



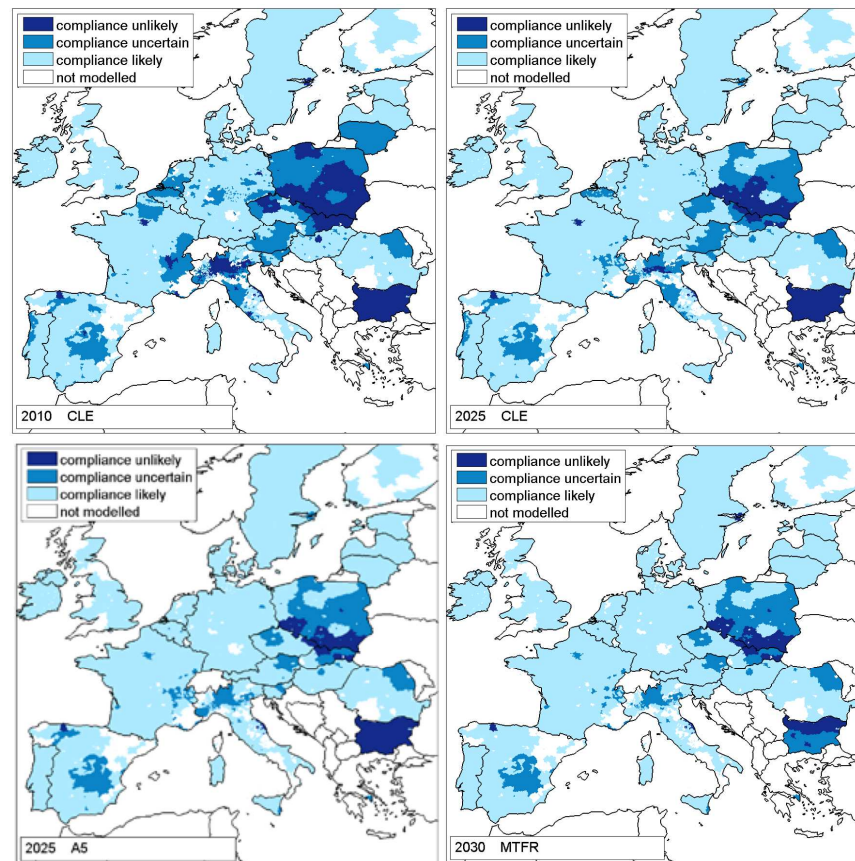
INTEGRATED ASSESSMENT MODELS: A CASE STUDY IN NORTHERN ITALY

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THE CHALLENGE



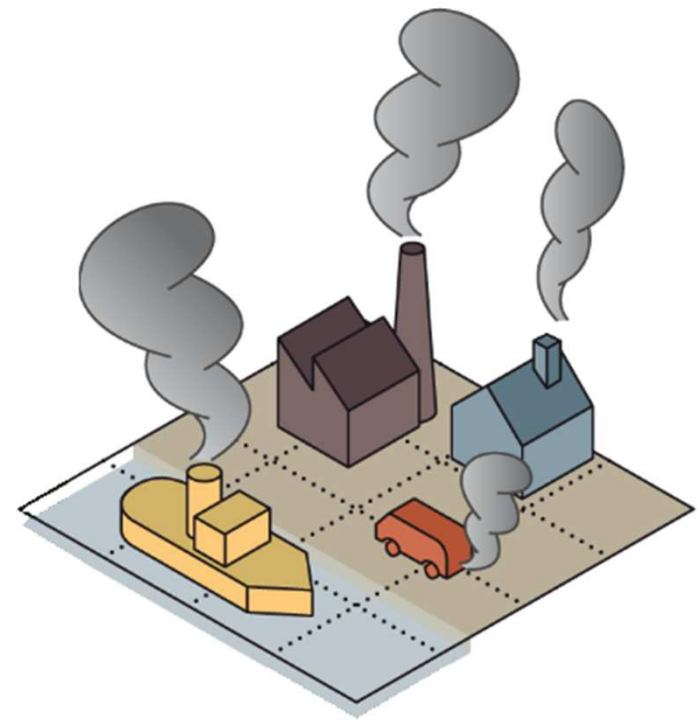
PM10 compliance

DIRECTIVE 2008/50/EC

CHAPTER IV - Article 23

Air quality plans

Where ... the levels of pollutants in ambient air exceed any limit value or target value ... Member States shall **ensure** that **air quality plans** are established ... in order to achieve the related limit values or target values



**INTEGRATED
ASSESSMENT
MODELS**



THE IAM APPROACHES

Approach 1:

