
LCZ and air temperature analysis with QGIS

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This tutorial will focus on the use of [Copernicus](#) data for assessing local differences in air temperature according to land-use features within highly urbanized areas.

Through a computer exercise, you will analyse the case of [Milan](#) (Italy) using air temperature data from the [Copernicus Climate Change Service \(C3S\)](#) and the [Local Climate Zones \(LCZ\)](#) map of the city, derived from [Sentinel-2](#) imagery.

You will learn how to access and download [C3S data](#) and how to process them in [QGIS](#)  to obtain a quantitative insight into the LCZ influence on air temperature. The question you are going to answer with this exercise is “*Can we observe and quantify differences in the average air temperature within different LCZ of a city?*”

Important: Basic knowledge of QGIS and raster data analysis is required. Before starting, you have to [install QGIS 3.10](#) (or higher) on your machine and [create a personal account](#) to access C3S data.

Copernicus Climate Change Service

The [Copernicus Climate Change Service \(C3S\)](#) “has been designed to respond to environmental and societal challenges associated with climate change”.

The C3S aims at combining expertise from across Europe by providing key indicators on climate change drivers and impacts to support the [European climate change policy](#). The C3S leverages a systematical use of in-situ and satellite-based observations, combined with climate models, to generate these indicators. The C3S web portal further open access to climate datasets, information and news¹.

1.1 Climate Data Store

The [Climate Data Store \(CDS\)](#) is one of the component of the C3S web portal and provides access to the geophysical information needed to analyse the Climate Change Indicators in a consistent, scientific manner. Users can [register for free](#) to obtain access to the CDS and its Toolbox.

The CDS provides:

- estimates of essential climate variables, climate indicators, and relevant information
- near-real time climate monitoring facility
- access to multi-model seasonal forecasts
- climate projections at global and regional scales
- access to research computing facilities
- data processing and visualisation tools

Note: In the hands-on exercise, you will download air temperature data from the CDS for the city of Milan and you will learn how to manipulate them in QGIS.

¹ Thépaut, J. N., Dee, D., Engelen, R., & Pinty, B. (2018). The Copernicus Programme and its Climate Change Service. In: *IEEE International Geoscience and Remote Sensing Symposium 2018*, 1591-1593.

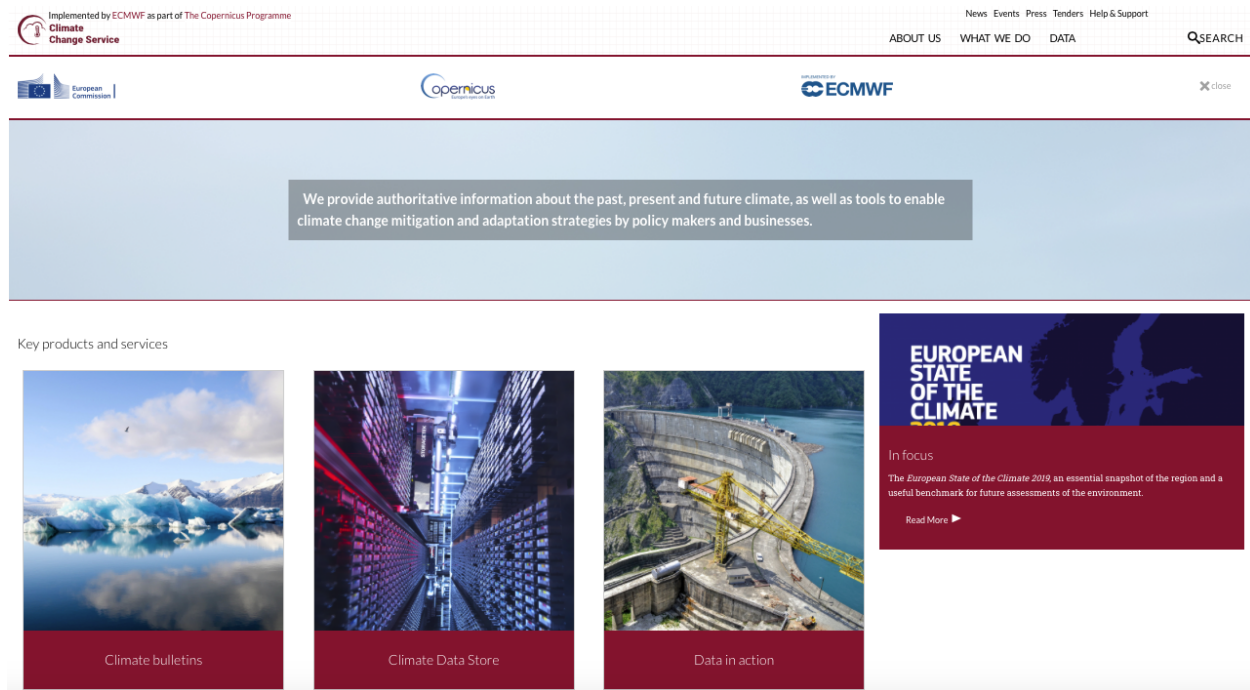


Fig. 1: C3S web portal (<https://climate.copernicus.eu>)

