

Carbon Intensity Forecast Methodology

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Issue: January 2021

National Grid Electricity System Operator (ESO), in partnership with Environmental Defense Fund Europe and WWF, has developed a series of Regional Carbon Intensity forecasts for the GB electricity system, with weather data provided by the Met Office.

Introduction

National Grid's Carbon Intensity API provides an indicative trend of carbon intensity for the electrical grid of Great Britain up to 48 hours ahead of real-time [1]. It provides programmatic and timely access to forecast carbon intensity. This report details the methodology behind the regional carbon intensity estimates. For more information about the Carbon Intensity API [see here](#).

What's included in the forecast

The Regional Carbon Intensity forecasts include CO₂ emissions related to electricity generation only. The forecasts include CO₂ emissions from all large metered power stations, interconnector imports, transmission and distribution losses, and accounts for national electricity demand, and both regional embedded wind and solar generation.

While we recognise upstream emissions and indirect land use change impacts and other GHG emissions are important, it is only CO₂ emissions related to electricity generation that are included in the forecast. This work does not consider the CO₂ emissions of unmetered and embedded generators for which NGENSO does not have visibility of.

Methodology

The Carbon Intensity forecast is particularly sensitive to short-term forecast errors in demand, wind and solar generation, as this impacts the amount of dispatchable generation that is required to meet demand.

The forecast also makes use of historic generation data to make predictions about future generation, which invariably changes per system conditions. It is therefore important to note that these forecasts are likely to be less accurate than forecasts such as electricity demand, since it includes the confluence of uncertainties from demand, wind, solar, and CO₂ emissions by fuel type.

Estimated carbon intensity data is provided at the end of each half hour settlement period. Forecast carbon intensity is provided 48 hours ahead of real-time for each half hour settlement period and uses NGENSO's latest forecasts for national demand, wind and solar generation.

The GB carbon intensity C_t at time t is found by weighting the carbon intensity c_g for fuel type g by the generation $P_{g,t}$ of that fuel type. This is then divided by national demand D_t to give the carbon intensity for GB:

$$C_t = \frac{\sum_{g=1}^G P_{g,t} \times c_g}{D_t}$$

The carbon intensity is then corrected to account for transmission losses to give the intensity of consumption [3]. Table 1 shows the peer-reviewed carbon intensity factors of GB fuel types used in this methodology. Carbon intensity factors are based on the output-weight average efficiency of generation in GB and DUKES CO₂ emission factors for fuels [4].

Interconnector carbon intensity factors

Daily at 6am, the average generation mix of each network the GB grid is connected to through interconnectors is collected for the previous 24 hours through the ENTSO-E Transparency Platform API [5].

The factors from Table 1 are applied to each technology type for each import generation mix to calculate the import carbon intensity factors. If the ENTSO-E API is down, the import carbon factors default to those listed in Table 1.

Table 1: Carbon intensity factors for each fuel type and interconnector import [2][3].

Fuel Type	Carbon Intensity gCO ₂ /kWh
Biomass ⁱ	120
Coal	937
Gas (Combined Cycle)	394
Gas (Open Cycle)	651
Hydro	0
Nuclear	0
Oil	935
Other	300
Solar	0
Wind	0
Pumped Storage	0
French Imports	~ 53
Dutch Imports	~ 474
Belgium Imports	~ 179
Irish Imports	~ 458

The estimated carbon intensity uses metered data for each fuel type, which is also available from ELEXON via the Balancing Mechanism Reporting Service, and includes fuel types such as metered wind, nuclear, combined cycle gas turbines, coal etc. Estimated data is used for embedded wind and solar generation. Weather data, such as wind speeds and solar radiation, are procured separately by NGENSO and so are not publicly available. A rolling-window linear regression for each fuel type is performed and used

ⁱ Using 'consumption-based' accounting, the carbon intensity attributable to biomass electricity is reported to be 120 ± 120 gCO₂/kWh [2].

with forecast demand, wind and solar data to estimate forecast carbon intensity.

An index for carbon intensity has been developed to illustrate times when the carbon intensity of GB system is high/low. Table 2 shows the numerical bands for the Carbon Intensity index.

Table 2: Numerical bands for the Carbon Intensity Index. Carbon Intensity values are given in gCO₂/kWh

Index	2017	2018	2019+
Very High	400+	380+	360+
High	300-399	280-379	260-359
Moderate	200-299	180-279	160-259
Low	100-199	80-179	60-159
Very Low	0-99	0-79	0-59

Limitations

There are several limitations with this methodology. This approach does not use Physical Notifications (PNs) of Balancing Mechanism (BM) units in the forecast. This is to ensure that the commercial sensitivities surrounding the balancing market are maintained. This means that only historic data is used in the analysis, limiting forecast accuracy. Finally, this work does not consider the emissions of embedded generation of which NGENSO does not have visibility. Future work will look at estimating these contributions to GB carbon intensity.

Contact

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References

- [1] Carbon Intensity API (2017): www.carbonintensity.org.uk
- [2] GridCarbon (2017): www.gridcarbon.uk
- [3] Staffell, Iain (2017) "Measuring the progress and impacts of decarbonising British electricity". In Energy Policy 102, pp. 463-475, DOI: [10.1016/j.enpol.2016.12.037](https://doi.org/10.1016/j.enpol.2016.12.037)
- [4] DUKES (2017): www.gov.uk/government/collections/digest-of-uk-energy-statistics-dukes
- [5] ENTSO-E Transparency Platform: <https://transparency.entsoe.eu/>

The large uncertainty relates to the complex nature of biomass supply chains and the difficulty in quantifying non-biogenic emissions.