IAM assesses the impacts of proposed actions

Scenario analysis

scenario defined by

- experts
- source-apportionment

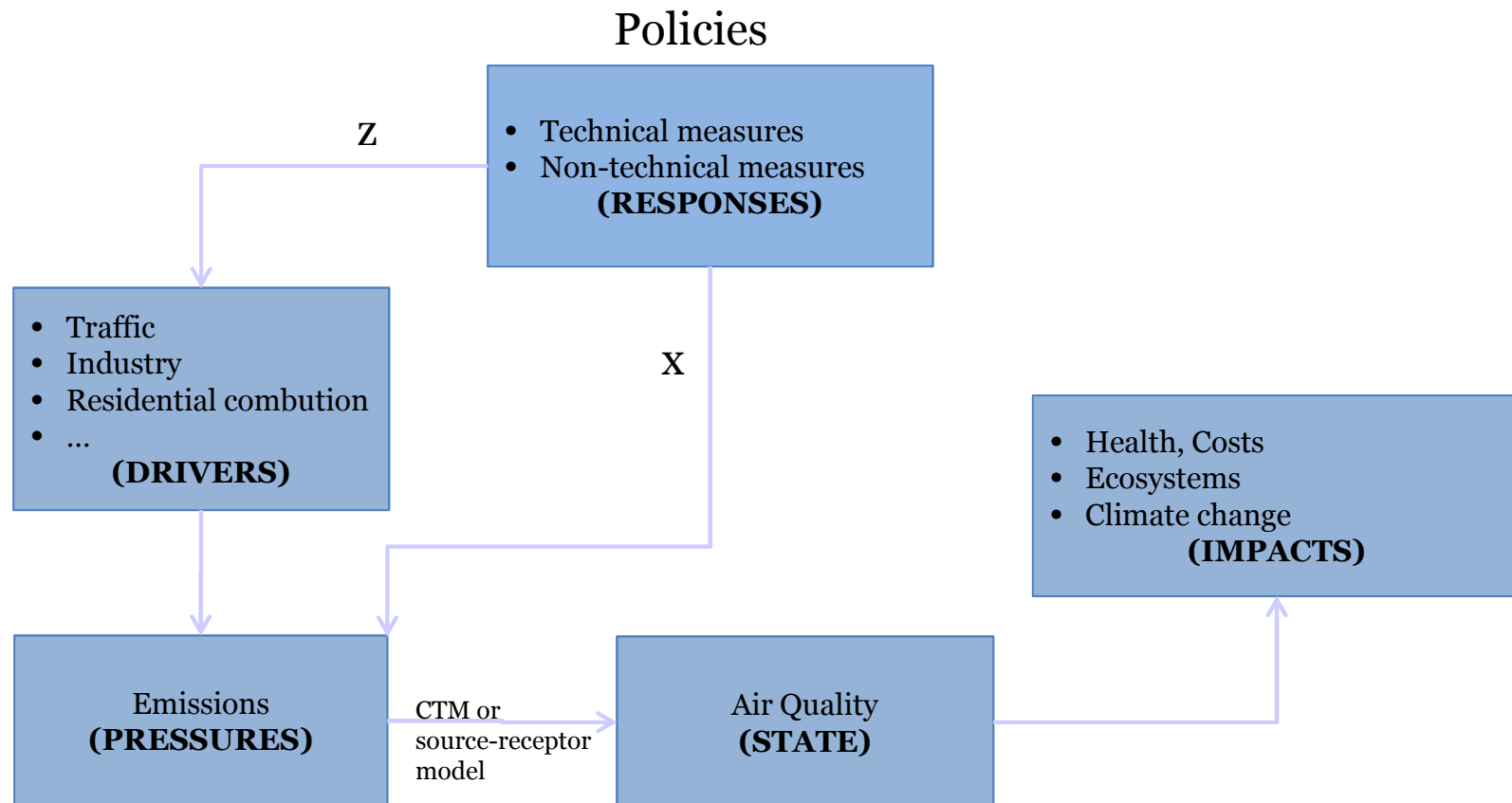
Approach 2:

