Estimating emissions associated with future UK consumption patterns

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June 2013

A report submitted to the Committee on Climate Change



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1 Introduction

The Committee on Climate Change (CCC) is undertaking a review of current and projected UK emissions as measured on a consumption, rather than production, accounting basis to explore if there are any implications for the UK's decarbonisation strategy and policies. This document reports the contribution by the University of Leeds in estimating a times series of past UK consumption emissions (1993-2010) and future emissions (out to 2050) under various scenarios. The technical details of the modelling are provided, documenting the methods employed; data sources; aspects of uncertainty and comparison of results with alternative global models estimating consumption-based emissions. The CCC has provided a technical annex describing how the scenario assumptions were constructed. A summary of results is provided, but not a detailed analysis of these. Emissions datasets in Excel have been provided to the CCC for publication alongside this report.

1.1 Aims and objectives

The aims and objectives set out in the agreed proposal between the University of Leeds and the Committee on Climate Change were:

- I. Using Eora, a global multi-regional input-output model (MRIO) developed by the University of Sydney, develop a comprehensive time series of UK consumption emissions by a number of sectors (maximum of 26) and regions specified by the CCC between 1993 and 2010.
- II. Develop scenario framework, including all factors that can be varied in the model to allow for the construction of scenarios (i.e. final demand, carbon intensity, trade balances, etc.). This will allow scenarios to be developed up to 2050 through the adjustment of the individual factors.
- III. Working closely with the CCC, develop the inputs for modelling scenarios. Variables will be modified in consultation with the CCC, including assumptions for future carbon intensities (both inside and outside the UK) and trade patterns. Approaches to project future emissions should be consistent with approaches to estimate past emissions.
- IV. Scenarios based on input data decided in the last work package will be modelled in Matlab and each scenario will produce a separate emissions results file ensuring complete transparency.
- V. A short report will be provided that describes the methodology employed, the scenarios selected and show the results; accompanied with data sets in Excel.

1.2 Research context

There is an increasing separation between the location of production and consumption, where embodied emissions in trade have grown substantially over the past 15 years (Peters and Hertwich 2008; Davis and Caldeira 2010). This has resulted in a considerable variation between the emissions occurring within the territory of some countries and the emissions associated with consumption of its residents. Consumption-based emissions methodologies have been developed to provide an understanding of the total embodied emissions associated with a country's consumption patterns, irrespective of where the emissions occur.

This is a particularly important issue for the UK compared to other large global emitters. A number of independent estimations highlight that the difference between growth in consumption-based and territorial-based emissions was the largest for the UK compared to other industrial nations in the top ten global emitters of carbon dioxide (CO₂) emissions over the past two decades, with the gap

growing by 23% compared to 8% for the US, 7% for Canada, and decreases in the gap in other countries (Barrett et al., 2013).

The UK Government has recognised the importance of different carbon accounting approaches to provide a complete picture of the UK's contribution to global emissions. Since 2011, the UK Government has adopted "Consumption-based GHG Emissions" as a headline indicator and reports these results annually (Defra, 2012). In April 2012 the UK Parliament Energy and Climate Change Select Committee undertook an inquiry into consumption-based GHG emissions and made further recommendations to the Department for Energy and Climate Change to consider approaches to reduce both emissions occurring within the UK and embodied in trade to satisfy UK consumption (House of Commons, 2012).

The Government estimates of UK consumption-based emissions are calculated by the University of Leeds for the Department for Environment, Food and Rural Affairs (Defra) using an environmentally extended multi-regional input-output model (EE-MRIO). This model has also been employed for the CCC study but with a greater regional disaggregation.

A European project commissioned by a collation of European Environment Agencies (ERA-NET) (Wiedmann et al, 2009a) has identified EE-MRIO as a favourable approach for assessing the environmental impacts of trade. EE-MRIO is emerging as a comprehensive, versatile and compatible approach for consumption-based accounting of GHG emissions and has already become the norm (Davis and Caldeira, 2010; Peters and Hertwich, 2008; Peters et al., 2011; Wiedmann, 2009; Wiedmann et al., 2011). Strengths and weaknesses of the EE-MRIO approach were assessed in the European EIPOT project that is widely quoted by many European countries considering consumption-based GHG emission accounting (Wiedmann et al., 2009a).

