



# **To what extent will the Covid19 pandemic contribute towards reaching goals stated in the Paris Climate Agreement for Germany?**

**Data Collection Pipeline - Group 10**

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## **Submission structure**

Uploaded on moodle for this submission:

- This main submission document, which gives an general overview over the project goal related to the data sources we decided to further move on with.
- PDF print of Jupyter notebook, that creates a central database (JSON) out of all individual data sources. Also it justifies the chosen and visualizes it.
- JSON File which comprises of all data that we will use in the next milestone (represents interface to milestone 3).

Provided in LDV GitLab repository:

- Jupyter notebook to create a central database, justify the chosen data and visualize it, located in the folder "src".
  - Processed and raw data, located in the folder "data".
  - Jupyter notebooks to, if needed, download data and process the raw data to standardized form, located in the folder "dataprocessing"
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# 1 Project Goal

**Paris Climate Agreement:** In order to contribute to the objectives of the climate protection target decided in the Paris Climate Agreement, countries have submitted comprehensive national action plans to reduce their emissions. In a nutshell, these comprise the reduction of greenhouse gas emissions until the year 2030 by at least 40 % while taking greenhouse gas emissions of the year 1990 as reference for every participating country individually.

**In short:** In the project, we will use machine learning algorithms in order to predict and compare the greenhouse gas emissions in Germany with and without the impact of the COVID-19 pandemic. By comparing the two scenarios, we will be able to forecast the impact of the pandemic on Germany's climate targets on a long term basis and its effect on reaching the EU Climate Goals.

**Approach:** Our approach can be split into two scenarios. First, we want to predict the future greenhouse gas emission without the influence of COVID-19 pandemic on the basis of a given ground truth until 2018. In the second scenario, we will build a model that calculates the greenhouse gas emissions under the influence of the Corona crisis.

For the ground truth, we will look at monthly data of greenhouse gas emissions in order to later on capture the change during the pandemic more granularly and to make seasonal variation visible. Using our ground truth, we will use a regression model to predict the development of the greenhouse gas emissions without the influence of COVID-19 after 2018.

We will then use our ground truth on greenhouse gas emissions until 2018 to map key indicators that make up most of the greenhouse gas emissions or have a severe indirect effect on them. After having trained this model, we will use current data to measure the impact of the COVID-19 pandemic on greenhouse gas emissions for this year. Additionally, we will try different machine learning approaches to model the change in emissions during the pandemic and try to predict the future development in order to give a better estimate of the effect on reaching the EU Climate Goals.

**Discussion:** Using the measured difference between the two scenarios proposed in our approach, we will provide information on how the COVID-19 pandemic has already had an impact on our total greenhouse gas emissions in Germany. By additionally trying to give an estimate of the future development of the emissions we can further evaluate the impact of the crisis. We will scale our findings from Germany to all of the EU in order to classify how the direct and indirect effects of the pandemic has had an impact on reaching the EU Climate Goals in comparison to a scenario without the crisis.

## 2 Data

The indicators that we are mapping to the greenhouse gas emissions can be split into three main sectors, namely mobility, economy and the sector energy and households. For each sector we derive a machine learning model. The indicators that we use are presented in the following overview table. Additionally the data source for the ground truth, i.e. the greenhouse gas emissions for each sector is included.

Plots and an assessment if we expect the data to be relevant are provided in the Jupyter notebook.