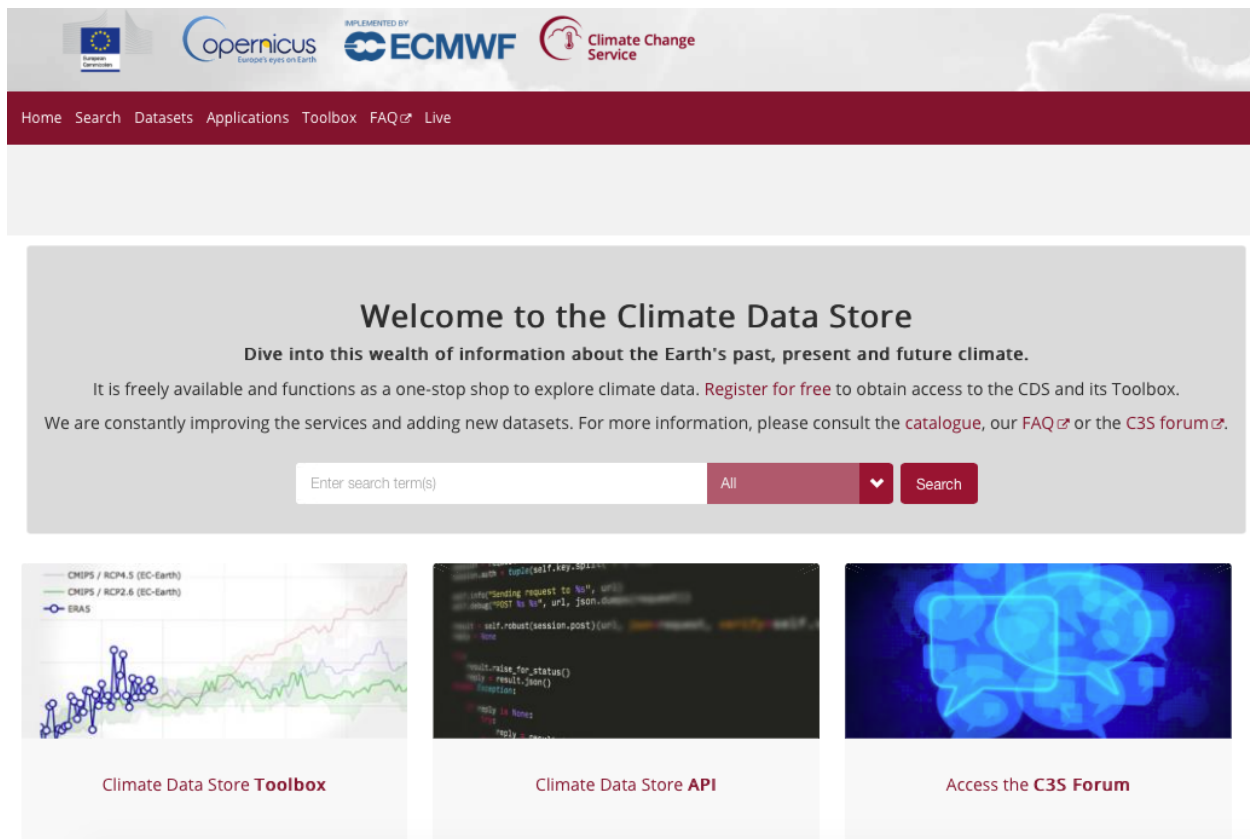


Fig. 2: C3S Climate Data Store (<https://cds.climate.copernicus.eu/#!/home>)

CHAPTER 2

Local Climate Zones

Local Climate Zones (LCZ) is a particular land-use classification framework to describes urban surfaces structure and cover with consistency and comparability across cities, supporting applications in studies of urban heat waves, sustainable urbanization and urban energy balance². The LCZ classification scheme³ and instructions are accessible through the [World Urban Database and Access Portal Tools \(WUDAPT\)](#) project web portal.

Note: In the hands-on exercise, you will use an already available LCZ map of Milan. The analytical procedure to derive LCZ maps from optical satellite imagery is out of scope for this tutorial.

² Stewart, I. D., & Oke, T. R. (2012). *Local climate zones for urban temperature studies*. *Bulletin of the American Meteorological Society*, 93(12), 1879-1900.

³ Bechtel, B., Alexander, P. J., Böhner, J., Ching, J., Conrad, O., Feddema, J., ... & Stewart, I. (2015). *Mapping local climate zones for a worldwide database of the form and function of cities*. *ISPRS International Journal of Geo-Information*, 4(1), 199-219.






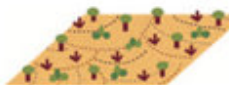






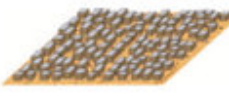




Built types	Definition	Land cover types	Definition
1. Compact high-rise 	Dense mix of tall buildings to tens of stories. Few or no trees. Land cover mostly paved. Concrete, steel, stone, and glass construction materials.	A. Dense trees 	Heavily wooded landscape of deciduous and/or evergreen trees. Land cover mostly pervious (low plants). Zone function is natural forest, tree cultivation, or urban park.
2. Compact midrise 	Dense mix of midrise buildings (3–9 stories). Few or no trees. Land cover mostly paved. Stone, brick, tile, and concrete construction materials.	B. Scattered trees 	Lightly wooded landscape of deciduous and/or evergreen trees. Land cover mostly pervious (low plants). Zone function is natural forest, tree cultivation, or urban park.
3. Compact low-rise 	Dense mix of low-rise buildings (1–3 stories). Few or no trees. Land cover mostly paved. Stone, brick, tile, and concrete construction materials.	C. Bush, scrub 	Open arrangement of bushes, shrubs, and short, woody trees. Land cover mostly pervious (bare soil or sand). Zone function is natural scrubland or agriculture.
4. Open high-rise 	Open arrangement of tall buildings to tens of stories. Abundance of pervious land cover (low plants, scattered trees). Concrete, steel, stone, and glass construction materials.	D. Low plants 	Featureless landscape of grass or herbaceous plants/crops. Few or no trees. Zone function is natural grassland, agriculture, or urban park.
5. Open midrise 	Open arrangement of midrise buildings (3–9 stories). Abundance of pervious land cover (low plants, scattered trees). Concrete, steel, stone, and glass construction materials.	E. Bare rock or paved 	Featureless landscape of rock or paved cover. Few or no trees or plants. Zone function is natural desert (rock) or urban transportation.
6. Open low-rise 	Open arrangement of low-rise buildings (1–3 stories). Abundance of pervious land cover (low plants, scattered trees). Wood, brick, stone, tile, and concrete construction materials.	F. Bare soil or sand 	Featureless landscape of soil or sand cover. Few or no trees or plants. Zone function is natural desert or agriculture.
7. Lightweight low-rise 	Dense mix of single-story buildings. Few or no trees. Land cover mostly hard-packed. Lightweight construction materials (e.g., wood, thatch, corrugated metal).	G. Water 	Large, open water bodies such as seas and lakes, or small bodies such as rivers, reservoirs, and lagoons.
8. Large low-rise 	Open arrangement of large low-rise buildings (1–3 stories). Few or no trees. Land cover mostly paved. Steel, concrete, metal, and stone construction materials.	VARIABLE LAND COVER PROPERTIES	
9. Sparsely built 	Sparse arrangement of small or medium-sized buildings in a natural setting. Abundance of pervious land cover (low plants, scattered trees).	Variable or ephemeral land cover properties that change significantly with synoptic weather patterns, agricultural practices, and/or seasonal cycles.	
10. Heavy industry 	Low-rise and midrise industrial structures (towers, tanks, stacks). Few or no trees. Land cover mostly paved or hard-packed. Metal, steel, and concrete construction materials.	b. bare trees	Leafless deciduous trees (e.g., winter). Increased sky view factor. Reduced albedo.
		s. snow cover	Snow cover >10 cm in depth. Low admittance. High albedo.
		d. dry ground	Parched soil. Low admittance. Large Bowen ratio. Increased albedo.
		w. wet ground	Waterlogged soil. High admittance. Small Bowen ratio. Reduced albedo.

