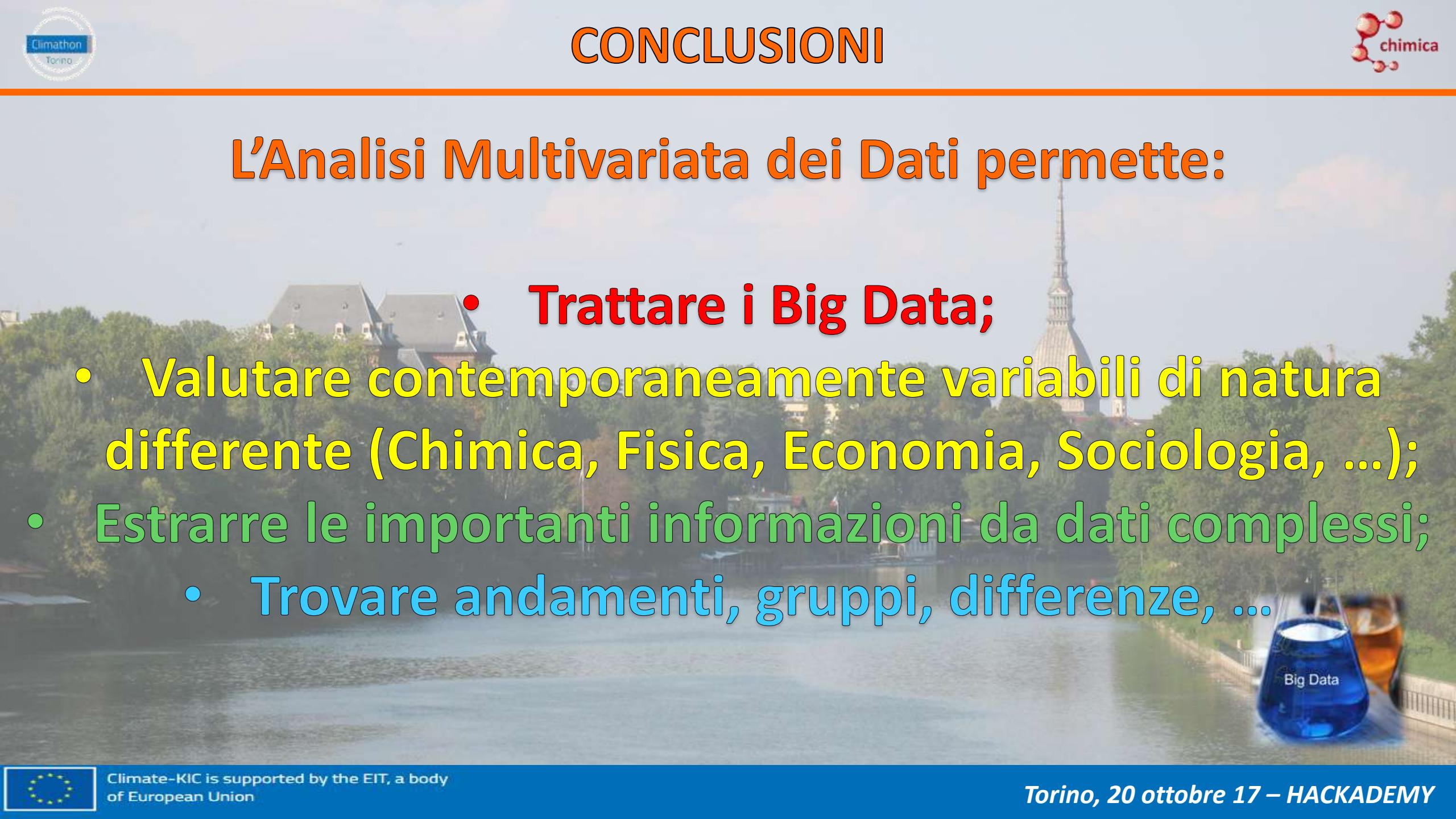


# ESEMPI di ANALISI di DATI AMBIENTALI



## L'Analisi Multivariata dei Dati permette:

- Trattare i Big Data;
- Valutare contemporaneamente variabili di natura differente (Chimica, Fisica, Economia, Sociologia, ...);
- Estrarre le importanti informazioni da dati complessi;
- Trovare andamenti, gruppi, differenze, ...



*"Avere moltissimi dati raccolti nel migliore dei modi, senza interpretarli correttamente, è come avere un meraviglioso pianoforte e suonarlo con un dito solo"*

**(prof. Riccardo Leardi)**





*Grazie per l'attenzione!*

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Climate-KIC is supported by the EIT, a body  
of European Union

Torino, 20 ottobre 17 – HACKADEMY