Sector	Sub-Categories	Indicator	Sources	Characteristics
Mobility	Road traffic	Mobility Trend Google M1	<a href="https://www.google.com/covid19/mobility/">https://www.google.com/covid19/mobility/</a>	02/2020 - 06/2020, daily, processed to monthly, numeric  Format: CSV
		Mobility Trend Corona Apple M2	<a href="https://www.apple.com/covid19/mobility/">https://www.apple.com/covid19/mobility/</a>	01/2020 - 06/2020, daily, processed to monthly, numeric  Format: CSV
		Mobility Trend Corona BAST M3	<a href="https://www.bast.de/BASt_2017/DE/Statistik/Verkehrsdaten/Verkehrsbarometer.html?nn=1820340">https://www.bast.de/BASt_2017/DE/Statistik/Verkehrsdaten/Verkehrsbarometer.html?nn=1820340</a>	03/2020 - 06/2020, daily, processed to monthly, numeric  Format: CSV
		Traffic Indices (like mobility trend) TomTom M4	<a href="https://www.tomtom.com/products/historical-traffic-stats/">https://www.tomtom.com/products/historical-traffic-stats/</a>	01/2020 - 06/2020, daily, processed to monthly, numeric  Format: CSV
		Traffic count Germany M5	<a href="https://www.bast.de/BASt_2017/DE/Verkehrstechnik/Fachthemen/v2-verkehrszahlung/zaehl_node.html">https://www.bast.de/BASt_2017/DE/Verkehrstechnik/Fachthemen/v2-verkehrszahlung/zaehl_node.html</a>	2003 - 2018, hourly, processed to monthly, numeric  Format: CSV
		Traffic count Bavaria M6	<a href="https://www.baysis.bayern.de/web/content/verkehrsdaten/dauerzaehlstellen.aspx">https://www.baysis.bayern.de/web/content/verkehrsdaten/dauerzaehlstellen.aspx</a>	02/2017 - 04/2020, monthly, numeric  Format: CSV, xls
		Driven km of cars M7	<a href="https://www.kba.de/DE/Statistik/Kraftverkehr/VerkehrKilometer/verkehr_in_kilometern_node.html">https://www.kba.de/DE/Statistik/Kraftverkehr/VerkehrKilometer/verkehr_in_kilometern_node.html</a>	2014 - 2018, yearly, numeric  Format: CSV, XLSX
	Railway and Bus traffic	Freight transport by railway M8	<a href="https://www-genesis.destatis.de/genesis/online?operation=table&amp;code=46131-0004&amp;bypass=true&amp;levelindex=0&amp;levelid=1592904937923#abreadcrumb">https://www-genesis.destatis.de/genesis/online?operation=table&amp;code=46131-0004&amp;bypass=true&amp;levelindex=0&amp;levelid=1592904937923#abreadcrumb</a>	01/2005-02/2020, monthly, numeric  Format: CSV, XLSX
		Passenger traffic (all) M9	<a href="https://www-genesis.destatis.de/genesis/online?operation=table&amp;code=46100-0005&amp;bypass=true&amp;levelindex=0&amp;levelid=1592905664759#abreadcrumb">https://www-genesis.destatis.de/genesis/online?operation=table&amp;code=46100-0005&amp;bypass=true&amp;levelindex=0&amp;levelid=1592905664759#abreadcrumb</a>	2004-2019, per quarter, numeric  Format: CSV, XLSX
	Shipping	Inland waterway transport ("Binnenschiffahrt") M10	<a href="https://www-genesis.destatis.de/genesis/online?operation=table&amp;code=46321-0002&amp;bypass=true&amp;levelindex=0&amp;levelid=1592906073196#abreadcrumb">https://www-genesis.destatis.de/genesis/online?operation=table&amp;code=46321-0002&amp;bypass=true&amp;levelindex=0&amp;levelid=1592906073196#abreadcrumb</a>	01/1991-02/2020, monthly, numeric  Format: CSV, XLSX
		Seafaring (freight transport) M11	<a href="https://www-genesis.destatis.de/genesis/online?operation=table&amp;code=4633-0004&amp;bypass=true&amp;levelindex=0&amp;levelid=1592906350275#abreadcrumb">https://www-genesis.destatis.de/genesis/online?operation=table&amp;code=4633-0004&amp;bypass=true&amp;levelindex=0&amp;levelid=1592906350275#abreadcrumb</a>	01/2011-02/2020, monthly, numeric  Format: CSV, XLSX
	Aviation	Aviation traffic statistic in germany M12	<a href="https://www-genesis.destatis.de/genesis/online?operation=table&amp;code=46421-0012&amp;bypass=true&amp;levelindex=0&amp;levelid=1592905811215#abreadcrumb">https://www-genesis.destatis.de/genesis/online?operation=table&amp;code=46421-0012&amp;bypass=true&amp;levelindex=0&amp;levelid=1592905811215#abreadcrumb</a>	01/2011-04/2020, monthly, numeric  Format: CSV, XLSX
		Scheduled lights Germany M13	<a href="https://www.oag.com/coronavirus-airline-schedules-data">https://www.oag.com/coronavirus-airline-schedules-data</a>	01/2019 - 06/2019, 01/2020 - 06/2020, weekly, processed to monthly, numeric

