

# Preliminary results of the source apportionment inter-comparison exercise 2015-2016 (part 1)

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In collaboration with:

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Fairmode Technical meeting Zagreb, 27-29 June 2016



# Information that can be obtained from this IE

- Overall model performance on the basis of pre-established criteria,
   ✓ for the purposes of air quality management (AQM)
- Indirect measure of the overall output uncertainty,
- More robust SA results (from a single outcome to an ensemble)
- Cross-validation of obtained results (to overcome the lack in observed data)
- Provide insights to understand the models behavior:
  - ✓ influence of specific factors (e.g. input data, type of site, type of pollutant, meteorological conditions, etc...)
  - ✓ sensitivity to modelling approaches (e.g. RMs vs SMs) and assumptions
- Additional details about SMs performance
- Integration of RMs outcomes (e.g. Apportionment of secondary pollutants, source-regions apportionment,...)

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# Main goals

- Contributing to the harmonization of Source Apportionment methods and tools (development and sharing of Best Practices)
- Contributing to the integration of Source and Receptor oriented techniques (to provide more robust and complete Source Apportionment information)
- Favoring the connection between Source Apportionment and Planning
  - (e.g. use of common indicators)





#### **Participant Institutions**

AGH-UST, University of Science and Technology **APPA** Trento ARIANET Aristotle University of Thessaloniki ARPA Emilia-Romagna **ARPA** Lombardia **ARPA** Piemonte **ARPA** Puglia **ARPA** Veneto CIFMAT **Clarkson University** CNRS - I GGF Ecole des Mines de Douai ENEA Finnish Meteorological Institute **IDAFA-CSIC** IIA - CNR IMROH INERIS INFN Institute for Nuclear Research, HAS **ISAC** -CNR

#### **ISSeP** IST, Universidade de Lisboa **IISA-CNRS** Miguel Hernandez University NCSR "Demokritos" Paul Scherrer Institut Pontificia Universidad Católica de Chile RIER, University of Cologne RIVM RSF Slovenian Environment Agency TNO Università degli Studi di Milano University College Cork University of Aveiro University of Bari University of Bologna University of Genoa University of Helsinki University of Milano-Bicocca Warsaw University of Technology





# **Organization of the IE**

- □ Data distributed in July 2015
- □ Update in November 2015
- Receptors for CTM in January 2016

Applications: 79 Withrawed: 39 delivered: 40 teams (33 RM, 7 CTM)

- □ RM results reported by 33 teams
- □ CTM results reported by 7 teams
- □ Many defections and delay in submission of results
- Many requests of clarifications and correction of inconsistencies
- Delay in submission of results and solution of inconsistencies impacted on the timing of the data processing

**Belgium** Chile Croatia Finland France Germany Greece Hungary Ireland Italy Poland Portugal Slovenia Spain Switzerland The Netherlands USA





# How is the intercomparison organized?





# Intercomparison outline – Source oriented Models

- Common input dataset
   ECMWF meteorology
   TNO emissions
   MACC chemical fields
- Centralized MPE LENS dataset AIRBASE sites Local networks
- Set of receptors (10)
   Lens
   Urban sites
   Coastal sites
   Background sites





8 - 14 source categories
3 + 3 summer/winter months
Hourly concentrations
Primary and secondary PM
PM precursors



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journal homepage: www.elsevier.com/locate/atmosenv