Fig. 1: Local Climate Zone scheme

Hands-on Exercise with QGIS

Now that you are aware of all the necessary background information, it is time to do work with the Milan case study. To assess differences in the average air temperature within different LCZ, you will perform the following steps:

- download in your home folder the raw air temperature data from the [C3S CDS](#) in [netCDF](#) format and the LCZ map for Milan.
- open and manipulate the netCDF in QGIS to obtain an analysis-ready raster layer containing the average air temperature for a given time period.
- open the LCZ map in QGIS and perform raster layer zonal statistics to compute the average air temperature within each LCZ class
- plot and compare the averages using statistical graphs

3.1 Materials

Data specification and software tools that you will use for the analysis are reported below.

3.1.1 LCZ map

The LCZ raster map of Milan you will use in the exercise has been derived by⁴ and⁵ from a Sentinel-2 image acquired in summer 2016. The map includes the subset of LCZ characterizing the Milan area. Some of the contiguous classes have been aggregated (as shown in the table below) with the purpose of obtaining zones with marked differences in the urban land-use features thus easing their comparison in terms of air temperature. In practice, contiguous LCZ classes may be more easily confused during the classification procedure and, in turn, differences in their contributions to air temperature may be biased or difficult to distinguish.

⁴ Loftian, M. (2016). *Urban climate modeling: case study of Milan city*. Politecnico di Milano (M.Sc. dissertation).

⁵ Oxoli, D., Ronchetti, G., Minghini, M., Molinari, M. E., Loftian, M., Sona, G., & Brovelli, M. A. (2018). Measuring urban land cover influence on air temperature through multiple geo-data—The case of Milan, Italy. *ISPRS International Journal of Geo-Information*, 7(11), 421.

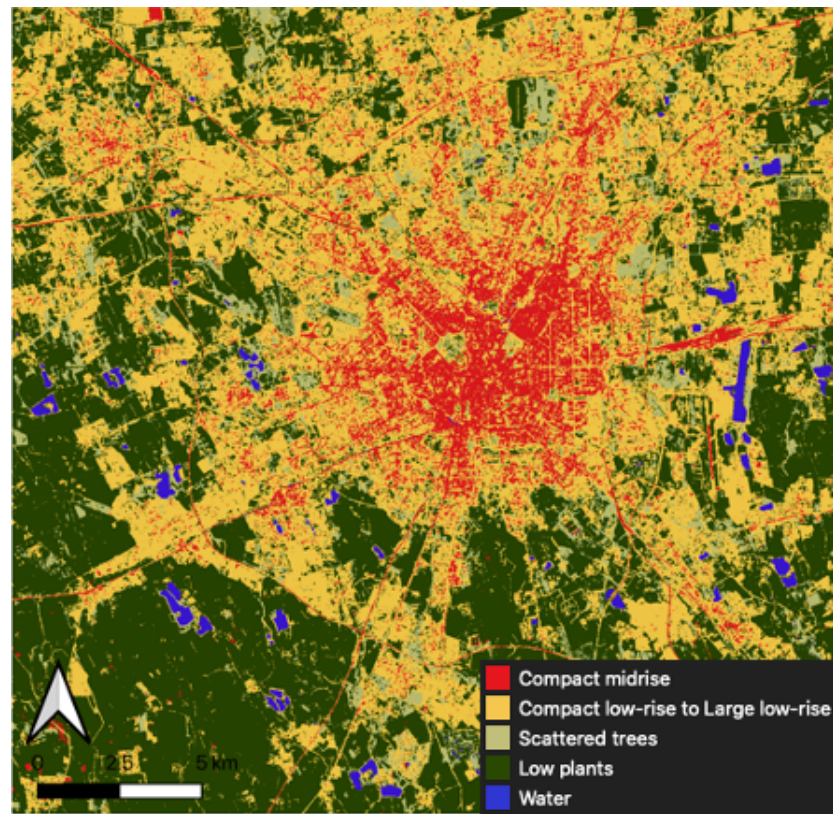


Fig. 1: LCZ map of Milan

Raster Value	Description
1	Compact midrise
2	Compact low-rise, Open midrise, Open low-rise, Large low-rise
3	Scattered trees
4	Low plants
5	Water

The LCZ map of Milan (*s2_lcz_milan.tif*) (*reference system: WGS84/UTM32N | EPSG:32632*) in **GeoTIFF** format together with its predefined **QGIS Style File** (*s2_lcz_milan.qml*) can be download [here](#).

Tip: Keep in the same folder both the raster map and its predefined QGIS style file to allow QGIS to automatically style the map when imported in a project.

3.1.2 Air temperature data

Air temperature data at a city level are included in the **Climate variables for cities in Europe from 2008 to 2017** of the C3S CDS, which contains air temperature, specific humidity, relative humidity and wind speed for 100 European cities for the current climate. The variables are provided as netCDF files with an hourly temporal resolution on a 100m x 100 m spatial grid (*reference system: ETRS89/LAEA Europe | EPSG: 3035*).

Climate variables for cities in Europe from 2008 to 2017

Overview Download data Documentation

The dataset contains air temperature, specific humidity, relative humidity and wind speed for 100 European cities for the current climate.

The data were generated using the urban climate model UrbClim, developed at VITO. This model was designed to simulate and study the urban heat island effect (UHI) and other urban climate variables at a spatial resolution of 100 metres. The unique capabilities of UrbClim allow to generate spatially explicit timeseries of hourly variables from which a variety of indicators can be retrieved in postprocessing at the scale of a city neighbourhood.

For this specific dataset, the ERA5 reanalysis large-scale weather conditions are downscaled to agglomeration-scale. UrbClim then computes the impact of urban development on the most frequent weather parameters, such as temperature and humidity.

The 100 European cities for the urban simulations were selected based on user requirements within the health community. Furthermore, a high spatial distribution was aimed with specific focus on Eastern European countries that often lack access to relevant information.

The data was produced on behalf of the Copernicus Climate Change Service.