IAM identifies effective emission reduction measures

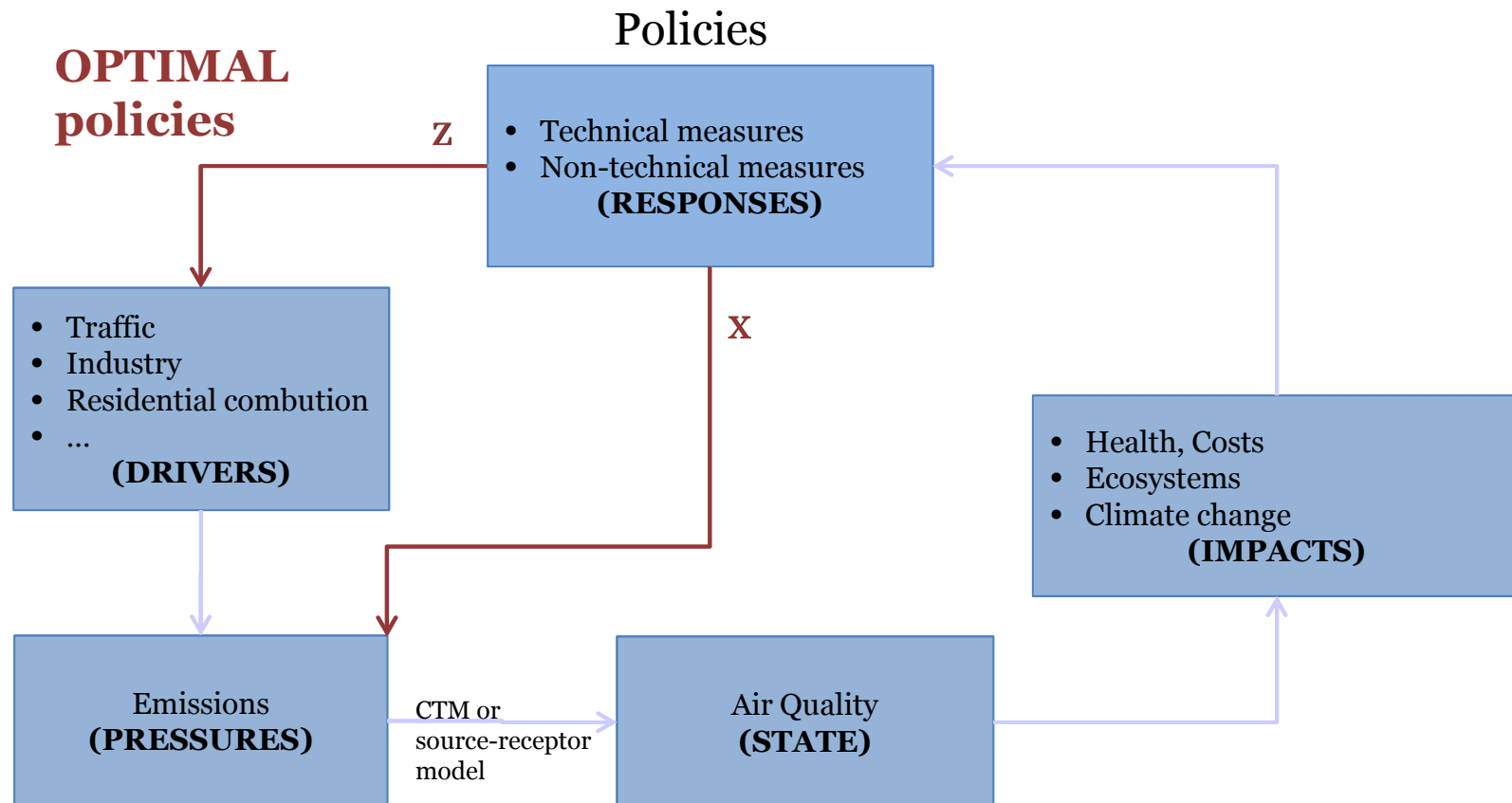
Optimization approach

- Cost effective
- Multi-objective

Approach 1: IAM assesses proposed action impacts: scenario assessment



Approach 2: IAM identifies effective emission reduction measures



2. Optimization approach

Multi-objective approach

$$\min_{x,z} J(x,z) = \min_{x,z} [AQI(x,z) \quad C(x,z)]$$

$$x \in X$$

$$z \in Z$$

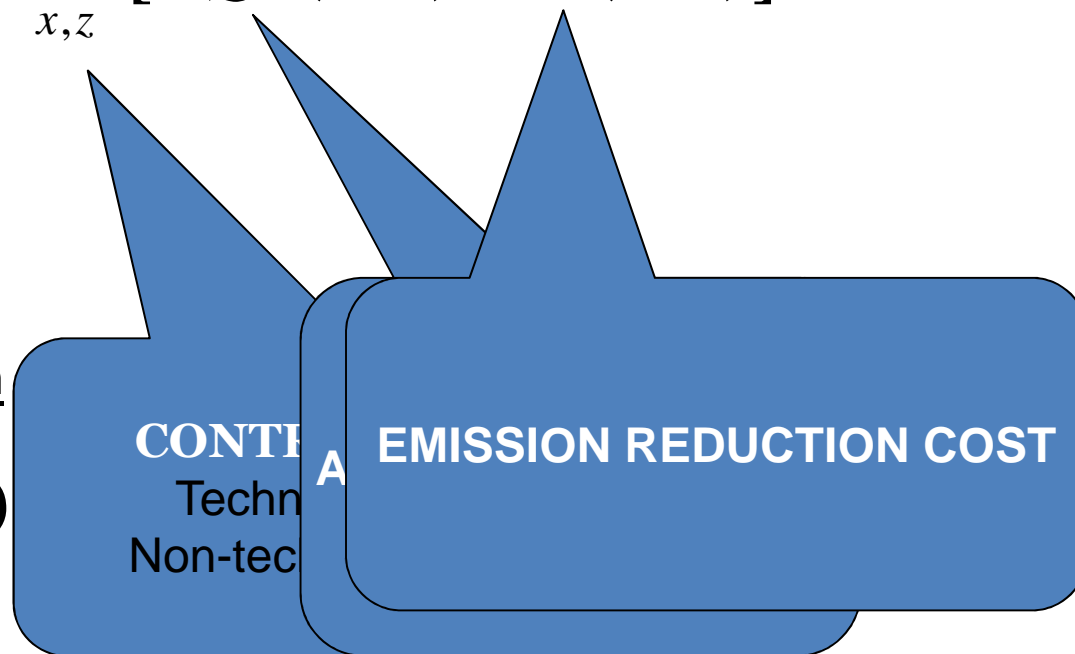
Cost-effective approach

