

# Artificial Intelligence and Energy Poverty: Innovative Solutions

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#EPAHConf24

October 15<sup>th</sup>, 2024



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/ Introduction

## How can AI contribute ?

IA delivers tools which help in making decisions:

1. To assess the vulnerability in urban areas at high detail level
2. To support customized energy awareness services

# How do we assess energy poverty i urban areas?

- Through implementing a methodology based on AI that integrates:
  - Heterogenous and harmonised datasets in a common database
  - Weather modelling to upscale satellite resolution to microlocal
  - Energy performance modelling of the building stock
  - Key Performance Indicators (KPIs) of energy poverty at building level
  - Visualization of KPIs over a map web interface
  - A extreme events alarm app to address the most vulnerable buildings

/ Data

# Identification and ingestion of multiple data sets

The process identifies and manages more than 100 data sources and thousands of data sets

## Ingestion processes

Manually or periodically executed

Reading from webs, files, external databases or APIs

Implemented in Python scripts

## Harmonisation processes

All ingested datasets go through a transformation process to align them to the **data ontology**

Store the data to the databases

Implemented in Python and using RML.io functionalities.

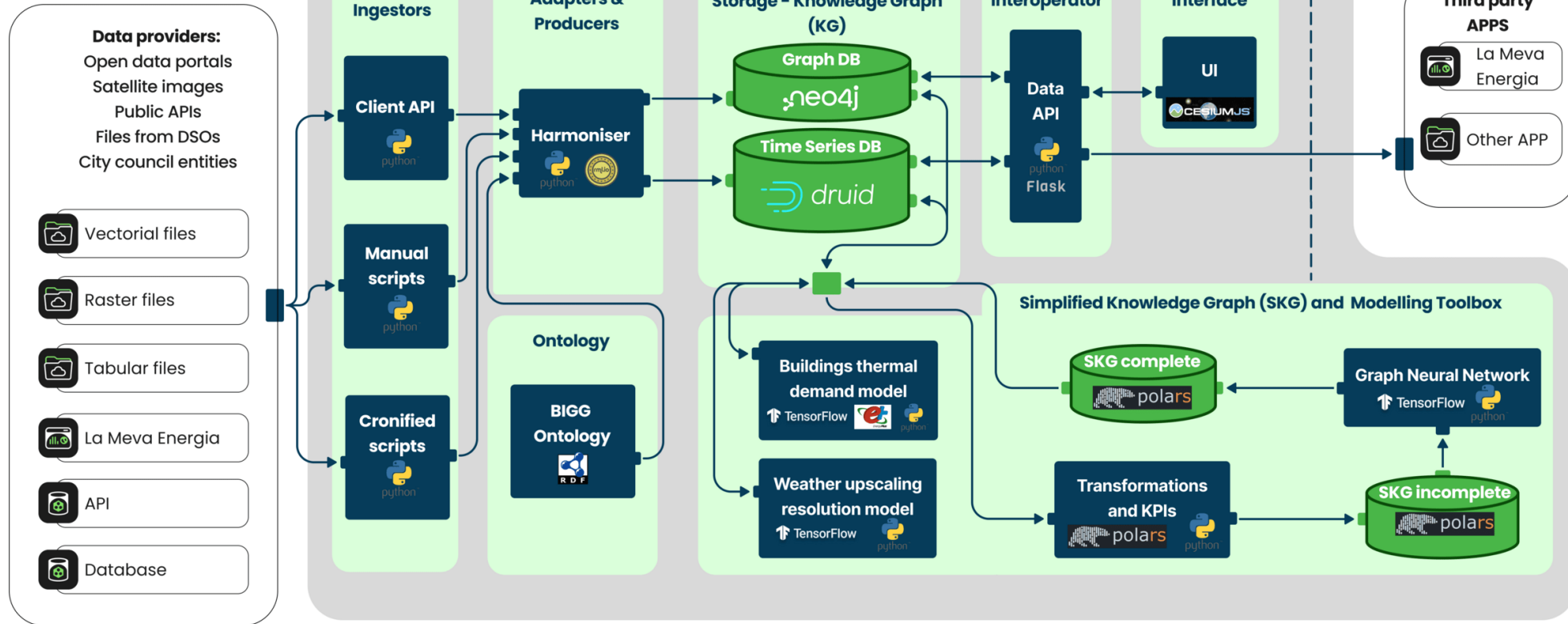
# / General architecture

## Data architecture



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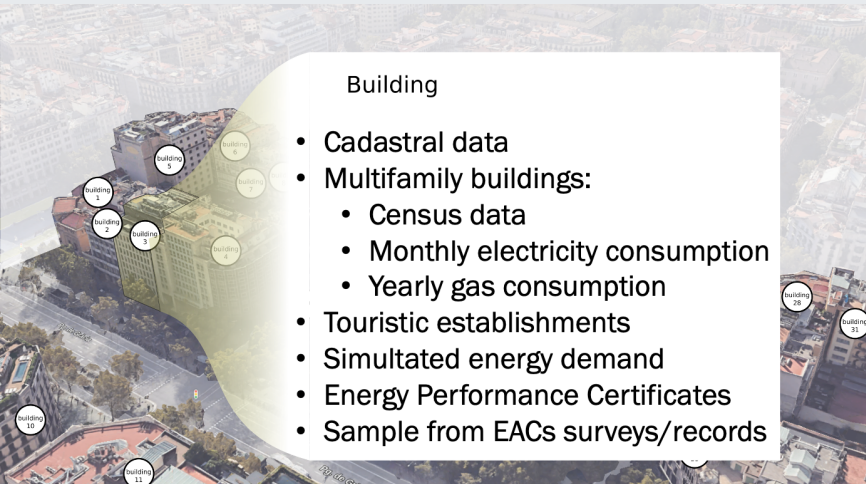
Data platform  
architecture





/ AI Application in practise

# General concept: Knowledge graph



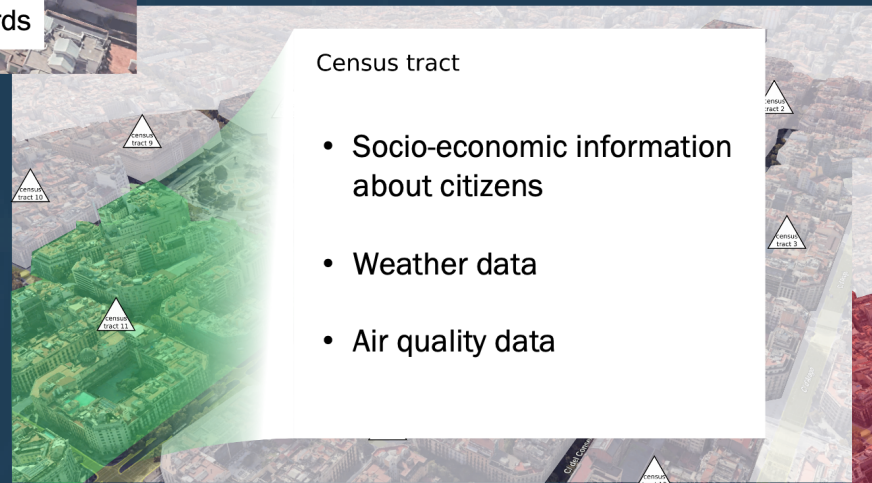
## Building

- Cadastral data
- Multifamily buildings:
  - Census data
  - Monthly electricity consumption
  - Yearly gas consumption
- Touristic establishments
- Simulated energy demand
- Energy Performance Certificates
- Sample from EACs surveys/records

