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# Robustness of multi-objective optimization of building refurbishment to suboptimal weather data

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TU/e

## Introduction

EU Directive  
31/2010

Cost optimal

Aim

### EU Directive 31/2010 and Delegated Regulation EU 244/2012:

- Requisites for new and renovated existing buildings defined as cost-optimal
- All new buildings n-zeb by 2020
- Incentives for renovation of existing into n-zeb

## Introduction

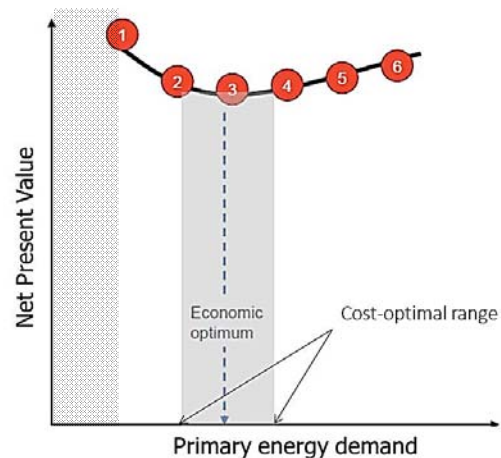
EU Directive  
31/2010

Cost optimal

Aim

### Cost-optimal:

- Among all possible ESMs, the designer should find those that optimizes some competitive goals, such costs and primary energy (Pareto Front) – Multi Objective Optimization.
- The Cost-optimal is the level of minimum Net Present Value in the Pareto Front.



*Boermans et al., 2011*

Introduction



Method



Results



Conclusions



## Introduction

EU Directive  
31/2010

Cost optimal

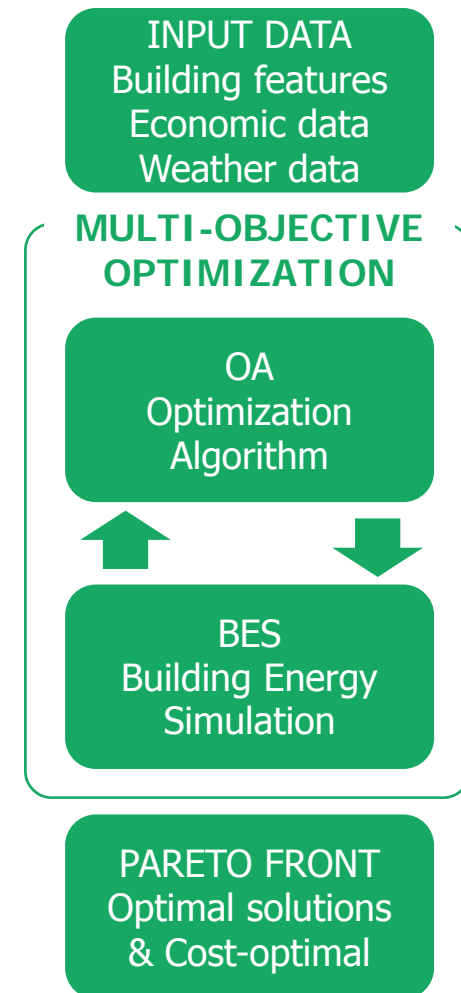
Aim

### Aim of the work:

- Imprecise input data can affect the robustness of the optimization approach and modify the optimal solutions
- Weather data (Test reference year) should be developed to be representative of the climatic conditions of the location.

How much the method for the definition of the TRYs can affect the optimal configurations?

The case of Trento (Italy)



## Method

Weather data

### Weather data:

The representativeness of weather inputs is a key aspect to obtain reliable building simulation results and optimization.

Residential buildings

TRY can be defined according to different methods and depend on the length of the multi-year weather data series.