$$\min_{x,z} AQI(x,z)$$

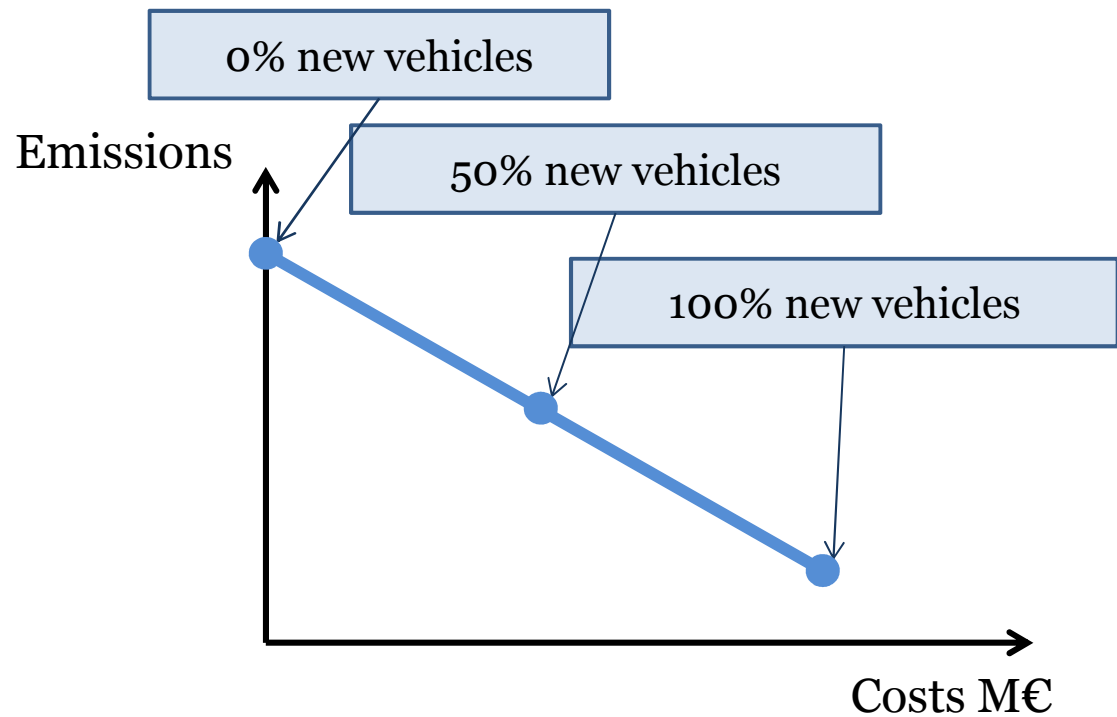
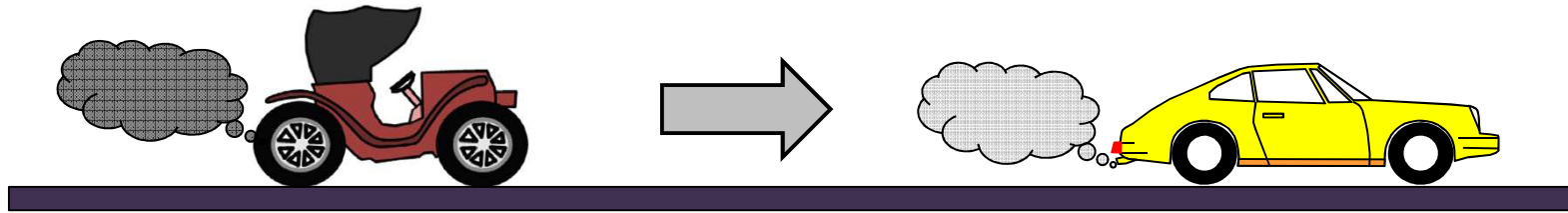
$$x \in X$$

$$z \in Z$$

$$C(x,z) \leq L$$



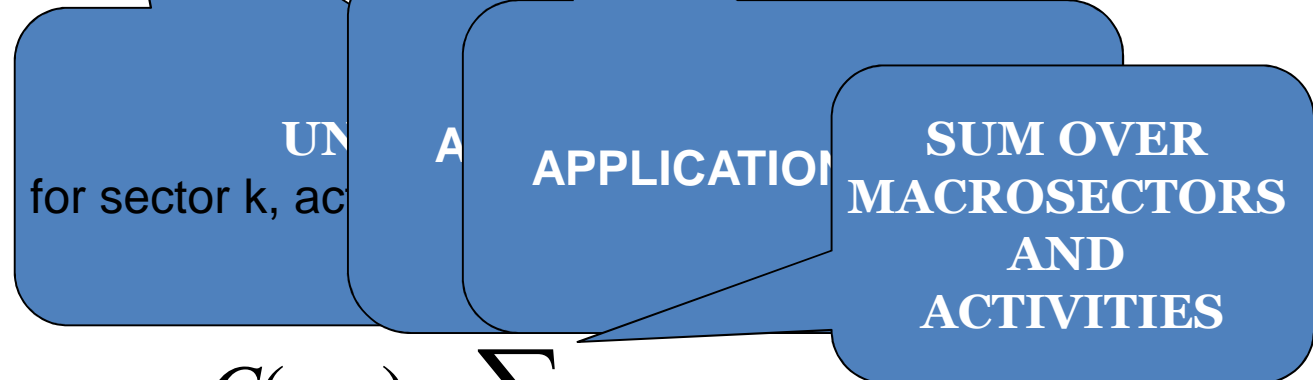
Control variables: application rate



Objective function: costs

$$\min_{x,z} J(x, z) = \min_{x,z} [AQI(x, z) \quad \boxed{C(x, z)}]$$

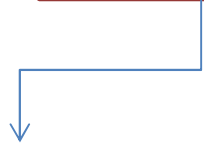
$$c_{k,f} = \sum_{t \in T_{k,f}} c_{k,f,t} \cdot A_{k,f} \cdot X_{k,f,t} + \sum_{t \in T_{k,f}} c_{k,f,t} \cdot A_{k,f} \cdot Z_{k,f,t}$$