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Licence

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Publication date

2019-12-04

Fig. 2: Climate variables for cities in Europe from 2008 to 2017 (<https://cds.climate.copernicus.eu/cdsapp#!/dataset/sis-urban-climate-cities>)

After **register and login** to the C3S CDS web portal, you have to download Milan data by specifying the variable of interest together with a time period (year and month). The selected data can be then downloaded as a *.zip* or *.tar* file. For this exercise you have to specify the following options before the download:

- Variable = *Air temperature*
- City = *Milan*
- Year = *2016*
- Month = *July*
- Format = *Zip file (.zip)*

OverviewDownload dataDocumentation

Variable

☒ Air temperature
 ☐ Wind speed
 ☐ Specific humidity
 ☐ Relative humidity
 ☐ Rural/urban mask
 ☐ Land-sea mask

Clear all

City

☐ Alicante
 ☐ Amsterdam
 ☐ Antwerp
 ☐ Athens
 ☐ Barcelona
 ☐ Bari

☐ Basel
 ☐ Berlin
 ☐ Bratislava
 ☐ Bilbao
 ☐ Birmingham
 ☐ Bologna

☐ Bordeaux
 ☐ Brno
 ☐ Brussels
 ☐ Bucharest
 ☐ Budapest
 ☐ Cagliari

☐ Cagliari
 ☐ Cologne
 ☐ Copenhagen
 ☐ Debrecen
 ☐ Dublin
 ☐ Dusseldorf

☐ Edinburgh
 ☐ Frankfurt
 ☐ Geneva
 ☐ Gyor
 ☐ Hamburg
 ☐ Genoa

☐ Ghent
 ☐ Glasgow
 ☐ Graz
 ☐ Innsbruck
 ☐ Leipzig
 ☐ London

☐ Helsinki
 ☐ Hanoi
 ☐ Hong Kong
 ☐ Istanbul
 ☐ Kyoto
 ☐ Ljubljana

☐ Liège
 ☐ Lille
 ☐ Linz
 ☐ Lyon
 ☐ Madrid
 ☐ Manila

☐ Luxembourg
 ☐ Lyons
 ☐ Maastricht
 ☐ Milan
 ☐ Marseille
 ☐ Mexico City

☐ Mikolaj
 ☐ Monaco
 ☐ Montpellier
 ☐ Munich
 ☐ Naples
 ☐ Nantes

☐ Newcastle
 ☐ Nice
 ☐ Novi Sad
 ☐ Oslo
 ☐ Padova
 ☐ Palermo

☐ Palma de Mallorca
 ☐ Paris
 ☐ Pecs
 ☐ Podgorica
 ☐ Porto
 ☐ Prague

☐ Reykjavik
 ☐ Rome
 ☐ Rotterdam
 ☐ Sarajevo
 ☐ Seville
 ☐ Skopje

☐ Rijeka
 ☐ Sofia
 ☐ Split
 ☐ Stockholm
 ☐ Strasbourg
 ☐ Tallinn

☐ Turin
 ☐ Utrecht
 ☐ Valencia
 ☐ Vienna
 ☐ Vilnius
 ☐ Warsaw

☐ Wrocław
 ☐ Zagreb
 ☐ Zurich

Select allClear all

Year

☐ 2008
 ☐ 2009
 ☒ 2010
 ☐ 2011
 ☐ 2012
 ☐ 2013
 ☐ 2014
 ☐ 2015
 ☐ 2016

Select allClear all

Month

☐ January
 ☐ February
 ☐ March
 ☐ April
 ☐ May
 ☐ June
 ☒ July
 ☐ August
 ☐ September
 ☐ October
 ☐ November
 ☐ December

Select allClear all

Format

☒ Zip file (.zip)
 ☐ Compressed tar file (.tar.gz)

Clear all

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2019-12-04

Fig. 3: C3S CDS download page

The netCDF file is structured as a multidimensional spatial grid where each layer includes air temperature observations over Milan area at each time step (hour) in July 2016.

Note: The original name of the downloaded file should be “*tas_Milan_UrbClim_2016_07_v1.0.nc*”

3.1.3 Software tools

To perform the exercise you will use **QGIS**. However, advance raster processing functionalities are not directly

available within the QGIS core algorithms. To that end, you will use third-party algorithms from **GRASS GIS**



which are integrated into the **QGIS Processing Toolbox** and they can be run directly from the QGIS interface.



Tip: GRASS GIS Loading

If you don't see GRASS in the **Processing Toolbox**, verify in: **Settings → Options → Processing → Providers** if GRASS provider is activated. GRASS system paths should be already set up if using macOS or Windows.

3.2 Data Processing

3.2.1 netCDF preprocessing

- Open a new QGIS project and import as a raster layer (**Layer → Add Layer → Add Raster Layer**) the air temperature netCDF (*tas_Milan_UrbClim_2016_07_v1.0.nc*). The layer is imported as a multiband raster in