Energy saving measures

Optimization has been repeated for Trento TRY obtained from data series of different lengths (from 10 to 5 years)

Multi-objective optimization

No. years	10	9	8	7	6	5
Reference data for the TRY definition	96-98, 2002-08	96, 97, 2002-08	96, 97, 2002, 2004-08	96, 97, 2002-06	96, 97, 2002, 03, 07, 08	97, 2003-06

## Method

Weather data

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No. years	10	9	8	7	6	5
HDD <sub>18</sub> (K d)	2499	2674	2167	2759	2298	2657
ΔHDD <sub>18</sub> (%)	-0.40	6.58	-13.63	9.96	-8.41	5.90
<b>2509</b>						
Daily I <sub>sol</sub> (MJ m <sup>-2</sup> )	7.98	7.49	6.15	7.09	6.51	7.70
Δ (%) <b>7,16</b>	11.5	4.7	-14.0	-0.8	-9.0	17.0

## Method

Weather data

Residential buildings

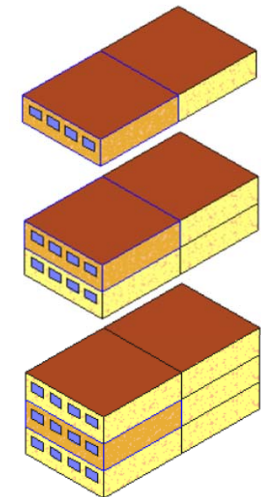
Energy saving measures

Multi-objective optimization

### Reference starting configuration (100 m<sup>2</sup>, 3 m height):

- Three typologies: semi-detached house ( $S/V = 0.97 \text{ m}^{-1}$ ), penthouse ( $S/V = 0.63 \text{ m}^{-1}$ ) and intermediate flat in multi-story buildings ( $S/V = 0.3 \text{ m}^{-1}$ ).
- The considered configurations have windows only in one façade (east or south). Features typical till the '70s.

Opaque Envelope	
d (m)	0.20
$\lambda$ (W m <sup>-1</sup> K <sup>-1</sup> )	0.25
R (m <sup>2</sup> K W <sup>-1</sup> )	0.80
$\kappa$ (kJ m <sup>-2</sup> K <sup>-1</sup> )	150
$\rho$ (kg m <sup>-3</sup> )	893
c (J kg <sup>-1</sup> K <sup>-1</sup> )	840



## Method

Weather data

Residential buildings

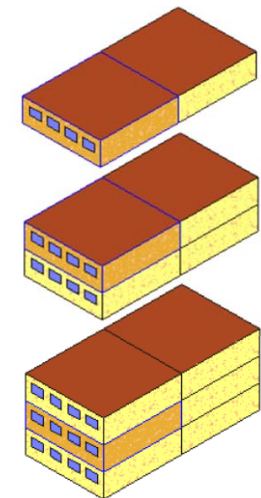
Energy saving measures

Multi-objective optimization

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Windows	
Glazing: Single-pane	
$U_{gl}$ (W m <sup>-2</sup> K <sup>-1</sup> )	5.69
SHGC	0.81
Frame: Standard Timber	
$U_{fr}$ (W m <sup>-2</sup> K <sup>-1</sup> )	3.20
$A_f/A_{win}$ (%)	19.9





## Method

Weather data

Residential buildings

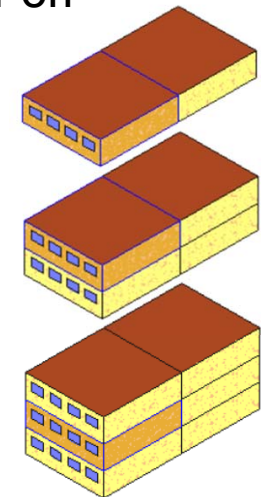
Energy saving measures

Multi-objective optimization

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- The considered configurations have windows only in one façade (east or south). Features typical of 1970s.
- A standard boiler coupled with radiators and on-off system regulation

Infiltration Rate (ACH)	
Intermediate flat in multistory	0.06
Semi-detached houses	0.13
Penthouses	0.20



## Method

Weather  
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Residential  
buildings

Energy  
saving  
measures

Multi-  
objective  
optimization

### Energy saving measures to be combined:

- Additional insulating layer of EPS with thermal conductivity  $0.04 \text{ W m}^{-1} \text{ K}^{-1}$  (from 1 to 20 cm) on the external surface of:
  - non-adiabatic walls
  - exposed ceiling
  - floor (only for the semi-detached houses);
- High performance frames and glazings (i.e., double or triple pane with either high or low solar heat gain coefficients);
- Modulating or condensing boiler, equipped with a climatic adjustment of the supply temperature;
- Mechanical ventilation with heat recovery system.