ATMOSPHERIC

# Evaluation Methodology (RM)

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Complementary tests:	provide ancillary information	A new methodology to assess the performance and uncertainty of source apportionment models in intercomparison exercises	
Mass apportionment	about the solutions' performance	P.K. Hopke d <sup>1</sup> <sup>4</sup> arargeon commission, Joint Research Centre, Institute for Environment and Sustainability, Via Eurico Fermi 2749, Ispra, Va 21027, Italy <sup>b</sup> RSE 5pA, Via R. Rubattina, 54, 20134 Milan, Italy <sup>c</sup> Farangeon Commission, Joint Research Centre, Institute for Health and Consumer Protection, Via Eurico Fermi 2749, Ispra, VA 21027, Italy <sup>c</sup> Farangeon Commission, Joint Research Centre, Institute for Health and Consumer Protection, Via Eurico Fermi 2749, Ispra, VA 21027, Italy <sup>c</sup> Farangeon Commission, Joint Research Centre, Institute for Health and Consumer Protection, Via Eurico Fermi 2749, Ispra, VA 21027, Italy	
Number of factor/source	es	Contents lists available at ScienceDirect	
Preliminary tests:	test if source/factors belong to a given source cate	Atmospheric Environment ELSEVIER journal homepage: www.elsevier.com/locate/atmosenv eggory	
Chemical profiles	> Pearson distance, SID, WD	A new methodology to assess the performance and uncertainty of source apportionment models II: The results of two European intercomparison exercises	
Time-trends	> Pearson distance	C.A. Belis <sup>a,*</sup> , F. Karagulian <sup>a</sup> , F. Amato <sup>b</sup> , M. Almeida <sup>c</sup> , P. Artaxo <sup>d</sup> , D.C.S. Beddows <sup>e</sup> , V. Bernardoni <sup>f</sup> , M.C. Bove <sup>g</sup> , S. Carbone <sup>h</sup> , D. Cesari <sup>1</sup> , D. Contini <sup>1</sup> , E. Cuccia <sup>g</sup> , E. Diapouli <sup>j</sup> , K. Eleftheriadis <sup>1</sup> , O. Favez <sup>k</sup> , I. El Haddad <sup>1</sup> , R.M. Harrison <sup>e,,,,</sup> , S. Helbbust <sup>n</sup> , J. Hovorka <sup>o</sup> , E. Jang <sup>e</sup> , H. Jorquera <sup>p</sup> , T. Kammermeier <sup>9</sup> , M. Karl <sup>1</sup> , F. Lucarelli <sup>s</sup> , D. Mooibroek <sup>1</sup> , S. Nava <sup>5</sup> , J.K. Nøjgaard <sup>1</sup> , P. Paatero <sup>5</sup> , M. Pandolfi <sup>b</sup> , M.G. Perrone <sup>w</sup> , J.E. Petit <sup>1, 2</sup> , A. Pietrodangelo <sup>8</sup> , P. Pokorná <sup>o</sup> , P. Prati <sup>h</sup> , A.S.H. Prevot <sup>m</sup> , U. Quass <sup>4</sup> , X. Querol <sup>b</sup> , D. Saraga <sup>9</sup> , J. Sciare <sup>2</sup> ,	
Contribution-to-species (	(%) $\rightarrow$ Pearson distance	A. Sfetsos <sup>y</sup> , G. Valli <sup>s</sup> , R. Vecchi <sup>s</sup> , M. Vestenius <sup>i</sup> , E. Yubero <sup>aa</sup> , P.K. Hopke <sup>ab</sup>	
= % of species total mat	trix (EPA PMF v3) = explained variation (PMF 2) = cont	tribution by species (CMB 8.2)	
Performance tests	Evaluate if source/factor SCEs fall within an es	stablished quality objective	
Z-scores>	test solution bias coherence with the quality objective (	σ <sub>ρ</sub> )	
Z'-scores $\rightarrow$	test SCE reported uncertainty coherence with the one of	of the reference	
RMSD*>	test the bias, amplitude and phase of the SCE time tren	nds	
	Joint Research		



# **Evaluation in this IE**

#### RM

**Complementary tests:** 

Mass apportionment Number of factor/sources

# SINGLE SITE

**Preliminary tests:** 

Chemical profiles Contribution-to-species (all) Time-trends

Performance tests Z-scores zeta-scores вотн

**Complementary tests:** 

Mass apportionment Number of factor/sources

#### Preliminary tests:

SITE

SINGLE

Chemical profiles Contribution-to-species (selected ones Time-trends-

Performance tests:

Z-scores

zeta-scores

RMSD\*

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СТМ

Complementary tests:

Mass apportionment Number of factor/sources

Preliminary tests:

Chemical profiles Contribution-to-species (seleted ones)

Time-trends

**MULTI SITE** 

Performance tests:

Z-scores

zeta scores

RMSD\*

Zagreb 27-29 June 2016

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# Introduction to RM tests

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# Intercomparison outline – Receptor oriented models

#### DATA SET WITH SPECIATED PM (including organic markers)

COUNTRY PERIOD TIME RES. DURATION OF SAMPLING TYPE OF SITE N SAMPLES IONS EC/OC TRACE FLEMENTS PAHs LEVO/MANN HOPANES **N-ALKANES CHOLESTEROL** SOA MARKERS **OTHER** 

France 03.2011 to 03.2012 every 3 days 24 hours Urban background PM10 116 ok (8 species) ok ok (25 species) ok (15 species) ok + galacto ok (10 species) ok (29 species)

ok Pristane, Phytane, Glucose

Research



Laboratoire de Glaciologie et Géophysique de l'Environnement









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Commission

### **RM PARTICIPANTS**

AGH-UST	ISAC LE	RIVM
APPATN	FMI	SAGE
ARPA ER	IDAEA_T	UCC
ARPA LO	IDAEA_A	UMH
ARPA PU	IMROH	UNIBO
ARSO	ISSeP	UNIHE
AUTH	IST	UNIMI
CARES	LGGE+	UNMIB
CNR IIA	NCSR	UNIFI
ENEA	PSI	UNIGE
ISAC BO	PUC	WUT