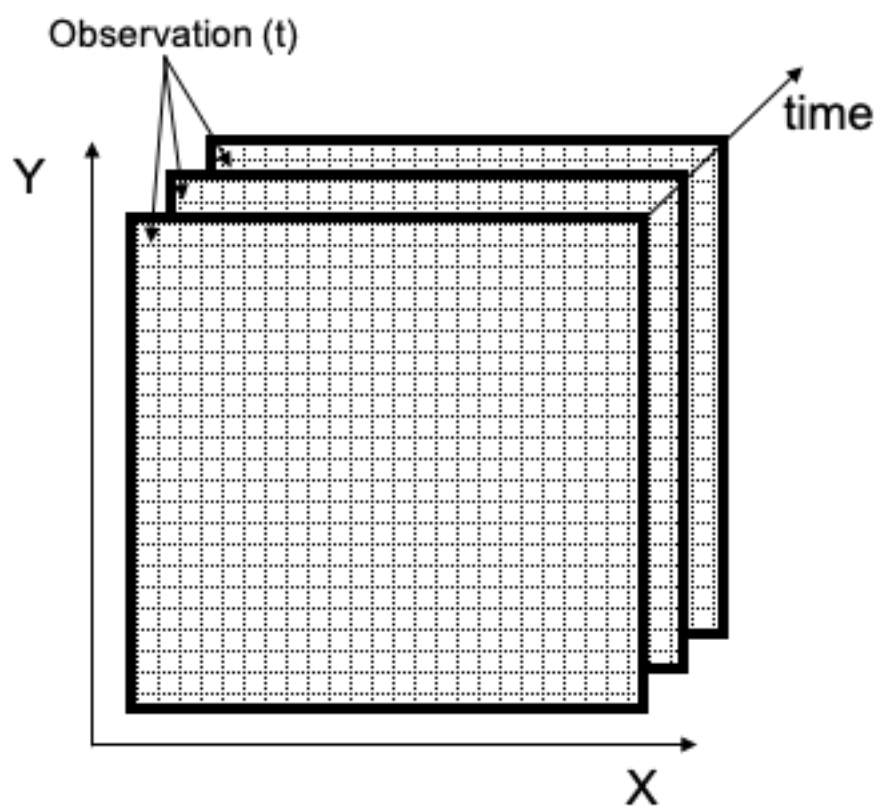
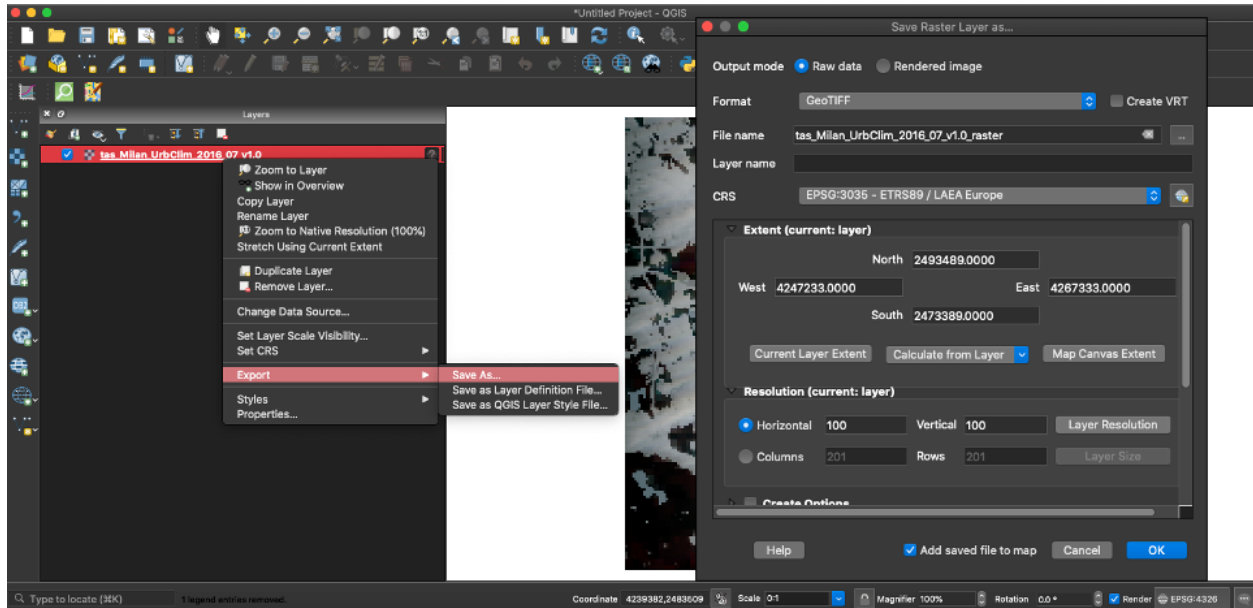


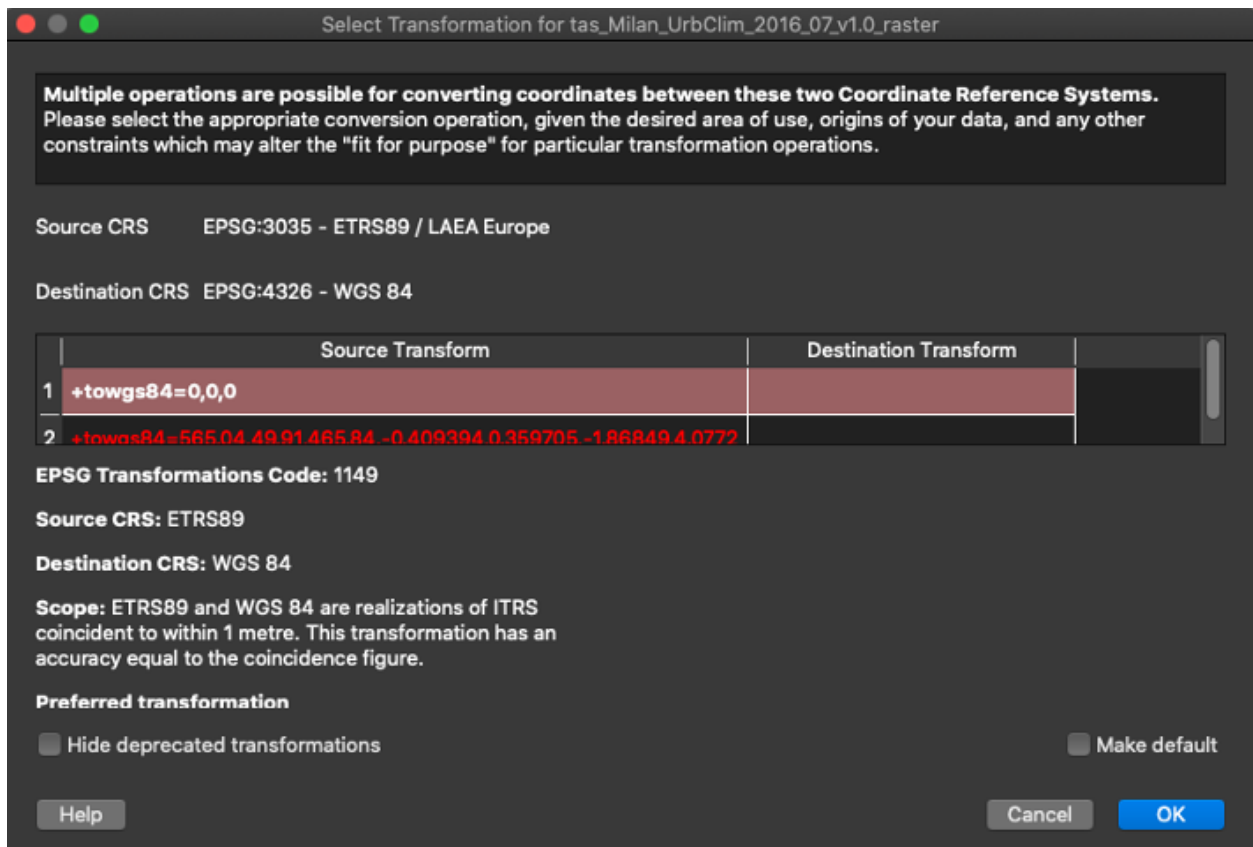
Fig. 4: Schematic of the netCDF structure

which each band contains the hourly observation of air temperature over Milan (n. of bands = 744). In the following steps, you will manipulate the raster file obtained from the netCDF by projecting it to *WGS84/UTM32N* | *EPSG:32632* and computing the averages of all bands.

