



Agenzia nazionale per le nuove tecnologie,  
l'energia e lo sviluppo economico sostenibile



# Example of using outdoor radon and radon flux maps for the estimation of radon priority areas

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*Training Course #2\_PT B Braunschweig (DE), 15 March 2023*



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# Legal Basis

- Sets **reference level** for dwellings and workplaces: 300 Bq/m<sup>3</sup>

Requires:

- elaboration of **Rn Action Plans**;
- **identification** of “Rn priority areas”- **RPA**
- **remediation** of workplaces;
- **prevention** for residential buildings.



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Legislation

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II Non-legislative acts

DIRECTIVES

★ Council Directive 2013/59/Euratom of 5 December 2013 laying down basic safety standards for protection against the dangers arising from exposure to ionising radiation, and repealing Directives 85/618/Euratom, 90/641/Euratom, 96/29/Euratom, 97/43/Euratom and 2003/122/Euratom ..... 1

Price: EUR 4

EN

Acts whose titles are printed in light type are those relating to day-to-day management of agricultural matters, and are generally valid for a limited period.  
The titles of all other acts are printed in bold type and preceded by an asterisk.

# Radon Priority Areas

## Art. 103,3; Radon Priority Areas (RPA):

“Member States shall **identify areas** where the radon concentration (as an annual average) in a significant number of buildings is expected to exceed the national reference level.”

## Conc **Detect Radon Priority Areas:**

Art. 54 There is not a “fixed” definition, and different criteria may be applied.

In areas Political decision (and data availability)

measured, remediated. New buildings: particular Rn prevention.  
Strategy to reduce Rn in dwellings.

# Radon Maps

## PURPOSE:

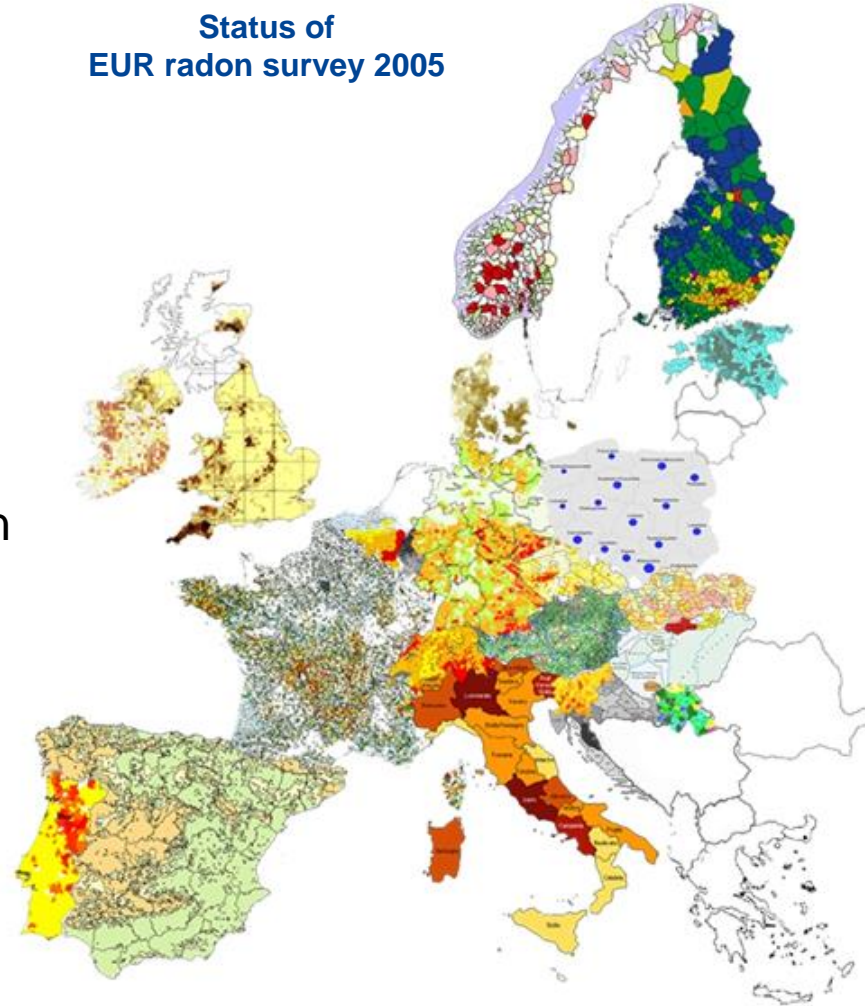
- **Display**: describe the actual situation, **Information of stakeholders** (public, legislators, administrations, professionals)
- **Identify** radon priority areas (as in article 103), **decision support**