$$C(x, z) = \sum_{k,f} c_{k,f}$$

Objective function: AQI

$$\min_{x,z} J(x, z) = \min_{x,z} [AQI(x, z) \quad C(x, z)]$$


$$AQI(x, z) = \underline{f}(E(x, z))$$

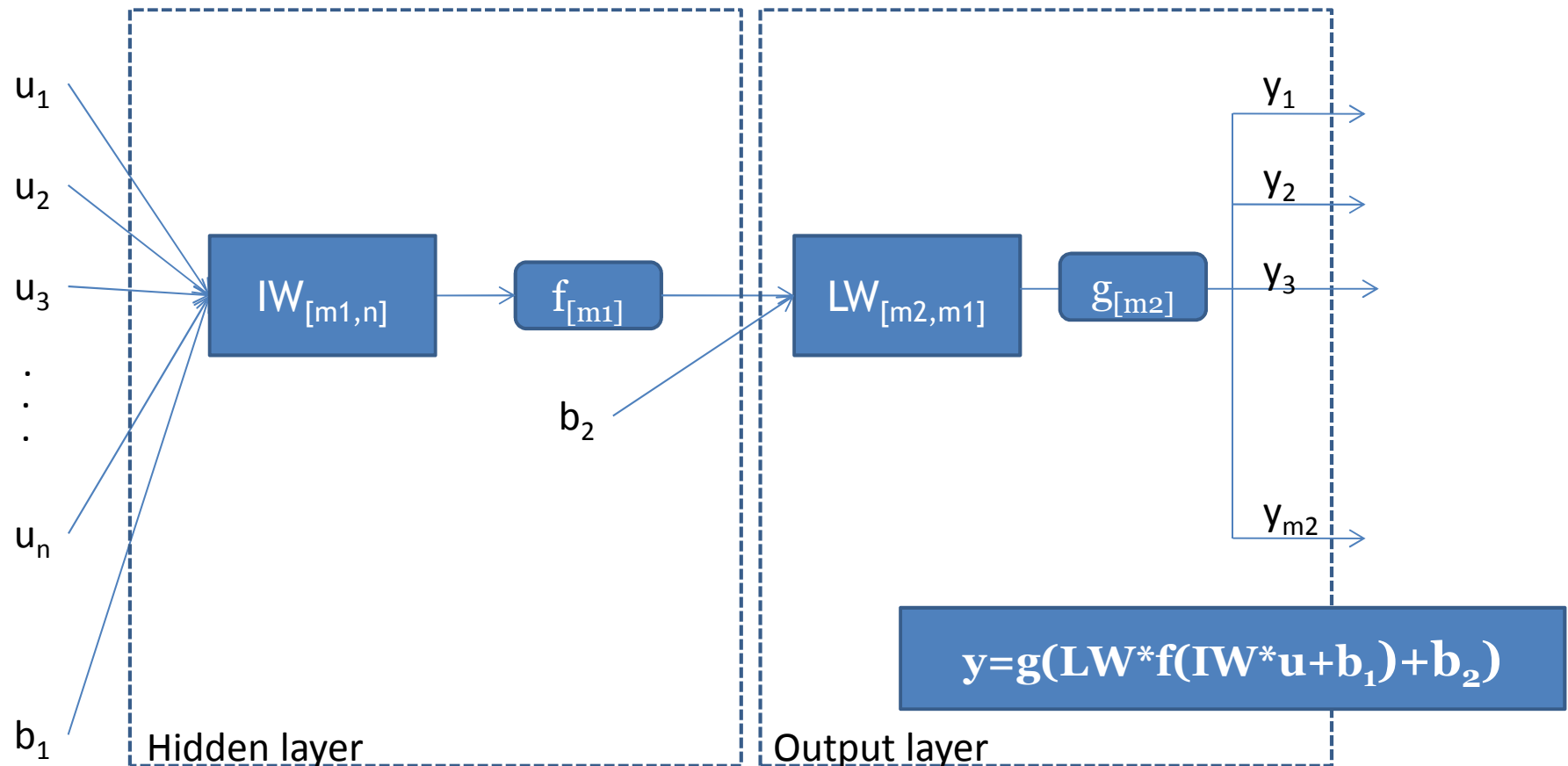
The function **f**:

- links emissions and AQI
- Non linear
- Fast air quality model
- Good performance

Artificial Neural Networks

A series of long term simulations is performed.

Artificial Neural Networks are used to derive the source-receptor relationships between emission sources and air quality indicators at given receptor sites which will be used in the optimization algorithm.



ANNs models: Inputs & Outputs

Sum of emissions over four quadrants.



- PPM₁₀
- PPM_{2.5}
- NH₃
- SO₂
- VOC
- NO_x

48
(=6 pollutants x 4 cells x 2 levels)

INPUTS

- meanPM₁₀

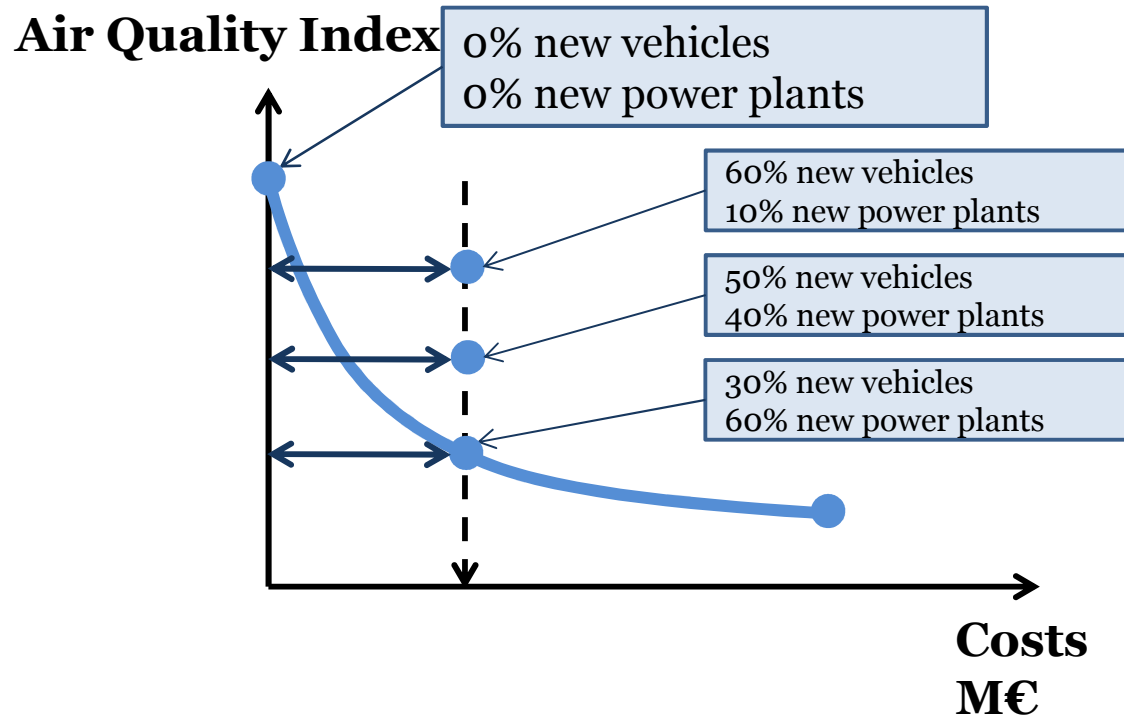
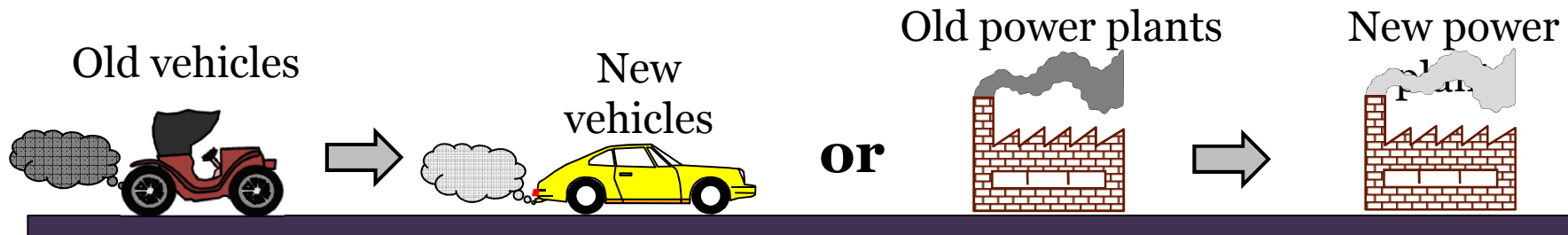
ANNs models: Design of Experiment