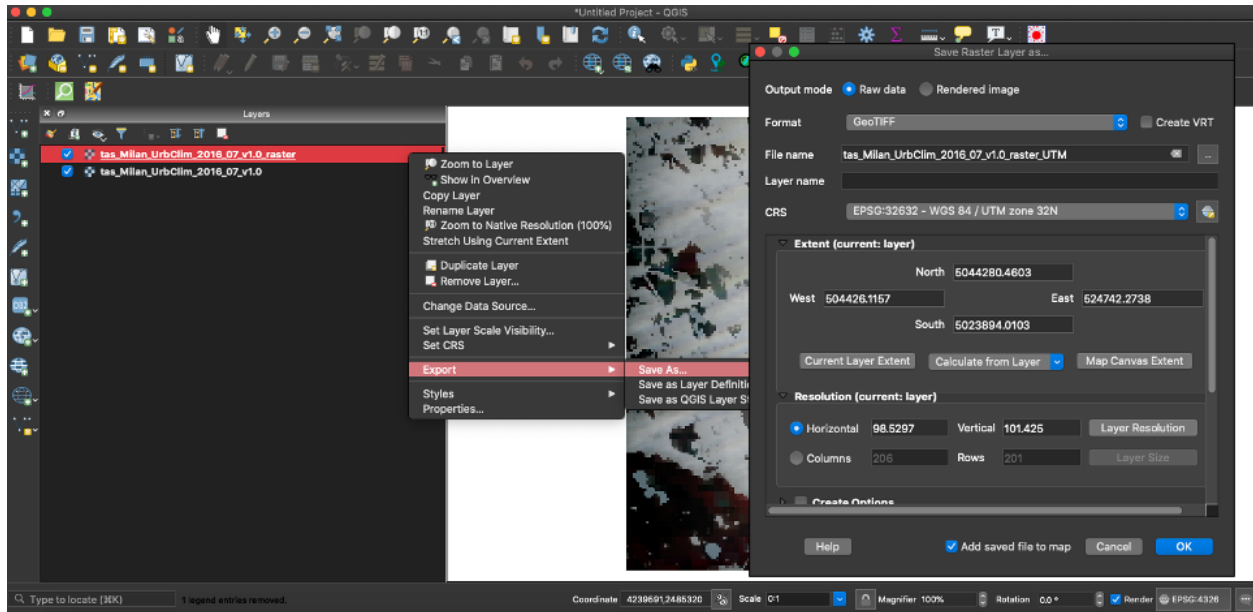
- Do **Right Click** on the layer name in the **QGIS Layer Panel** and then: **Export** → **Save As...** to save the layer in *GeoTIFF* format by assigning its native reference system (*ETRS89/LAEA Europe* | *EPSG: 3035*).



- Accept the default coordinates conversion procedure suggested by QGIS by clicking **Ok**.



- Create a second copy of the raster layer to assign the same projected reference system of the LCZ map (WGS84/UTM32N | EPSG:32632) by following the procedure explained in the previous step.



Tip: In case of issues with the presented procedure, you can directly [download the projected raster layer from the above step](#).

Now, you have obtained a multiband raster layer projected to the same reference system of the LCZ map. The last step consists of computing the average air temperature in July 2016 at each pixel of the grid.

- From the QGIS menu, open: **Processing** → **Toolbox** and search for the GRASS GIS algorithm `r.series` which allows making each output cell value a function (e.g. the average) of the values assigned to the corresponding cells in the input list of raster bands or layers.
- Run the algorithm on the projected multiband raster layer by specifying **Average** in the **Aggregate operation** tab to obtain the single-band raster of the average air temperature [K] for Milan in July 2016.

Warning: If you use QGIS on Windows, you have to set also the raster values range. In the `r.series` panel, open: **Advanced Parameters** → **Ignore values outside this range (lo,hi)**, set e.g. **Min = -1000** and **Max = 1000**.

Tip: Name the output file as `air_t_milan_average`. The period (“.”) in the original name of the netCDF file may not be accepted by GRASS GIS as part of the output file name. In case of issues with the presented procedure, you can directly [download the average air temperature raster](#).