## Status of EUR radon survey 2005

### ***EUR radon survey 2005:***

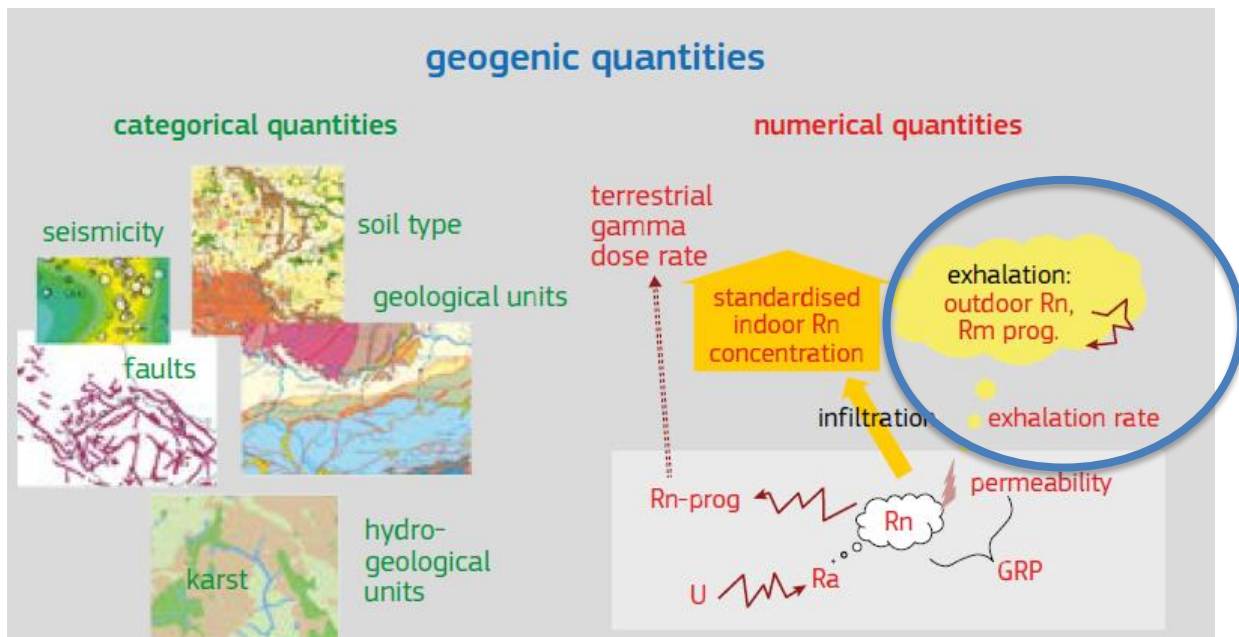
- Many countries had radon “maps” (indoor conc., radon potential etc.)
- Measurement techniques and strategies differ between countries
- Different mapping methods and visualization techniques
- => Colourful patchwork (but not very useful for analysis)

Dubois, G. (2005): An Overview of  
Radon Surveys in Europe  
EUR Report 21892



# Radon maps: **Input Quantities**

- Indoor radon
- **geogenic parameters** (radon in soil gas, soil permeability, geology, faults, soil type, Ra-U concentrations in soil/rock, outdoor radon, radon flux etc...)



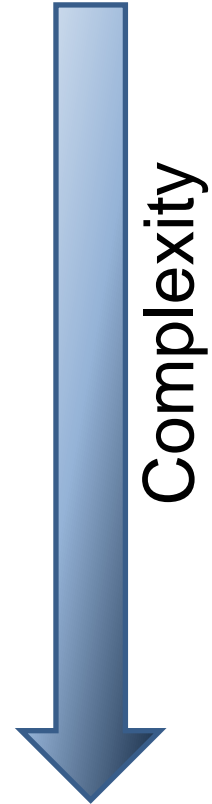
# Resolution

Depend on radon data density and scope of the map

- Grid (1x1 km, 100x100 m, 10x10 km)
- Municipalities
- Postal code
- Geological unit, lithological or stratigraphic (at which detail?)