2 UK consumption emissions historical time series (1993 - 2010)

Eora, a new global EE-MRIO model developed by the University of Sydney, was used to provide a comprehensive time series of UK consumption emissions, both CO₂ and GHGs, between 1993 and 2010 for the CCC.

2.1 Method

EE-MRIO analysis is a peer-reviewed method with applications in the calculation and reporting of consumption-based emissions accounts and in climate change policy (Minx et al., 2009; Wiedmann and Barrett, 2013; Barrett et al., 2013; Hertwich and Peters, 2009). A consumption-based account can quantify those emissions occurring in foreign nations to satisfy domestic consumption and similarly quantify the proportion of domestic emissions embedded in products for export (Peters, 2008; Wiedmann et al., 2011; Wiedmann, 2009).

2.1.1 The basic principles of input-output analysis (IOA)

Input-output analysis (IOA) is a method used to examine the inter-relationship among the productive sectors of an economy represented by an IO matrix. A good description of IOA is provided in Wu and Zhang (2005) and has been adapted here. The IO matrix describes the complex process of production, the use of goods and services and the value added and income generated within various sectors of an economy, where the set of producers of similar goods and services forms a homogenous industry. Economic sectors purchase goods and services from other sectors; pay

wages; pay taxes and potentially receive subsidies in the process of making their own product (Miller & Blair, 2009). The income generated in wages is transferred to final consumers to buy goods and services such as food, energy, transport, domestic appliances, leisure activities and so forth. IO tables are based on observed economic data for one year. A series of tables along a timescale reveals the structural change of an economy and specific sectors' economic characteristics.

An IO matrix consists of four quadrants:

- The first quadrant (Z) shows the monetary transactions between sectors that both produce goods (outputs) and consume goods (inputs) from other sectors in the process of making their own product. Reading across a row reveals which industries a single sector sells to (i.e. its sales profile) and reading down a column reveals who a single sector buys from (i.e. its expenditure account). This quadrant is at the heart of IOA and referred to as the 'transactions' or 'intermediate matrix'.
- The second quadrant (Y) represents the sectoral distribution of final demand. Final demand is comprised of households, government, fixed capital and exports¹.
- The third quadrant (V) shows primary inputs (i.e. the sectoral distribution of wages, operating surplus, value-added, indirect taxes, subsidies and depreciation)
- The fourth quadrant (X) shows that an industries input (its expenditure) is equal to its output (its sales).

	Industries	Net final demand	Total output
Industries	Z	Y	X
Value added	V		
Total input	Х		

IOA is a demand driven model and the level of production activities is determined by demand for goods and services and the interdependencies of sectors in an economy. Using a simplified example, for sector A to produce its product it requires material and energy as intermediate inputs from sectors B and C respectively. If the total input of Sector B to Sector A is 2, for every unit produced by Sector A, Sector B has to produce 2 units to support it. The same principle applies for sector C. In turn Sector B and C each require a recipe of inputs to produce their 2 or equivalent units and so forth, creating an economy-wide pull effect from demand for Sector A. The production value generated throughout the economy to produce 1 unit for Sector A is measured quantitatively by a direct and indirect coefficients matrix called the Leontief inverse; the sum of the columns representing sectoral output multipliers. For example if the output multiplier for sector A is calculated as 3, the entire economy will be induced to generate the value of £3 if sector A produces

¹ These are the final destination of products, whereby they do not flow into other sectors as intermediate inputs

£1. Final demand determines the number of units produced. See Appendix 1: EE-MRIO methodfor detailed methodology.