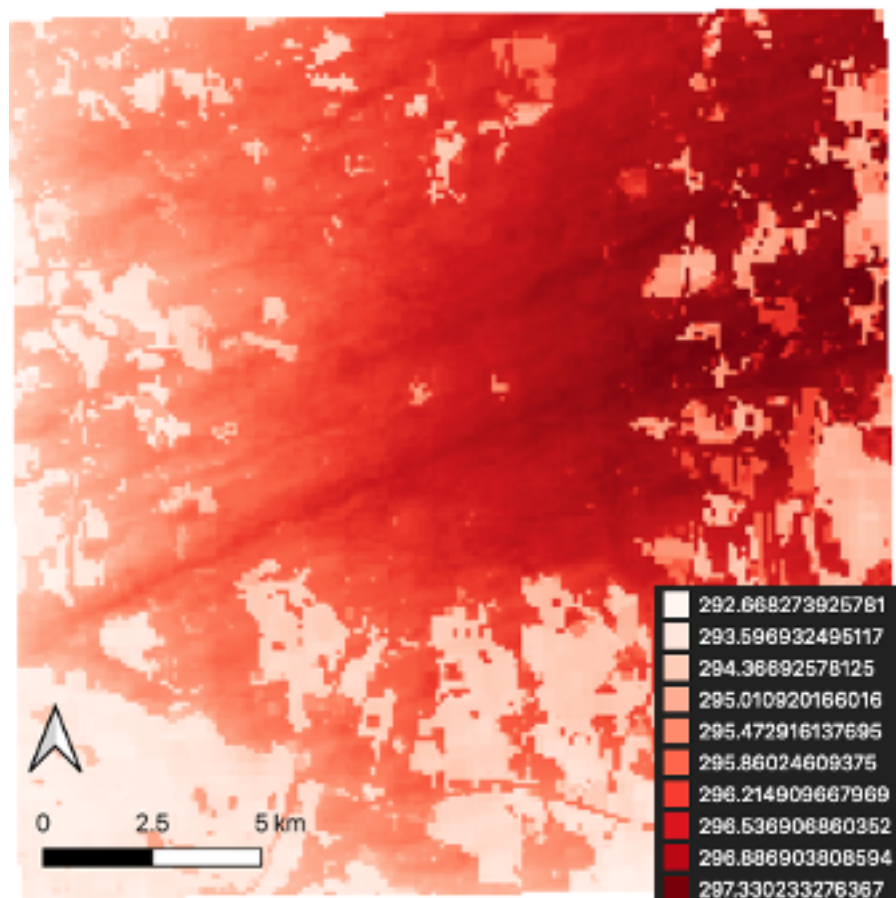
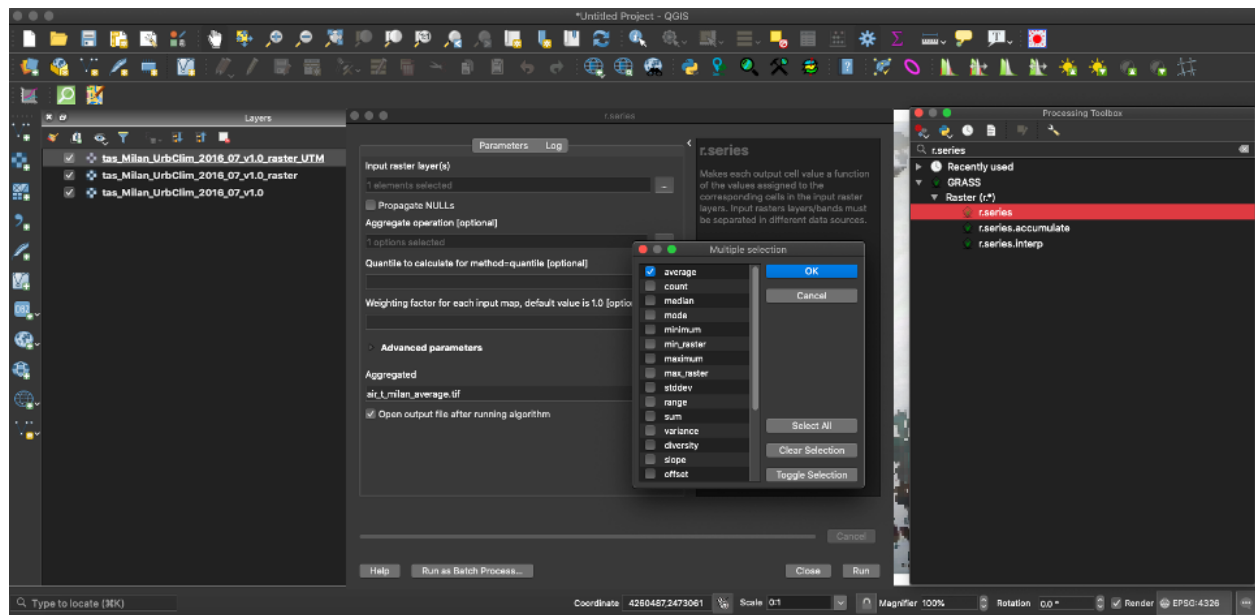
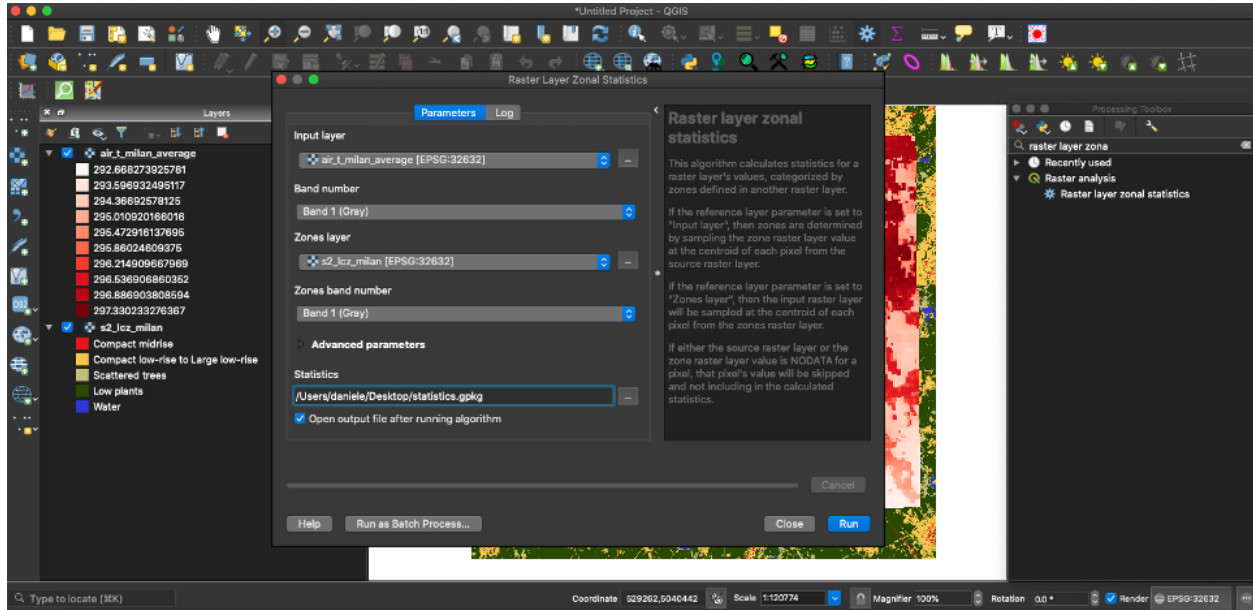


Fig. 5: Single band raster of the average air temperature [K] for Milan in July 2016