# Mapping Methods:

- Display observed (raw) data
- Basic statistics (e.g. AM)
- Geostatistics: using nearby observation (and (optionally) limited number of co-variables) to predict (e.g. kriging, IDW, moving average)
- Machine Learning: Regression, using many co-variables. Not necessarily an influence of nearby observations on the predicted value





# Possible Output quantities

- Arithmetic mean or expectation in cell
- % above reference level
- Classes 4-5-6...10
- Geogenic Radon Potential
- Geogenic Radon Hazard Index - GHRI
- Status RPA yes / undecided / no

# Outdoor radon and radon flux for radon mapping

## Objective:

Can outdoor radon and radon flux improve the prediction of areas with high radon potential?

## Workflow:

- Test outdoor radon and radon flux as input features along with other predictors (geology, soil properties, weather) in a machine learning workflow.

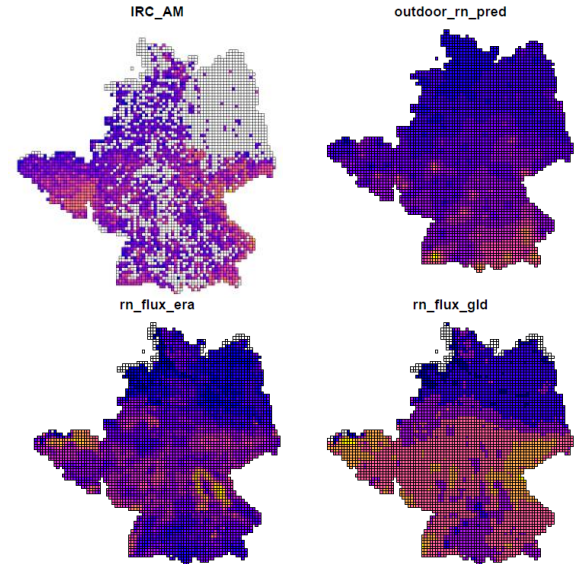
## Assumption:

- Indoor radon concentrations can be used to represent the radon potential of an area.

# Outdoor radon and radon flux for radon mapping

## Input data

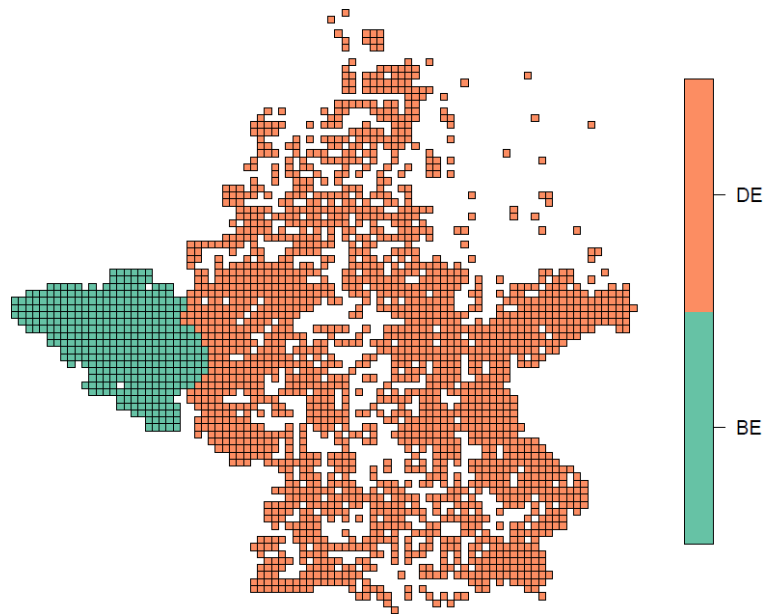
- Target value:
  - Indoor radon concentrations (European Atlas of Natural Radiation)
  - 10 x 10 km grid
  - Only groundfloor
  - Min 10 measurements per grid
- Predictors:
  - Outdoor radon (only available for DE and BE)
  - Radon flux maps
  - Geological and hydrological maps
  - Soil composition data (uranium, thorium, etc.)
  - Weather data