Prices from regional price list and the national authority of gas and electricity. Investment analysis lifespan 30 years.

## Method

Weather  
data

**Elitist Non-dominated Sorting Genetic Algorithm:**  
with some code customizations regarding sampling,  
crossover, mutation and selection procedures.

Residential  
buildings

1. First generation selection by Sobol ( $n=128$  individuals)
2. NPV and primary energy (EPH) evaluation
3. Selection of  $m$  dominant solutions (temporary Pareto-Elite)

Energy  
saving  
measures

4. Selection of  $(n - m)$  couples of parents by Tournament selection without replacement (1 from each 4-plets)
5. New generation by weighting average of parents
6. Mutation on 20 % of the children

Multi-  
objective  
optimization

7. Step 2 again for the new generation
8. Selection of dominant solutions from the new generation and the previous Elite
9. Again from step 4 on

## Results

$$S/V = 0.30 \text{ m}^{-1}$$

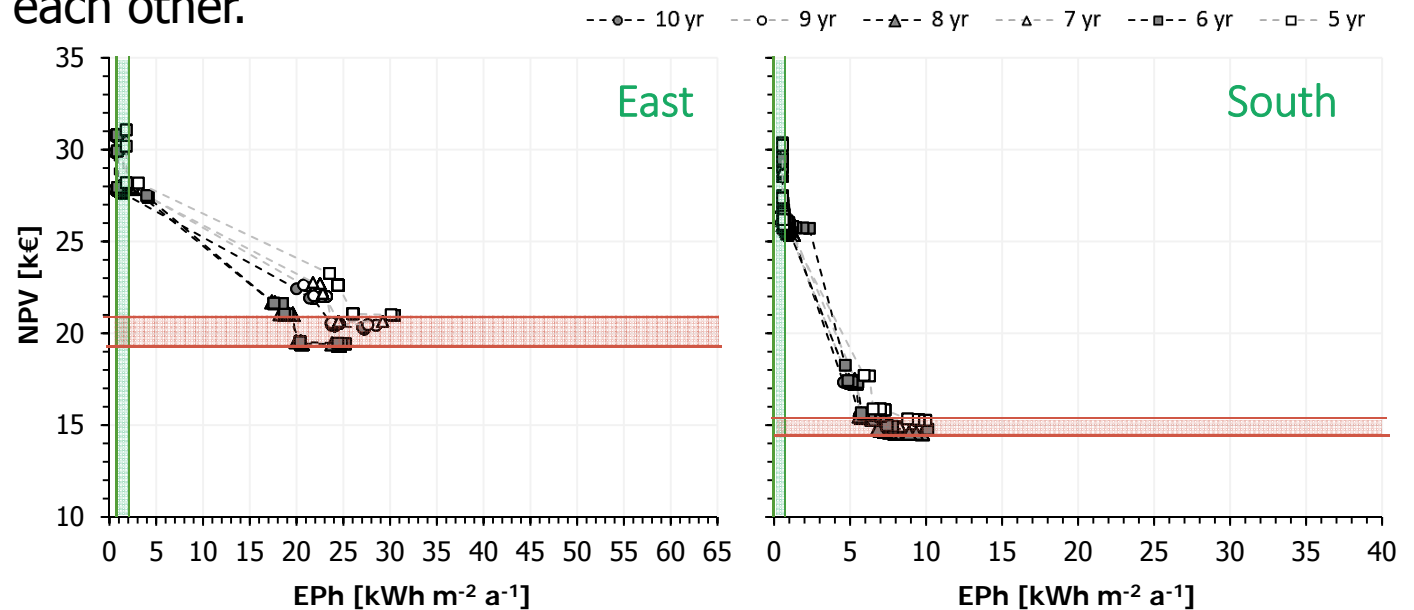
$$S/V = 0.63 \text{ m}^{-1}$$

$$S/V = 0.97 \text{ m}^{-1}$$

### Pareto front:

two groups: optimal solutions with mechanical ventilation system (MVS) in the higher-left part of the diagram and those with natural ventilation in the lower-right part.

In some cases, Pareto fronts for different TRY intersect each other.



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## Results

$$S/V = 0.30 \text{ m}^{-1}$$

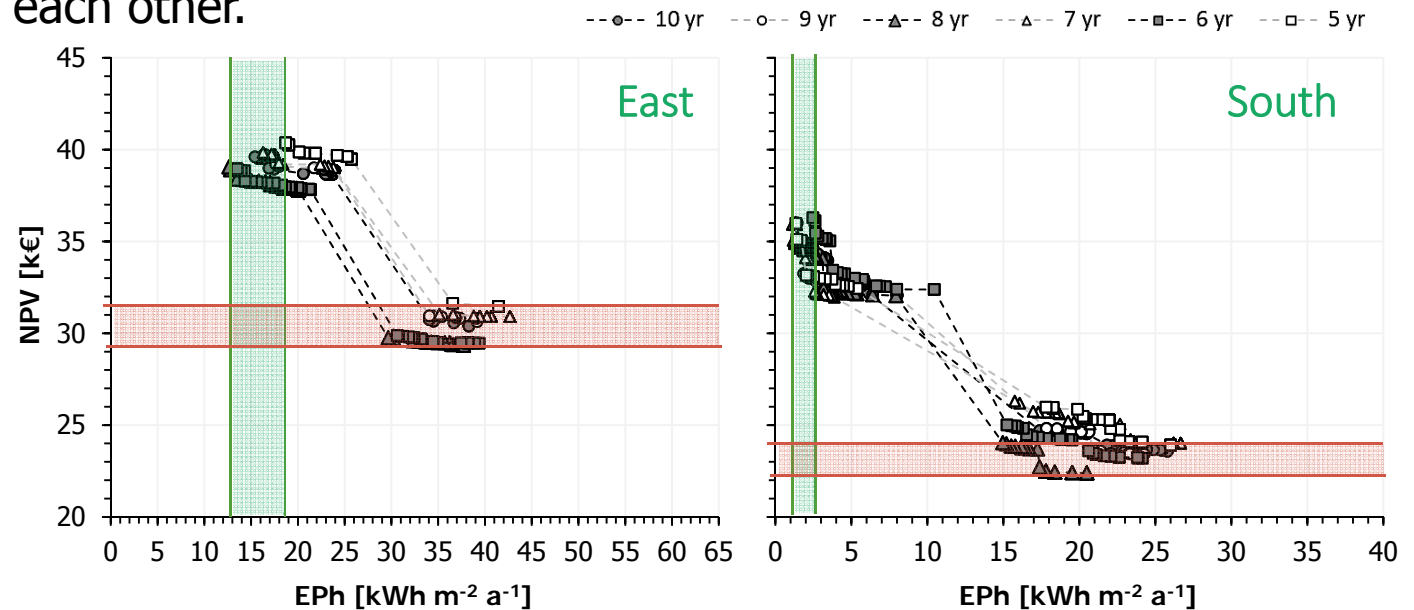
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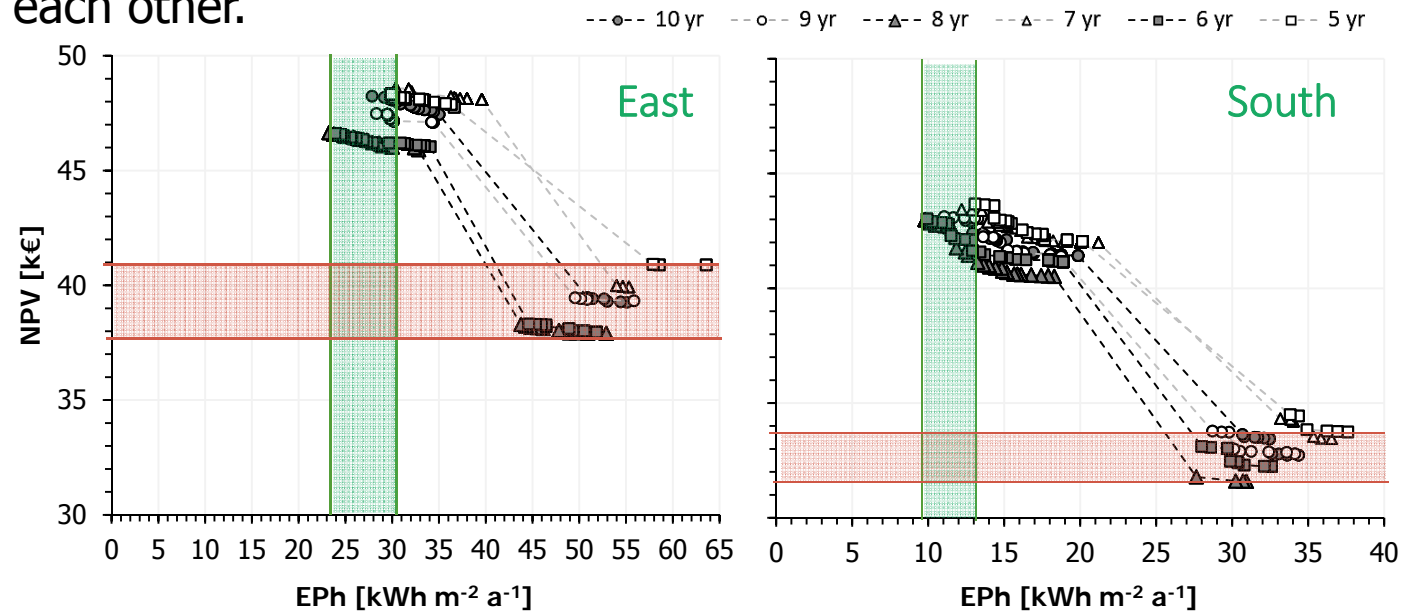
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# Results