Scenarios	NOXa	VOXa	NH3a	PMa	SO2a	NOXp	VOCp	NH3p	PMp	SO2p	Boundary conditions
0	B	B	B	B	B	B	B	B	B	B	B
1	L	L	L	L	L	B	B	B	B	B	B
2	H	H	H	H	H	B	B	B	B	B	B
3	H	L	L	L	L	B	B	B	B	B	B
4	L	H	L	L	L	B	B	B	B	B	B
5	L	L	H	L	L	B	B	B	B	B	B
6	L	L	L	H	L	B	B	B	B	B	B
7	L	L	L	L	H	B	B	B	B	B	B
8	H	H	L	L	L	B	B	B	B	B	B
9	H	L	H	H	H	B	B	B	B	B	B
10	H	L	H	L	L	B	B	B	B	B	B
11	H	L	H	L	H	B	B	B	B	B	B
12	B	B	B	B	B	L	L	L	L	L	B
13	B	B	B	B	B	H	H	H	H	H	B
14	B	B	B	B	B	H	L	L	H	H	B
15	B	B	B	B	B	L	L	L	L	H	B
16	B	B	B	B	B	H	L	L	L	H	B
17	H	H	H	H	H	H	H	H	H	H	B
18	H	L	H	H	H	H	L	L	H	H	B
19	L	L	L	L	H	L	L	L	L	H	B
20	H	L	H	L	H	H	L	L	L	H	B
21	H	H	L	L	L	H	H	L	L	L	B

TCAM
deterministic
modelling system
simulations

B = cle2010
H = mfr2020
L = average of B,H

Optimization



This optimumAQI can be computed for each cost, it gives a optimal curve called “Pareto curve”.