# Outdoor radon and radon flux for radon mapping

## Training – Test set split

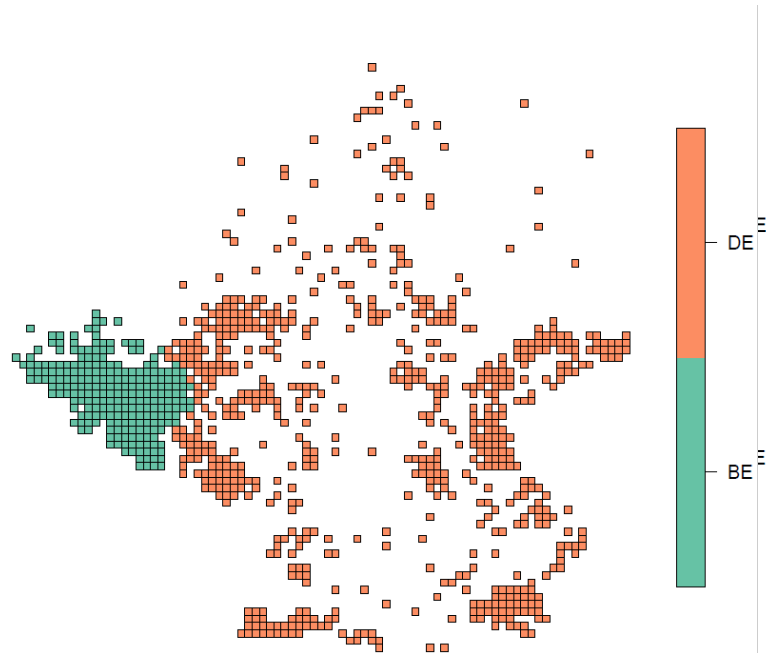
- Indoor radon concentrations (our target value) show spatial autocorrelation and different national radon survey designs
- To avoid autocorrelation when testing the performance of our model we split training (DE) and test data (BE) by countries
- Doing so we also test if models developed in one country can be used for other countries
- The training data is used to build the model
- The test data is only used for performance evaluation



# Outdoor radon and radon flux for radon mapping

## Training – Test set split

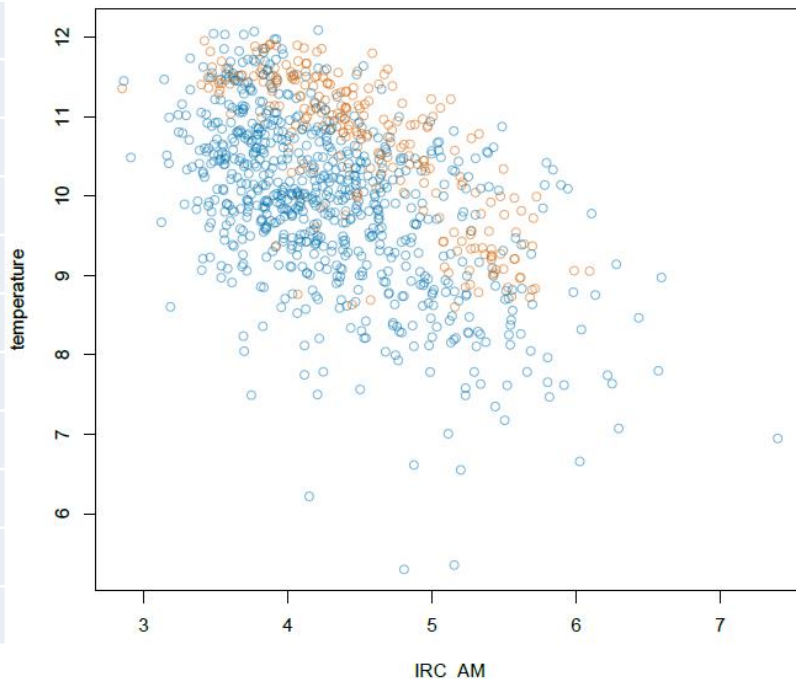
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- The training data is used to build the model
- The test data only for performance evaluation
- 979 grid cells with complete information (min 10 IRC observations)