				Format: XLSX
Economy	Economic Indicator	Consumer Price Index E1	<a href="https://www-genesis.destatis.de/genesis/online?operation=table&amp;code=61111-0002&amp;bypass=true&amp;levelindex=0&amp;levelid=1593074119569#abreadcrumb">https://www-genesis.destatis.de/genesis/online?operation=table&amp;code=61111-0002&amp;bypass=true&amp;levelindex=0&amp;levelid=1593074119569#abreadcrumb</a>	01/1991-05/2020, monthly, numeric Format: CSV
		Number of Unemployment E2	<a href="https://www-genesis.destatis.de/genesis/online?operation=table&amp;code=13211-0002&amp;bypass=true&amp;levelindex=0&amp;levelid=1593362437069#abreadcrumb">https://www-genesis.destatis.de/genesis/online?operation=table&amp;code=13211-0002&amp;bypass=true&amp;levelindex=0&amp;levelid=1593362437069#abreadcrumb</a>	01/2005-05/2020, monthly, numeric Format: CSV
	Stock Market	DAX E3	<a href="https://finance.yahoo.com/quote/%5EDAXI/history?period1=631152000&amp;period2=1592870400&amp;interval=1d&amp;filter=history&amp;frequency=1d">https://finance.yahoo.com/quote/%5EDAXI/history?period1=631152000&amp;period2=1592870400&amp;interval=1d&amp;filter=history&amp;frequency=1d</a>	01/1990-today, daily, processed to monthly values, numeric Format: CSV
		MDAX E4	<a href="https://de.finance.yahoo.com/quote/%5EMDAXI/history?period1=825552000&amp;period2=1592870400&amp;interval=1d&amp;filter=history&amp;frequency=1d">https://de.finance.yahoo.com/quote/%5EMDAXI/history?period1=825552000&amp;period2=1592870400&amp;interval=1d&amp;filter=history&amp;frequency=1d</a>	01/1996-today, daily, processed to monthly values, numeric Format: CSV
	Economy Sectors	Turnover Wholesale E5	<a href="https://www-genesis.destatis.de/genesis/online?operation=table&amp;code=45211-0005&amp;bypass=true&amp;levelindex=0&amp;levelid=1593073385190#abreadcrumb">https://www-genesis.destatis.de/genesis/online?operation=table&amp;code=45211-0005&amp;bypass=true&amp;levelindex=0&amp;levelid=1593073385190#abreadcrumb</a>	01/1994-03/2020, monthly, numeric Format: CSV
		Turnover Retail Industry E6	<a href="https://www-genesis.destatis.de/genesis/online?operation=table&amp;code=45212-0004&amp;bypass=true&amp;levelindex=0&amp;levelid=1593074270719#abreadcrumb">https://www-genesis.destatis.de/genesis/online?operation=table&amp;code=45212-0004&amp;bypass=true&amp;levelindex=0&amp;levelid=1593074270719#abreadcrumb</a>	01/1994-04/2020, monthly, numeric Format: CSV
		Turnover Hospitality Industry E7	<a href="https://www-genesis.destatis.de/genesis/online?operation=table&amp;code=45213-0005&amp;bypass=true&amp;levelindex=1&amp;levelid=1593076102258#abreadcrumb">https://www-genesis.destatis.de/genesis/online?operation=table&amp;code=45213-0005&amp;bypass=true&amp;levelindex=1&amp;levelid=1593076102258#abreadcrumb</a>	01/1994-04/ 2020, monthly, numeric Format: CSV
Energy and households	Electricity generation	Carbon intensity of each type of power plant EH1	<a href="https://www.ipcc.ch/site/assets/uploads/2018/02/ipcc_wg3_ar5_annex-iii.pdf#page=7">https://www.ipcc.ch/site/assets/uploads/2018/02/ipcc_wg3_ar5_annex-iii.pdf#page=7</a> Page 1335	Conversion factors, numeric Format: PDF
		Electric Energy Data of Germany starting from 2015 ordered by production type EH2	<a href="https://www.smar.de/home/downloadcenter/download_marktdaten/726#!?downloadAttributes=%7B%22selectedCategory%22%3A%22selectedSubCategory%22%3A%22selectedRegion%22%3A%22DE%22%22from%22%3A%221559340000000%22to%22%3A%221622584799999%22selectedFileType%22%3A%22CSV%22%7D">https://www.smar.de/home/downloadcenter/download_marktdaten/726#!?downloadAttributes=%7B%22selectedCategory%22%3A%22selectedSubCategory%22%3A%22selectedRegion%22%3A%22DE%22%22from%22%3A%221559340000000%22to%22%3A%221622584799999%22selectedFileType%22%3A%22CSV%22%7D</a>	01/2015-06/2020, 15min steps, numeric Format: CSV, XLS, XML
		Electricity generation, net heat generation, fuel input - Germany EH3	<a href="https://www-genesis.destatis.de/genesis/online?operation=table&amp;code=43311-0002&amp;bypass=true&amp;levelindex=0&amp;levelid=1592908210645#abreadcrumb">https://www-genesis.destatis.de/genesis/online?operation=table&amp;code=43311-0002&amp;bypass=true&amp;levelindex=0&amp;levelid=1592908210645#abreadcrumb</a> GENESIS-Tabellen: 43311-0002	01/2002-03/2020, monthly, numeric Format: CSV
		Electricity balance of Germany EH4	<a href="https://ag-energiebilanzen.de/7-0-Bilanzen-1990-2017.html">https://ag-energiebilanzen.de/7-0-Bilanzen-1990-2017.html</a>	1990-2001, yearly Format: XLS