## 1. Data at building level



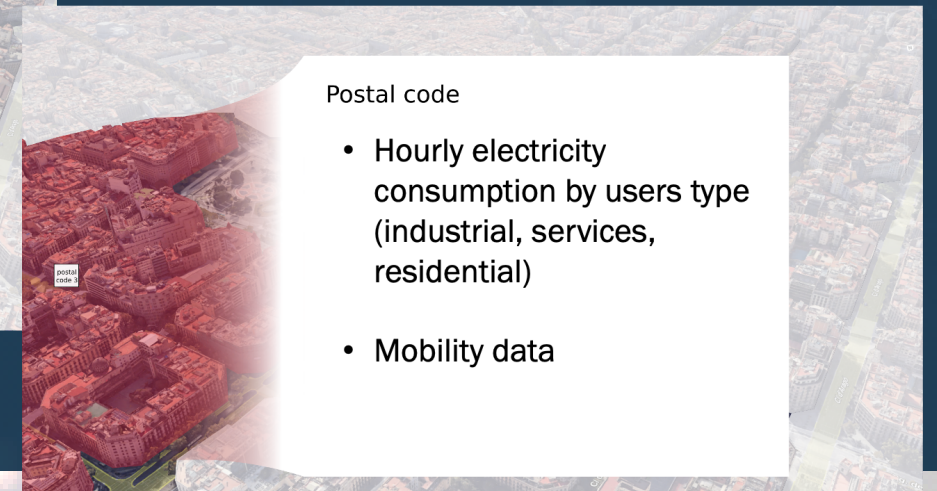
## 2. Data at census tract level



## Census tract

- Socio-economic information about citizens
- Weather data
- Air quality data

## 3. Data at postal code level

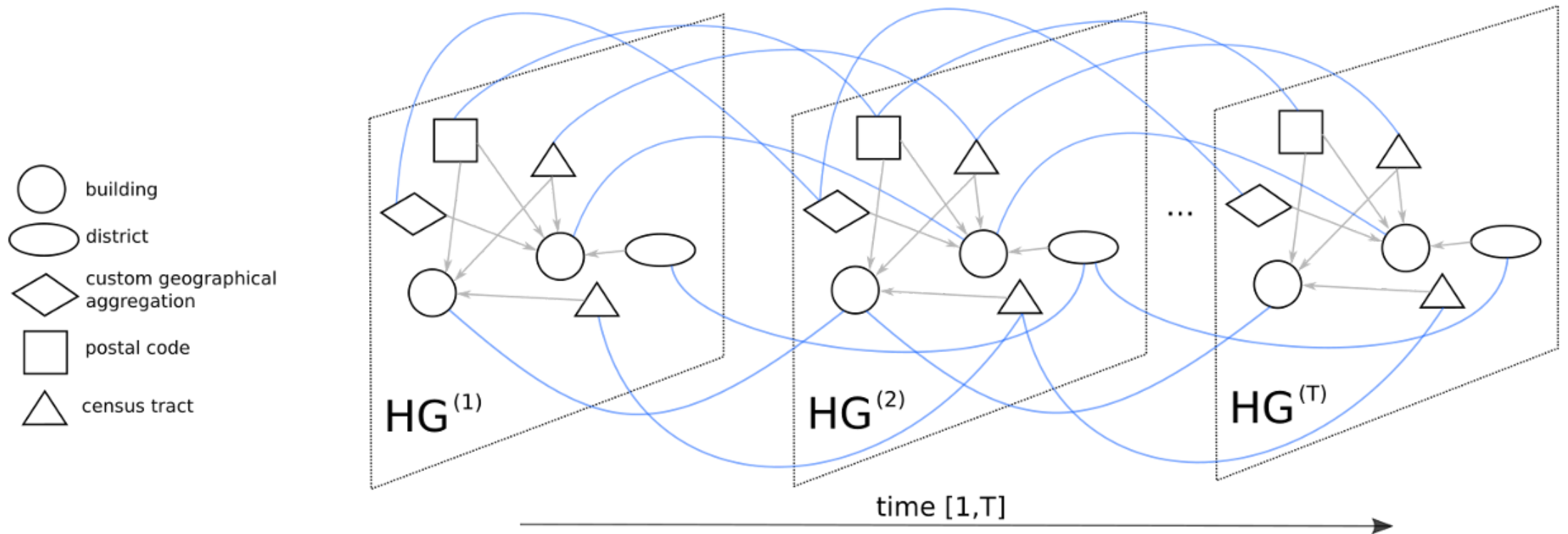


## Postal code

- Hourly electricity consumption by users type (industrial, services, residential)
- Mobility data

# General concept: Knowledge graph

## HTG (Heterogeneous Temporal Graph)





/ Modelling

# Multifaceted Models: Diverse Objectives

## Buildings Energy demand model

Simulation of the energy demand of buildings in the urban area, based on archetypes, construction types, local weather data and user behaviour patterns.

## Weather upscaling resolution model

Prediction model to upscale meteorological data from mesoscale to microscale.