Optimal solutions in reducing NPV

	East windows orientation						South windows orientation					
	Insulation thickness [cm]			Win	Boiler	Ven	Insulation thickness [cm]			Win	Boiler	Ven
	Wall	Roof	Floor				Wall	Roof	Floor			
<b>Intermediate flat in multi-story buildings <math>S/V = 0.30 \text{ m}^{-1}</math></b>												
10 yr	19			DH	Std	Nat	17			DH	Std	Nat
9 yr	18			DH	Std	Nat	18			DH	Std	Nat
8 yr	18			DH	Std	Nat	12			DH	Std	Nat
7 yr	18			DH	Std	Nat	18			DH	Std	Nat
6 yr	17			DH	Std	Nat	13			DH	Std	Nat
5 yr	18			DH	Std	Nat	17			DH	Std	Nat
<b>Penthouse <math>S/V = 0.63 \text{ m}^{-1}</math></b>												
10 yr	18	17		DH	Cond	Nat	17	15		DH	Std	Nat
9 yr	18	17		DH	Cond	Nat	19	15		DH	Std	Nat
8 yr	18	17		DH	Mod	Nat	19	15		DH	Std	Nat
7 yr	16	15		DH	Cond	Nat	17	16		DH	Std	Nat
6 yr	17	16		DH	Mod	Nat	16	16		DH	Std	Nat
5 yr	18	18		DH	Cond	Nat	16	17		DH	Std	Nat
<b>Semi-detached houses <math>S/V = 0.97 \text{ m}^{-1}</math></b>												
10 yr	19	19	18	DH	Mod	Nat	17	18	17	DH	Mod	Nat
9 yr	16	17	17	DH	Cond	Nat	17	17	17	DH	Mod	Nat
8 yr	16	15	16	DH	Cond	Nat	17	16	17	DH	Mod	Nat
7 yr	18	18	17	TH	Mod	Nat	18	17	17	DH	Mod	Nat
6 yr	17	17	15	DH	Cond	Nat	17	17	17	DH	Mod	Nat
5 yr	17	18	17	DH	Mod	Nat	18	16	18	DH	Mod	Nat