# Outdoor radon and radon flux for radon mapping

## Pairwise Correlations of IRC and predictors – Examples

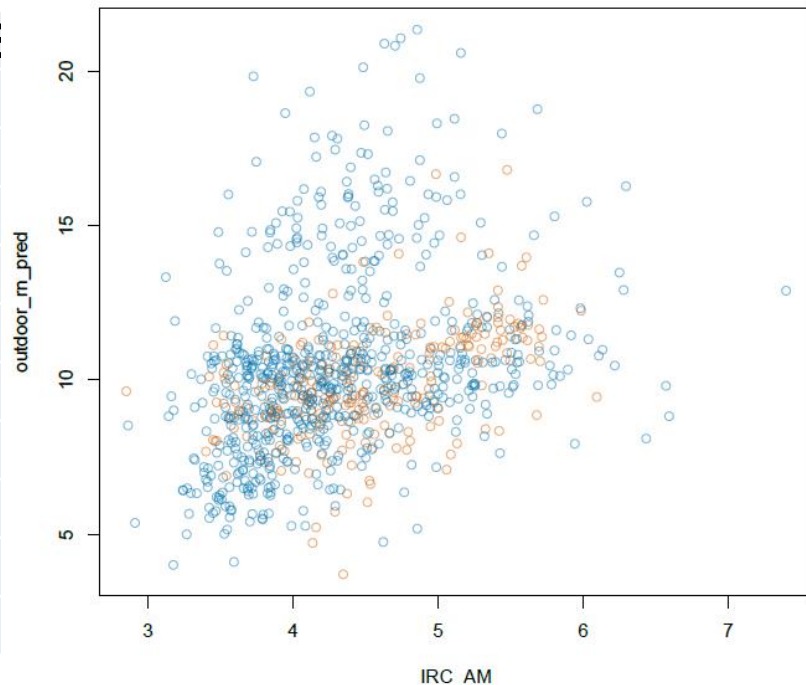
Predictor	rho	rho BE	rho DE
Elevation	<b>0,50</b>	<b>0,80</b>	<b>0,53</b>
Temperature	<b>-0,46</b>	<b>-0,78</b>	<b>-0,50</b>
Outdoor radon	<b>0,40</b>	<b>0,50</b>	<b>0,40</b>
Slope	<b>-0,40</b>	<b>-0,69</b>	<b>-0,41</b>
Thorium	<b>0,37</b>	<b>0,70</b>	<b>0,35</b>
Pressure	<b>0,30</b>	<b>0,72</b>	0,29
Uranium	0,29	-0,17	<b>0,49</b>
Wind speed	-0,20	<b>-0,48</b>	-0,18
Rn Flux GLDA	0,19	<b>-0,55</b>	<b>0,36</b>
Rn Flux ERA5	-0,04	<b>-0,65</b>	0,07



# Outdoor radon and radon flux for radon mapping

## Pairwise Correlations of IRC and predictors – Examples

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Thorium	<b>0,37</b>	<b>0,70</b>	<b>0,35</b>
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Uranium	0,29	-0,17	<b>0,49</b>
Wind speed	-0,20	<b>-0,48</b>	-0,18
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# Outdoor radon and radon flux for radon mapping

## Random forest models

- Non linear machine-learning technique
- Multiple decision trees are assembled to predict a target value

## Model Selection

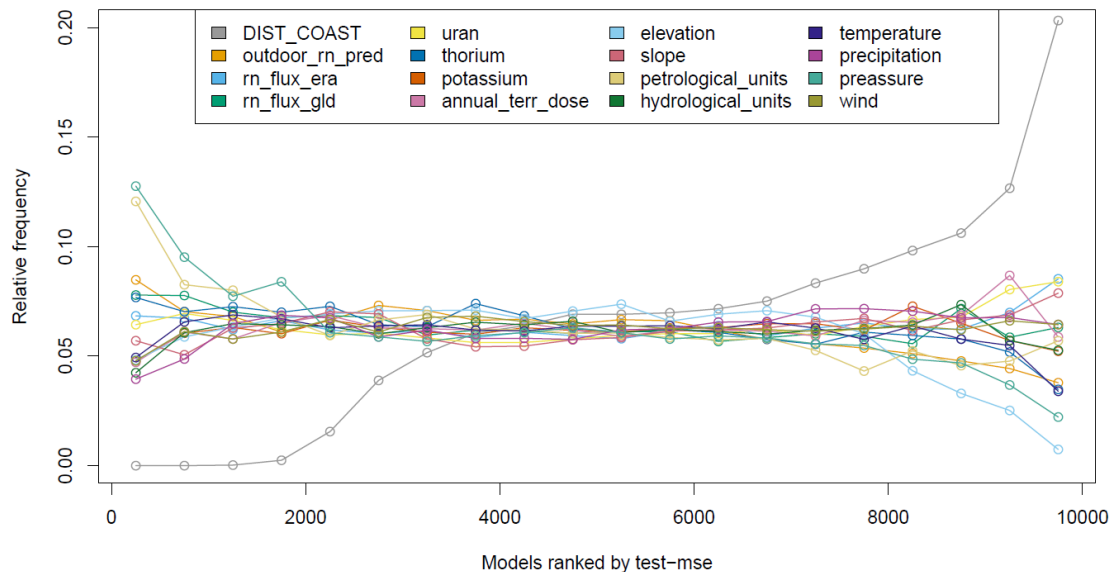
- Build 10.000 Models with different model parameters and predictors
- Calculate the mean squared error (MSE) of the predictions and true values on the test set (Belgium data)
- Rank the models by the MSE of the test set, and analyse which features are important