Traffic scenario analysis

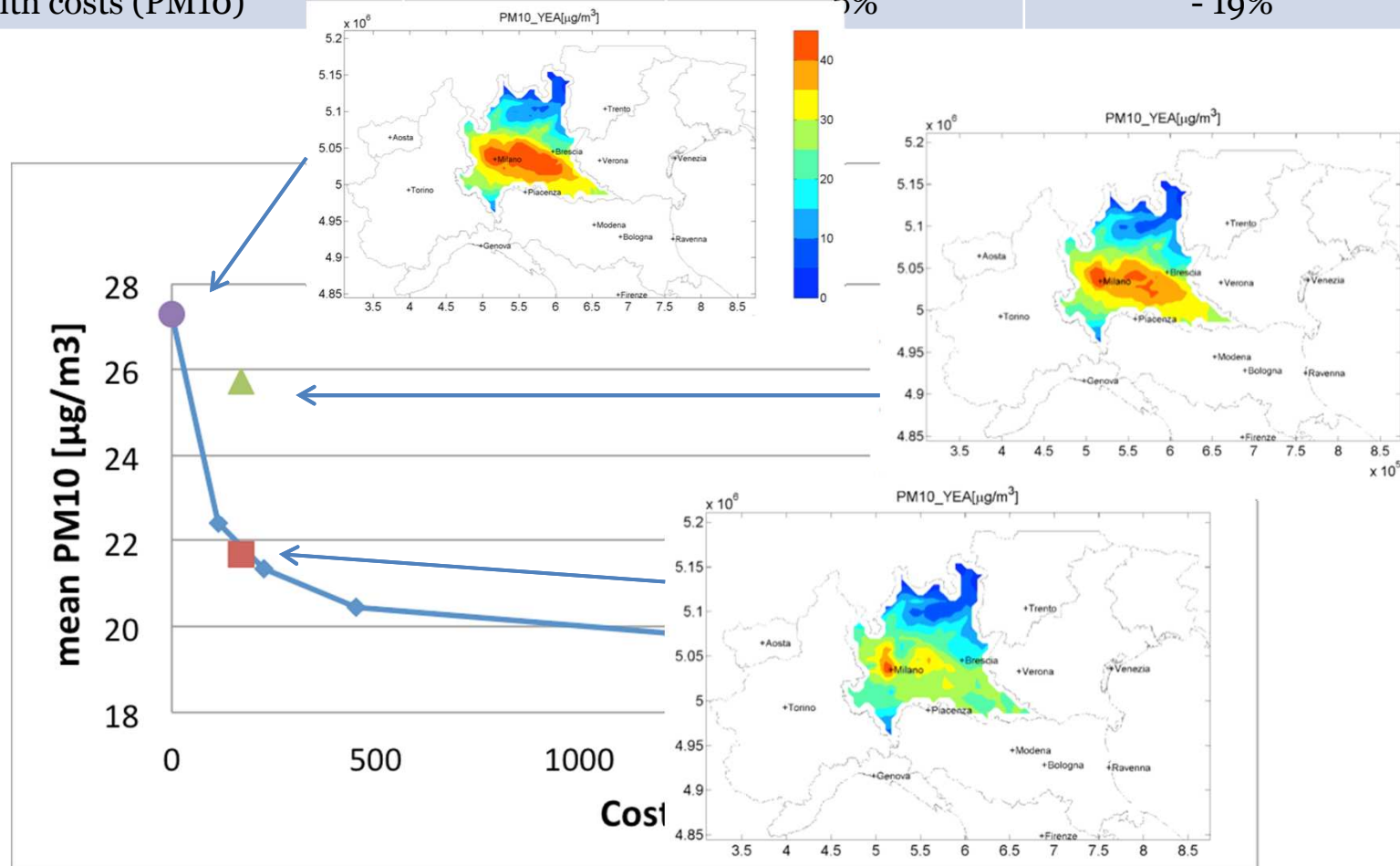


- Vehicle fleet: new EURO standard
- Efficiency Measures:
 - bus investment
 - bicycle path
 - lower speed on highway



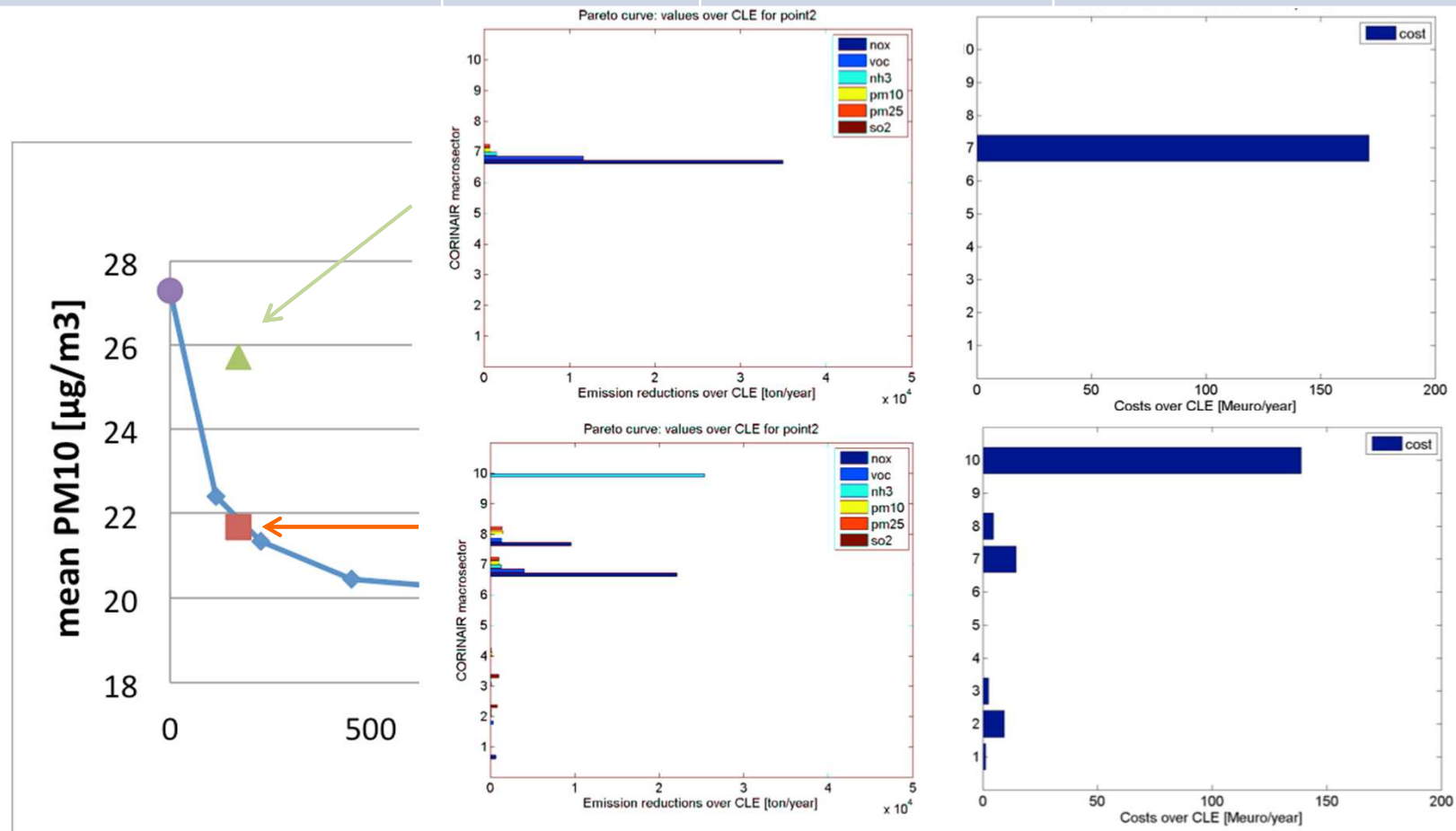
Scenario analysis vs optimization

Impacts	CLE	Traffic scenario	Optimized scenario
Emission reduction costs	0 €	171 M€	171 M€
PM10 [$\mu\text{g}/\text{m}^3$]	10-50	- 6%	- 21%
Health costs (PM10)		5%	- 19%