2.1.2 The environmental extension

Since the 1960s, the IO framework has been extended for environmental analysis (e.g. to account for increases in the pollution associated with industrial production due to a change in final demand (Miller & Blair, 2009)). This extension is referred to as an Environmentally Extended Input-Output model (EE-IOM). In the model used to estimate the UK's consumption emissions, the IO tables are appended with a row vector that includes direct sectoral emissions². Direct sectoral emission intensities are quantified by measuring the emissions required to produce one unit of output. Continuing the IOA example from above, if Sector A emits 20 grams of CO₂ to produce £20 of output, one production unit emits 1 gram of CO₂ (i.e. it's production intensity is 1 gram CO₂/£). However, Sector A has additional indirect emissions embodied in its intermediate inputs. Sector A requires 2 units from Sector B and 3 units from Sector C. If sector B emits 10 grams of CO2 to produce £20 of output and sector C emits 10 grams of CO₂ to produce £50 of output, their production intensities are 0.5 grams CO₂/ £ and 0.2 grams CO₂/ £ respectively. 2 units at an intensity of 0.5 grams CO₂/ £ and 3 units at an intensity of 0.2 grams CO₂/ £ are reallocated to sector A as indirect intensity multipliers. Sector A's total intensity multiplier (i.e. direct plus indirect) is 2.6 grams CO₂/ £. In reality, Sector B and C will have intermediate inputs and emissions will be reallocated from the point of origin through supply chains to the final product. Final demand determines the total consumption-based emissions: if householders purchased £5 of Sector A's products the associated consumption emissions would be (5 * 2.6) = 13 grams CO2. See Appendix 1: EE-MRIO method for detailed methodology.

2.1.3 The trade extension

In its basic format the transactions matrix described above represents domestic sectors (e.g. economic transactions and emissions arising in domestic sectors of production). Multi-regional input-output (MRIO) tables extend the transactions or intermediate matrix to represent purchases and sales to sectors in other countries (i.e. imports and exports). The row of the matrix is extended to represent each sector's exports to international intermediate sectors and the columns are extended to show the intermediate imports from foreign sectors. Sector A might source intermediate inputs from sector B domestically or import the same product from another country. Demand for sector A will not just induce production in its own economy but will induce global production activities, resulting in emissions being released outside of its national territory. Emission intensity multipliers will be allocated to trade flows indicating the production intensity of the origin country. A consumption-based emission account sums the direct and indirect emissions associated with a nation's demand for products.

In the last five years, several MRIO databases and models capable of tracking flows of goods and services between nations have been developed. These are described in Table 1.

² This report investigates emissions, however, other environmental indicators can be used e.g. water consumption and material use

Model	Sector coverage	Country coverage	Years available	Potential updates	Reference(s)
Eora	Varies by country from 26 to 515 sectors ³	187	1990 – 2010	Annual updates with 2 year time lag	Lenzen et al. (2012)
GTAP	57	127 (yr '07); 113 (yr '04); 87 (yr '01)	2001, 2004, 2007	3 year intervals with a 4 year lag	Peters et al. (2011)
EXIOPOL	130	44 (EU27, 16 others + ROW)	2000	Funding dependent	Tukker et al (2009)
WIOD	35 industries, 59 products	41 (27 EU, 13 others + RoW)	1995 – 2009	Funding dependent	Timmer et al (2012)
AIIOT	76	11 (9 Asian, USA and ROW)	1985, 1990, 1995, 2000, 2005	Every 5 years	Zhou and Kojima (2009)

Table 1: EE-MRIO models

2.2 Data

The model used to develop UK consumption emissions estimates for Defra and the CCC relies on data obtained from Eora, an EE-MRIO model developed by the Integrated Sustainability Analysis (ISA) group at the University of Sydney. There are several peer-reviewed articles on both the construction techniques and application of Eora data (Lenzen et al., 2011; Kanemoto et al., 2011; Lenzen et al., 2011a; Lenzen et al., 2012a; Lenzen et al., 2012b). The Eora database became available online in 2012 and will be updated annually.

2.2.1 Eora structure

Eora provides a global transactions matrix showing inter-industry trade between 187 countries for a time series from 1990-2010. The original sector classification of the countries accounts are retained, with country sector resolution ranging from 511 sectors to 26 sectors. Using the common bottom denominator, a 26 sector harmonised system was also developed to enable easier cross-country comparisons and sector analysis. For the 98 countries where IO tables are not available, but total sectorial economic outputs are, a representative economy is applied using the average of tables from U.S., Japan and Australia. For missing years, a country's IO table from a previous year is updated using available economic indicators.

2.2.2 Environmental extension

The database has over 50 environmental extension datasets allowing measurement of, for example, energy, greenhouse gas, water, labour and land use footprints. Global sectoral emissions in Eora are sourced from a combination of data from EDGAR, UNFCCC and CDIAC. This study utilises global carbon dioxide emissions arising from fuel combustion and all other greenhouse gas (GHG) emissions excluding Land Use, Land Use Change and Forestry. It is important to note that there is less confidence in the Eora emissions data for non-CO₂ emissions, due to the use and allocation of Global Warming Potential multipliers (Reisinger et al., 2010).