# Outdoor radon and radon flux for radon mapping

## Random forest – model selection

- The number of predictors and the selection have the highest impact of model performance
- **Very high** relative frequency: **Petrological units, preassure**
- **Above average** in the top ranked models: **outdoor radon, both radon fluxes, thorium, uranium**
- **Very low**: **distance to coast**

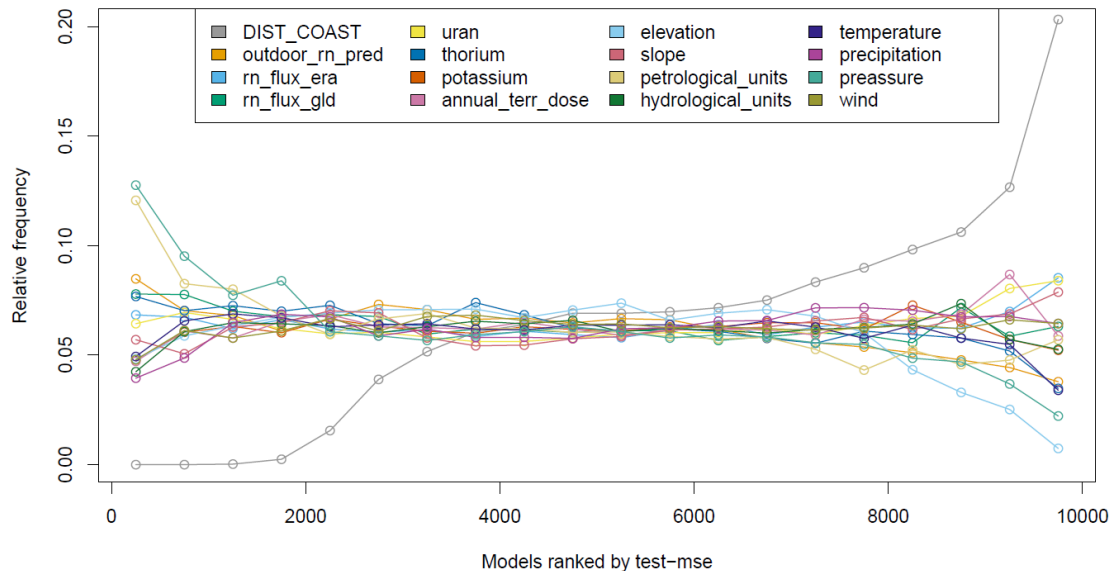


# Outdoor radon and radon flux for radon mapping

## Random forest – model selection

The best model uses the following six predictors:

- **outdoor radon**
- **radon flux (ERA5)**
- **thorium**
- **slope**
- **petrological units**
- **and pressure.**



# Outdoor radon and radon flux for radon mapping

## Objective:

Can outdoor radon and radon flux improve the prediction of areas with high radon potential?

## Result:

- Outdoor radon and radon flux can improve predictions and are included as predictors in the best model out of 10.000 models.
- Performance of the model was evaluated by the mean squared error of the test data (Belgium data)
- Still other predictors are essential: geological information, soil composition, terrain, weather data.

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[sebastian.baumann@ages.at](mailto:sebastian.baumann@ages.at)



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1101 0110 1100  
0101 0010 1101  
0001 0110 1110  
1101 0010 1101  
1111 1010 0000
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