## Graph Neural Network

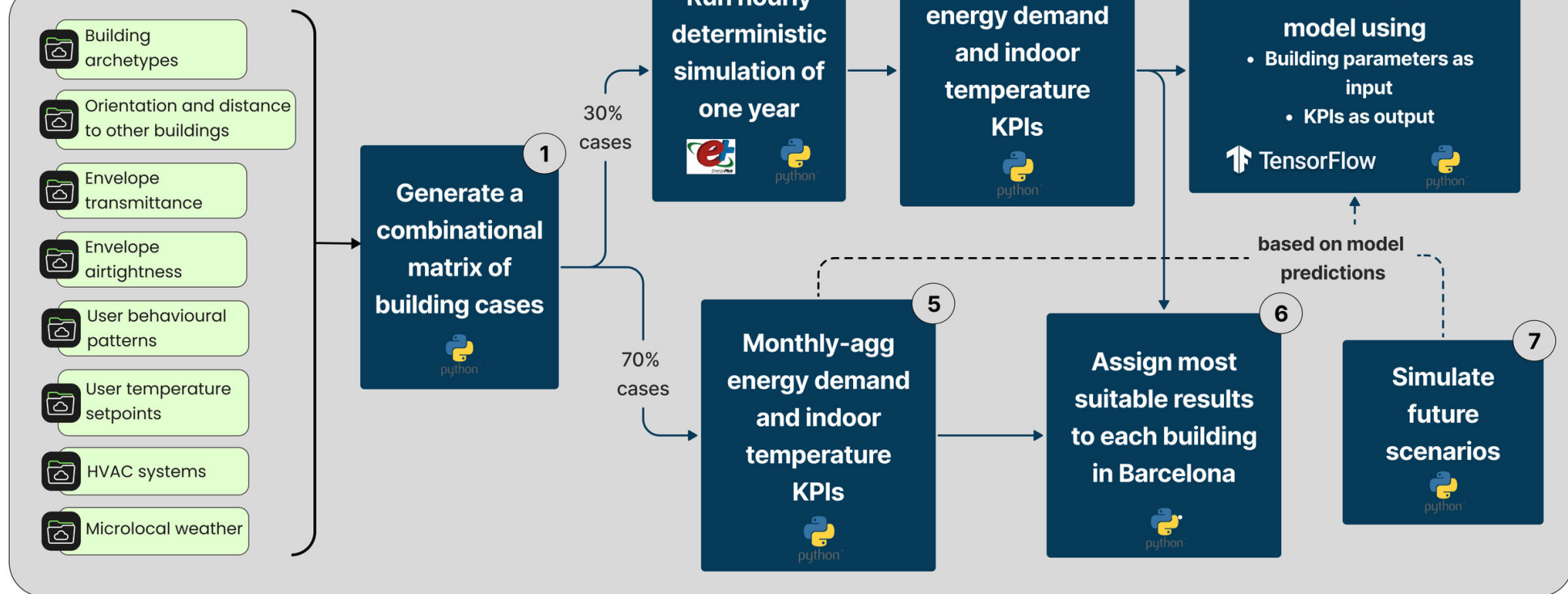
General model to predict indicators at building level based on real measurements, location of buildings and their relation among several aggregation layers.

/ Modelling

# Building's energy demand modelling



Thermal demand energy model



/ Modelling

# Weather upscaling modelling



Weather upscaling model

## Training datasets

MeteoGalia WRF 96h-horizon historical forecasts from 2008 to 2017

Cadaster

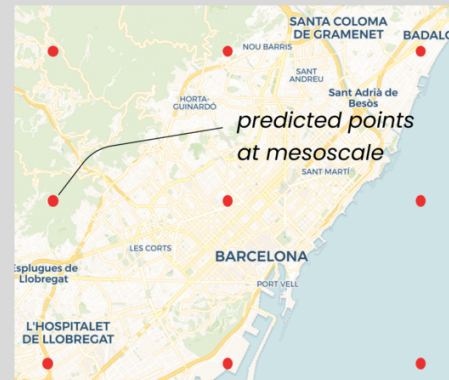
Vegetation index (NDVI) raster

Digital Terrain Model

Land cover map

## Daily WRF 96h-horizon forecasts

- Air temperature
- Relative humidity



## Static indicators over a 100x100m grid

- Total built volume
- % area dedicated to every land cover typology
- Average height over sea level
- % of each type of vegetation indexes