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³ The original database has heterogeneous country sector classification systems, however a harmonised 26 sector model is available

2.2.3 Trade data

Alongside the domestic tables, countries report import tables. For each sector, the import tables report spend on imported products but the region of origin is not reported. Eora estimates trade between regions by disaggregating the imports matrix to show share by region using international trade data from United Nations commodity trade statistics database COMTRADE. Some estimation is required in the allocation of trade data to the sector classification used by different regions, and where countries do not report to COMTRADE, a proxy nation's trade structures are used instead.

2.2.4 Region and sector aggregation selected

Exploring potential global emissions pathways at a detailed sector and individual country level requires a substantial amount of data manipulation and potentially presents a false impression of the detail and accuracy of anticipated futures. To make the analysis more manageable and in recognition of the uncertainty of projecting the future, the harmonised 26 sector classification was adopted (a full list of sectors analysed is provided in Appendix 2) and countries were aggregated into eight regions. Regions were selected based on their current and anticipated future contribution to the UK's final demand for imported goods and services (i.e. imports) as well as on the basis of detailed modelling of future emissions trajectories available in the International Energy Agency's *Energy Technology Perspectives* (2012) publication. The eight regions selected by the CCC were:

- The UK
- OECD Europe
- Rest of OECD
- China
- India
- Rest of developing Asia
- Russia
- Rest of World (RoW)

Due to the UK focus, more sector detail is included in its domestic tables than for the rest of the world. Full input-output tables for the UK for 110 sectors according to UK Standard Industrial Classification (2007) was provided by the Office for National Statistics (ONS, 2009) and integrated into the 26 harmonised sector Eora model (Owen et al., 2012). The sector classifications are listed in Appendix 2: EORA sector classification.

2.2.5 Trends data

For each region and sector, annual economic and intensity multipliers of production were provided to the CCC in a database of trends described in Table 2. These data inputs provide information on how the global economy has evolved over the time series (1993-2010), including trade, sectoral output, and emissions intensities of production, and provide information on what influences changes in consumption emissions. These can also be used to project future variables in line with historic trends (see Section 3).

Economic variable	Description	10	Units
		notation ⁴	
Sector output	Annual economic sector output	X	£M current
			basic prices
Technical coefficients	Production recipe of first order inputs to	Α	£M/£M
	produce a unit of sector output		
Final demand	Sectoral distribution of final demand	Υ	£M current
			basic prices
CO ₂ and GHG intensity	Sectoral emission intensity production	F _x	Kt / £M
of production	multipliers		

Table 2: Economic and intensity production factors

2.2.6 Reliability statistics

The Eora database contains standard deviations for each matrix element in the MRIO. These measures indicate how reliable the Eora researchers consider each element in the database to be. The reliability statistics are either sourced from the original economic data or proxy information available in the literature. Standard deviations are often reported for economic sector totals, rather than individual elements in the table. The Eora team then uses matrix balancing techniques to spread the error measurements throughout the table (Kanemoto et al., 2011).

2.2.7 Results format

A results emissions matrix was provided to the CCC for each year with dimensions 292 by 292 (UK 110 sectors and 26 sectors for 7 regions). In the matrix the rows specify the country and sector in which the emissions originate, and the columns determine the product in which the emissions become embodied. The sum of the rows are the emissions released by the equivalent sector to satisfy UK demand (e.g. how many emissions are emitted in the power sector to produce goods and services that are consumed by the UK) and the sum of the columns are the emissions embodied in the equivalent product to satisfy UK demand (e.g. for a given product consumed in the UK such as Food and Drink products, the associated supply chain emissions). A single cell in the matrix represents the share of emissions transferred from one production industry (the row) bought by another (the column) to produce the level of output demanded by UK consumers. The sum of the matrix is the total UK consumption emissions (excluding household direct emissions⁵).

To summarise, the emissions matrix enables analysis of results from both an origin and product perspective:

- An origin perspective shows the country and sector in which emissions are directly released before becoming embodied in products for final consumption in the UK.
- The product perspective shows the sum of supply chain emissions embodied in products for final consumption in the UK.