3.2.2 Raster zonal statistics

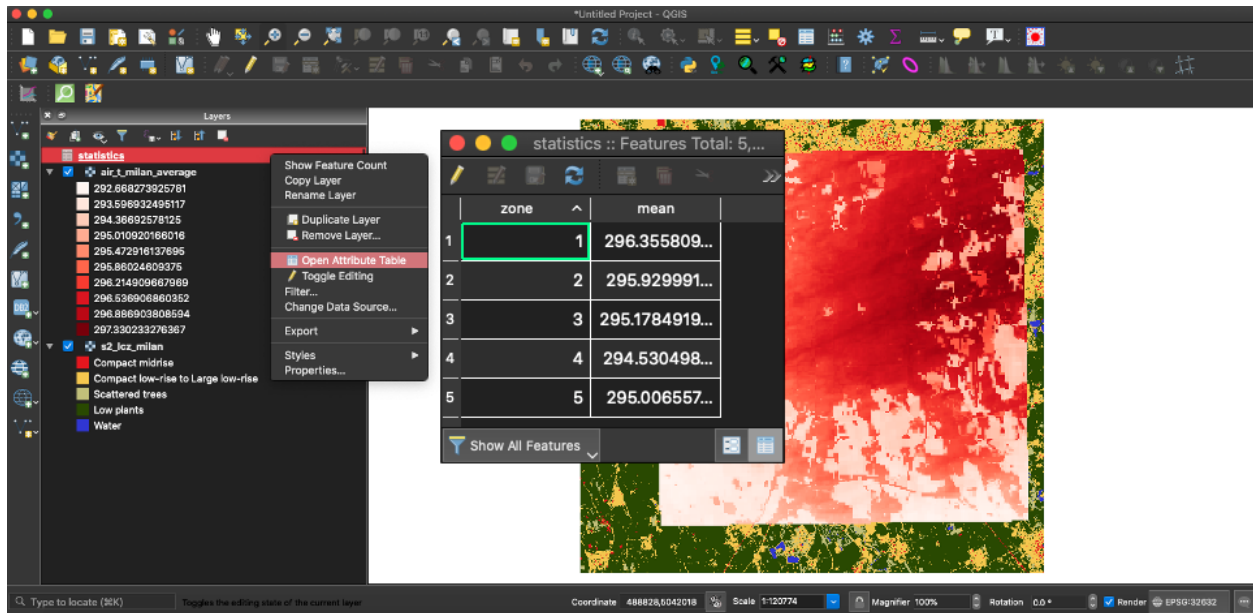
To assess differences in the average air temperature within different LCZ, you need to compute raster statistics by class using the single band raster of the average air temperature for Milan in July 2016 and the LCZ map.

- Open a new QGIS project and import the requested raster maps (*air_t_milan_average.tif* and *s2_lcz_milan.tif*).
- From the QGIS menu, open: **Processing** → **Toolbox** and search for the QGIS algorithm **Raster layer zonal statistics** which allows you computing statistics for a raster layer's values, categorized by zones defined in another raster layer. Specify as **Input layer** the average air temperature raster and as **Zones layer** the LCZ map. Save the output as a *Shapefile* or *GeoPackage* table.



Note: The output file contains the summary statistics by LCZ class computed for the average air temperature raster. No geometries are included in the output.”

- Open, explore and comment the output table by focusing on the columns *zone* (i.e. LCZ class) and *mean* (i.e. average air temperature).



3.3 Results

It is possible now to plot the resulting table using e.g. the [Data Plotly](#)  QGIS plugin. From the QGIS menu, open: **Plugin → Manage and Install Plugins**, search for **Data Plotly** plugin and install it.

The difference of average air temperature in each LCZ class can be appreciated e.g. by plotting the columns *zone* (X-axis) and *mean* (Y-axis) using a Scatter Plot.

Can we observe and quantify differences in the average air temperature within different LCZ of a city?

The answer is “Yes, we can measure these differences that are around 2 Kelvin degrees between heavily urbanized areas (1 = Compact midrise) and vegetated areas (4 = Low plants) for this case study”

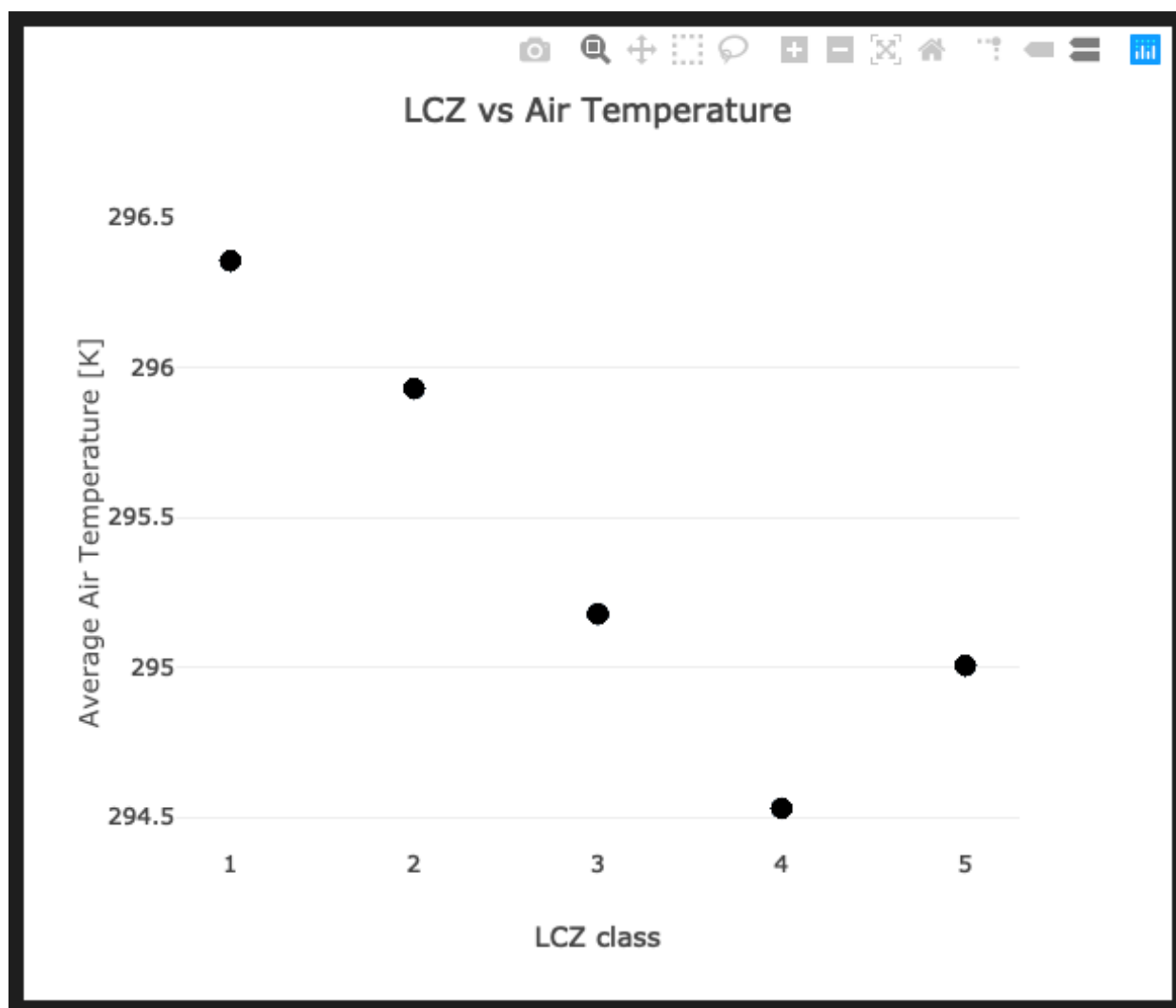


Fig. 6: Results visualization by means of a Scatter Plot