		Electricity generation, net heat generation, fuel input - Germany EH5	<a href="https://www-genesis.destatis.de/genesis/online?operation=table&amp;code=43311-0002&amp;bypass=true&amp;levelindex=0&amp;levelid=1592908210645#abreadcrumb">https://www-genesis.destatis.de/genesis/online?operation=table&amp;code=43311-0002&amp;bypass=true&amp;levelindex=0&amp;levelid=1592908210645#abreadcrumb</a> GENESIS-Tabelle: 43311-0002	01/2002-03/2020, monthly, numeric Format: CSV
	Weather	Cloudage, air temperature, amount of rainfall, sunshine duration EH6	<a href="https://opendata.dwd.de/climate_environment/CDC/regional_averages_DE/monthly/">https://opendata.dwd.de/climate_environment/CDC/regional_averages_DE/monthly/</a>	01/1881 - 01/2020, monthly, numeric Format: TXT
	Households	Heating oil price EH7	<a href="https://www.boerse-online.de/rohstoffe/historisch/heizoelpreis/usd/22.5.2006_22.6.2020">https://www.boerse-online.de/rohstoffe/historisch/heizoelpreis/usd/22.5.2006_22.6.2020</a>	22/05/2006-22/06/2020, daily, processed to monthly, numeric Format: XLSX
		Inflation rate EH8	<a href="https://de.statista.com/statistik/daten/studie/4917/umfrage/inflationsrate-in-deutschland-seit-1948/">https://de.statista.com/statistik/daten/studie/4917/umfrage/inflationsrate-in-deutschland-seit-1948/</a>	1950-2019, yearly, numeric Format: XLSX
Greenhouse gas emissions	Emissions of Germany	Target values of greenhouse gas emissions of Germany GHG1	<a href="https://www.oeko.de/fileadmin/oekodoc/Sektorale-Abgrenzung-Treibhausgasemissionen-Datenbasis-20191217.xlsx">https://www.oeko.de/fileadmin/oekodoc/Sektorale-Abgrenzung-Treibhausgasemissionen-Datenbasis-20191217.xlsx</a>  Contact person for target values at "Umweltbundesamt": Patrick Gniffke Tel: +49 (0)340 2103 2757 Patrick.Gniffke@uba.de	1990 - 2030, yearly, numeric  1990 - 2017: actually published data of "Umweltbundesamt"  2018 - 2030: currently estimated prognosis of "Umweltbundesamt" by Patrick Gniffke  Format: XLSX

**Table 1:** Summary of Data Sources and Content

	Feature		
M1		1990	
M2		1991	
M3		1992	
M4		1993	
M5		1994	
M6		1995	
M7		1996	
M8		1997	
M9		1998	
M10		1999	
M11		2000	
M12		2001	
M13		2002	
E1		2003	
E2		2004	
E3		2005	
E4		2006	
E5		2007	
E6		2008	
E7		2009	
EH2		2010	
EH3		2011	
EH4		2012	
EH5		2013	
EH6		2014	
EH7		2015	
EH8		2016	
GHG1		2017	
		2018	
		2019	
		2020	
		prognosis	
	m	Frequency	

Figure 1: Coverage of the downloaded data