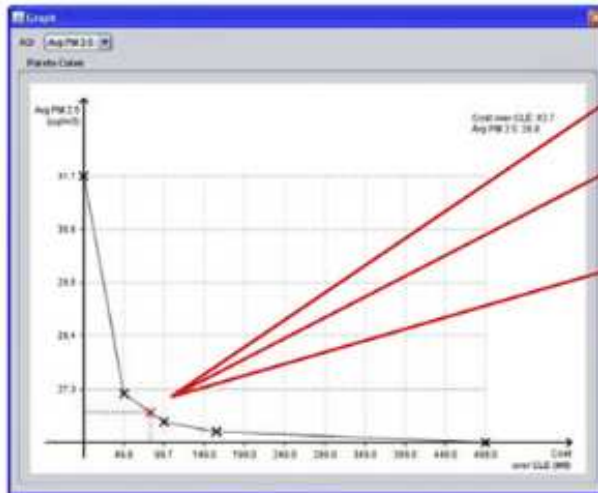
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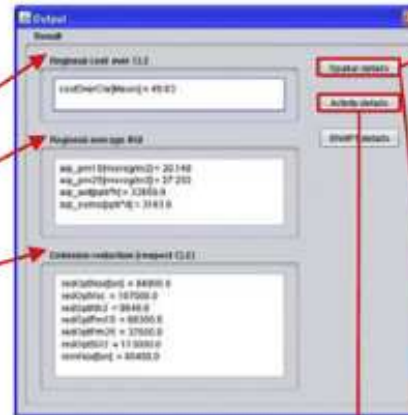


Example of RIAT results

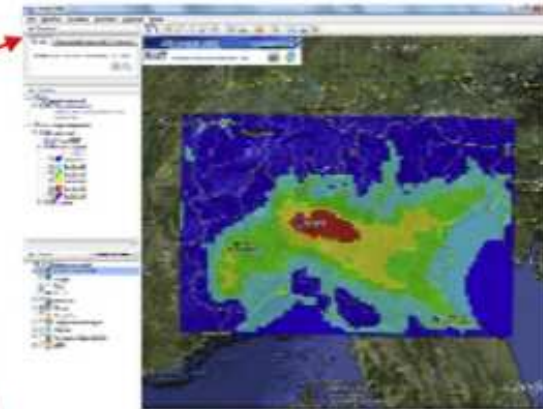
Pareto boundary



Effective policy



Optimal Air Quality map



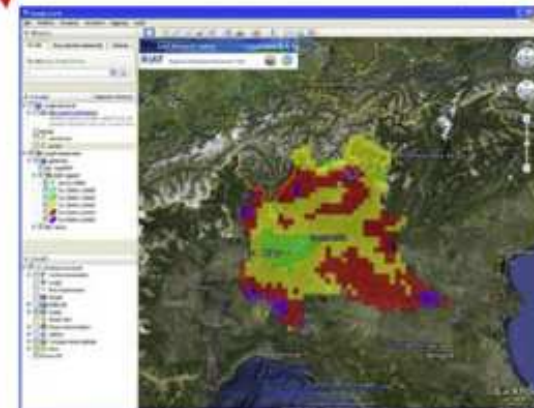
Detailed technology optimal application

Result Table

ms	sec	act	tes	to	Application rate (-1 to 0 to 1)	C
1	Agriculture: Livest.	No fuel use	Feed modification (all)	1		0
1	Agriculture: Livest.	No fuel use	Hay silage for cattle	1		0
1	Agriculture: Livest.	Other cattle - 8	Covered outdoor stores	1		0
1	Agriculture: Livest.	Other cattle - 8	Combination of CS 1	1		0
1	Agriculture: Livest.	Other cattle - 8	Covered outdoor stores	1		0
1	Agriculture: Livest.	Other cattle - 8	Low ammonia applica.	1		0
1	Agriculture: Livest.	Other cattle - 8	Low ammonia applica.	1		0
1	Agriculture: Livest.	Other cattle - 8	Animal house adaption	1		0
1	Agriculture: Livest.	Other cattle - 8	Combination of SA_LNA	1		0
1	Agriculture: Livest.	Other cattle - 8	Low ammonia applica.	1		0
1	Agriculture: Livest.	Other cattle - 8	Low ammonia applica.	1		0
1	Agriculture: Livest.	Dairy cows - 10	Covered outdoor stores	1		0
1	Agriculture: Livest.	Dairy cows - 10	Combination of CS 1	1		0

Export Excel

Optimal emission map



Conclusions

- Scenario analysis approach:
 - allows to assess the variations of AQI due to the application of a set of policies chosen by the user;
 - the measures that can be implemented are hundreds; does not guarantee that the most efficient combination of measures is identified.
- The Multi-Objective approach:
 - optimizes a number of objectives simultaneously;
 - allows to find the most efficient set of measures that guarantees to achieve the highest reduction of secondary pollution over the domain , at minimum costs.

Thank you for your attention

•Carnevale, C.; Finzi, G.; Pederzoli, A.; Turrini, E.; Volta, M.; Guariso, G.; Gianfreda, R.; Maffeis, G.; Pisoni, E.; Thunis, P.; Markl-Hummel, L.; Perron, G.; Blond, N.; Weber, C.; Clappier, A.; Dunardin, V.; in press. “Exploring trade-offs between air pollutants through an Integrated Assessment Model”.

•C. Carnevale, G. Finzi, E. Pisoni, M. Volta, G. Guariso, R. Gianfreda, G. Maffeis, P. Thunis, L. White, G. Triacchini (2012). An integrated assessment tool to define effective air quality policies at regional scale, *Environmental Modelling and Software*, 38, 306-315.

•Carnevale, C., Finzi, G., Pisoni, E., & Volta, M. (2009). Neuro-fuzzy and neural network systems for air quality control. *Atmospheric Environment*, 43, 4811-4821.