RM MODELS
PMF5
ME-2
PMF4
PNF3
PMF2
RCMB

# RM SOURCE CATEGORIES (SPECIEUROPE)

- 1 traffic
- 2 exhaust
- 10 soil
- 12 marine fresh
- 20 industry
- 30 fuel oil
- 31 coal
- 37 ship
- 40 biomass burning
- 41 wood burning
- 5 road dust
- 60 SIA
- 61 ammonium nitrate
- 62 ammonium sulphate
- 66 deicing salt
- 70 POA
- 71 aged sea salt
- 74 combustion





# **RM** preliminary tests

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### **MASS CLOSURE**





The majority of the results reproduce the gravimetric mass accurately. Some results do not explain all the gravimetric mass but fall in the area of acceptance. A few results over- or underestimate the total PM mass.



NMB perform: NMSD perform

E-

D-

C-

в-

A -

# candidate sources and species





- red solid line bar average (9)
- red broken lines represent avg. +-3
- 84% of the results within the range
- average+-2 sources

- 55% of the results were obtained with less than 40 species
- 18 % of the results were obtained with more than 80 species
- many results with merged species





# **RM similarity tests**

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# **SID all particpants**





r = distances to the reference chemical profiles (cp) in SPECIATE and SPECIEUROPE

f = distances among the candidate sources

top = number of candidate sources

Results \*I and O show the majority of cp not comparable with the reference and with the other results. Half of results with more than 25% of candidate sources not comparable to the reference sources.

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- r = distances to the reference chemical profiles (cp) in SPECIATE and SPECIEUROPE
- f = distances among the candidate sources
- top = number of candidate sources
- Fuel oil, ship, SIA and, to a lesser extent, undefined combustion are the most critical source categories

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# Pearson distance (PD) all particpants



2.0 - 810 6 6 812 912 811 7 9 810 7101214 811 9111314 6 7 1212 7 9 11111012 7 9 7 8 12161314101 91110131012 7111515 610 9 9 10121111 7 9 7 8 101 812 811 811 810



distance 🛱 r\_PDcp 🚔 f\_PDcp

r = distances to the reference chemical profiles (cp) in SPECIATE and SPECIEUROPE

f = distances among the candidate sources

top = number of candidate sources

Results \*I and O majority of cp not comparable with the reference and with the other results. Majority of results with more than 50% of candidate sources not comparable to the reference sources.

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# Pearson distance (PD) all particpants





r = distances to the reference chemical profiles (cp) in SPECIATE and SPECIEUROPE

f = distances among the candidate sources

top = number of candidate sources

industry, fuel oil, undefined combustion, traffic, exhaust, road dust soil are the most critical source categories. For gasoline, fuel oil, SIA and undefined combustion there is little agreement among participant results.

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# Pearson distance (PD) time series and contribution-to-species



2.0 - 1010 6 6 12121212121111 9 9 101010101414111111111414 7 7 1212 9 9 11111212 9 9 108 16161414111111113131212111115151010 9 9 12121111 9 9 8 8 111112121111111010



f = distances among the candidate sources

top = number of candidate sources

c2s = contribution to species; sct= source contribution estimate time series

General good agreement between participants. Results H, O and S present atypical time trends. Results B, D, H, O, Q and

S show contribution-to-species not comparable with the rest.

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# **RM** performance tests

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# **Performance RMs z-score (overall sce)**





z score thresholds from kernel curve (Belis et al., 2015)

Result Q (out of scale) and B present the majority of the source candidates out of the acceptability zone. Most of the sce attributed to industry are overestimated.

part

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# Performance RMs Target plot (sce time series)





# Influence of the uncertainty of the reference









# uncertainty of the chemical profiles







# Industry



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# **Performance RMs Z-score (sce time series)**



# traffic







# Additional analysis of RM results

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Average of the scores of all candidate sources in every RM result (red dots) Target and z-score are correlated. Target test is more severe because assess every single time step.



## **RM** analysis





Coherence between the sum of the mass of the sources (sce provided by participants, red bar) and the sum of the mass of the species (blue dots) Problems for \*I, O and Q

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Coherence between the sum of the mass of the sources (sce provided by participants, red bars) and the average mass of the sce time series (blue dots) Problems for \*E, J and Q

# RM analysis Practitioner experience





The performance for practitiones that have conducted 10 or less studies is quite variable. Practitioners declaring to have conducted more than 10 studies have always good performances (low scores).



# **RM** analysis





Results (solutions) with a number of candidate sources (factors) near to the average  $(9\pm 2)$  present better performance than those with a difference of 3 or more sources from the average.



### **RM analysis**





No clear relationship between number of species and performance is observed

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# Thank you for your attention

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