## INPUT

Resolution: ~8km

Weather upscaling resolution model

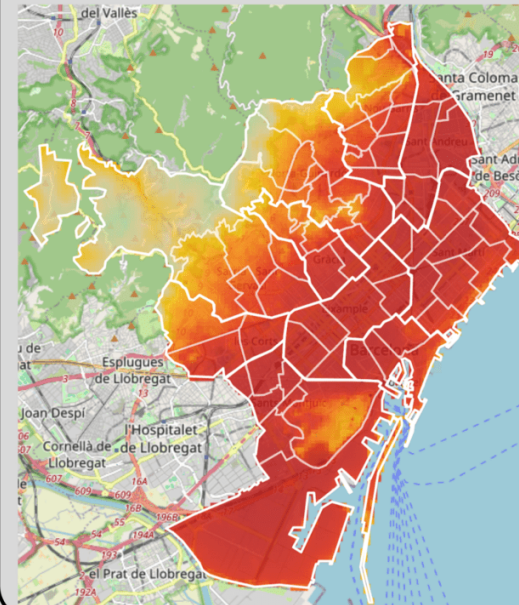
TensorFlow python

## OUTPUT

Resolution: 100m

## Upscaled daily WRF 96h-horizon forecasts

- Air temperature
- Relative humidity



## Training dataset

Climate variables for cities in Europe from 2008 to 2017 based on UrbClim model

## How do we support customized user awareness?

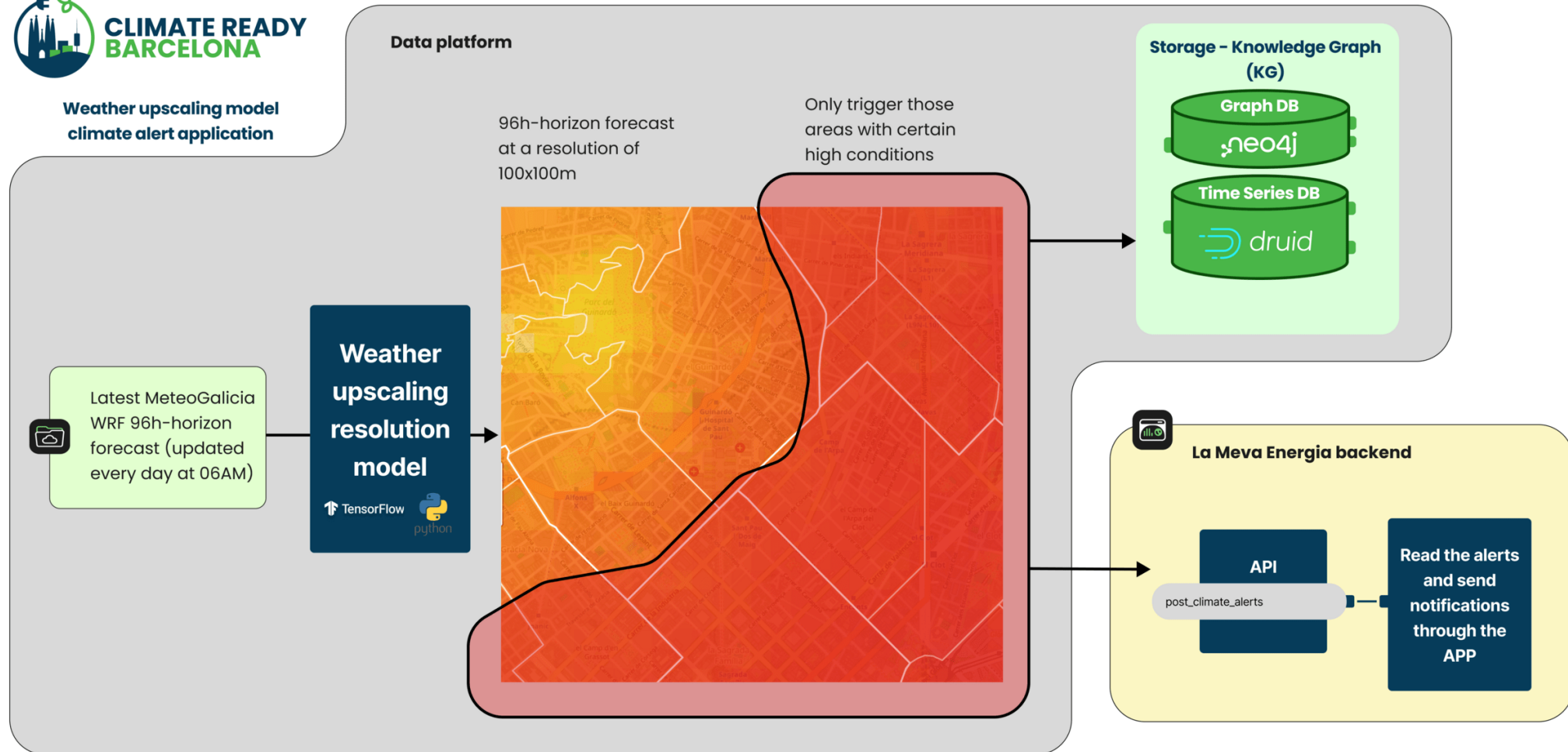
- Through a near-real-time interaction with the App "La meva Energia":
  - By providing specific information about the building quality of the user
  - By setting up an alarm system addressing extreme weather events (heat waves)

/ Modelling

# Alarms for extreme weather events



Weather upscaling model  
climate alert application



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**Thanks for your attention**

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