## Results

Optimal solutions in reducing  $EP_h$

	East windows orientation						South windows orientation					
	Insulation thickness [cm]			Win	Boiler	Ven	Insulation thickness [cm]			Win	Boiler	Ven
	Wall	Roof	Floor				Wall	Roof	Floor			
<b>Intermediate flat in multi-story buildings <math>S/V = 0.30 \text{ m}^{-1}</math></b>												
10 yr	20			TH	Cond	MVS	13			TH	Cond	MVS
9 yr	20			TH	Std	MVS	13			TH	Std	MVS
8 yr	20			TH	Std	MVS	13			TH	Std	MVS
7 yr	20			TH	Cond	MVS	15			TL	Cond	MVS
6 yr	20			TH	Cond	MVS	20			TL	Cond	MVS
5 yr	20			TH	Cond	MVS	19			TL	Cond	MVS
<b>Penthouse <math>S/V = 0.63 \text{ m}^{-1}</math></b>												
10 yr	20	19		TH	Cond	MVS	20	20		TH	Cond	MVS
9 yr	19	19		TH	Cond	MVS	20	20		TH	Mod	MVS
8 yr	20	20		TH	Cond	MVS	20	20		TH	Cond	MVS
7 yr	20	19		TH	Cond	MVS	20	20		TH	Cond	MVS
6 yr	19	19		TH	Cond	MVS	20	20		TH	Cond	MVS
5 yr	19	19		TH	Cond	MVS	20	20		TH	Cond	MVS
<b>Semi-detached houses <math>S/V = 0.97 \text{ m}^{-1}</math></b>												
10 yr	20	20	20	TH	Cond	MVS	19	19	18	TH	Cond	MVS
9 yr	18	18	19	TH	Cond	MVS	19	19	19	TH	Cond	MVS
8 yr	19	19	20	TH	Cond	MVS	19	20	19	TH	Cond	MVS
7 yr	19	20	19	TH	Cond	MVS	19	19	19	TH	Cond	MVS
6 yr	19	19	19	TH	Cond	MVS	19	19	20	TH	Cond	MVS
5 yr	18	20	19	TH	Cond	MVS	19	19	19	TH	Cond	MVS

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## Conclusions

Overview

Outcomes

### Overview:

- the effects of insufficiently long historic weather series in the TRY definition have been assessed
- the robustness of a genetic algorithm, the Elitist Non-dominated Sorting Genetic Algorithm, in multi-objective optimizations for building energy refurbishment to suboptimal TRY has been considered
- the optimal retrofit solutions for six reference buildings have been determined and compared for TRYs obtained from weather series of different lengths for Trento

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## Conclusions

Overview

Outcomes

### Outcomes:

- Pareto fronts, in some cases, lead to different optimal values and to different optimal configurations:
- (a) minimum NPV is sensitive to the TRY especially for East orientation and larger S/V
- (b) minimum Eph increases with S/V and is sensitive to TRY, more for East and larger S/V
- As for the optimal ESMs configurations:
  - the insulation level and the boiler replacement have the largest variability, especially for NPV optimization
  - the selection of the best solution for window substitution is more robust to the weather inputs
  - as regards the ventilation, there is no sensitivity at all for the considered buildings

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**THANK YOU FOR YOUR ATTENTION!**

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