 4 The notation is attributed to variables in the equations in appendix 1

⁵ Emissions from direct burning of fuel by households for heating and private transport are added separately. The production and distribution of fuels has been included, however, the burning of the fuel occurs in the household and not the industry, which is what the IO analysis captures. For the UK these are provided in Environmental Accounts and added to the emission account.

The sum of emissions results from an origin perspective is equivalent to the sum of results from a product perspective (e.g. all emissions produced in the UK and abroad to support final UK consumption). It is the allocation to industries and products which differs.

2.3 Summary of results (1993 - 2010)

Results matrices for UK consumption emissions (for CO_2 and for all GHGs) from 1993 to 2010 have been provided to the CCC. Figure 1 and Figure 2 summaries historic UK consumption-based emissions from an origin and product perspective for CO_2 and GHGs respectively. Total overall consumption emissions from an origin and product perspective are the same, but their attribution to countries and sectors differs depending on whether they are assigned to the sector of origin or the product of embodiment.

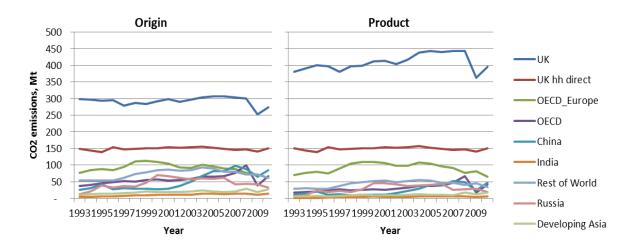


Figure 1: Summary of UK consumption CO₂ emissions time series by an origin and product perspective

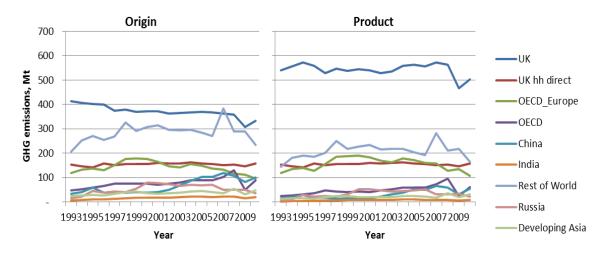


Figure 2: Summary of UK consumption GHG emissions time series by an origin and product perspective

Table 3 summarises changes in absolute emissions between 1993 and 2010. Both consumption-based CO_2 and GHG emissions have been on an upward trajectory, dropping significantly in 2009; entering the period of global recession. Emissions from UK industry and embodied in UK final products are isolated and compared to overseas industry and product emissions. Emissions originating in UK industry to satisfy UK final demand have declined (by 5% and 14% for CO_2 and

GHGs), in contrast to emissions originating in overseas industry which have increased by 59% and 38% for CO₂ and GHGs respectively. When all GHGs are included, emissions originating overseas have become more significant than those released domestically.

Emissions embodied in products sold by UK sectors to UK final consumers are higher than emissions originating in UK industry. A product perspective includes all upstream emissions, some of which will be imported. The overseas emissions included in a product perspective create the difference. Emissions embodied in UK products have remained somewhat stable; a 3% increase in CO₂ emissions and a 5% reduction in GHG emissions. However, again there is significantly higher growth in overseas emissions to satisfy UK demand (39% and 38%). Final consumers in the UK are increasingly becoming reliant on imported products.

	CO ₂	GHG
Change in total UK consumption emissions (1993 and 2010)	个16%	个9%
Change in UK only origin emissions (1993 and 2010)	↓ 5%	↓14%
Change in UK only product emissions (1993 and 2010)	个3%	↓ 5%
Change in overseas origin emissions (1993 and 2010)	个59%	个38%
Change in overseas product emissions (1993 and 2010)	个39%	个38%

Table 3: Changes in emissions

2.4 Results comparison

As seen above, in the past five decades a number of MRIO models and databases to estimate a country's consumption emissions have become available. While they rely on the same modelling principles they utilise different economic, trade and environmental datasets; different methods of combining and balancing national IO tables into an integrated global model; and have different regional and sector breakdowns. As a result use of different models/databases will generate difference estimates of the UK's carbon footprint. The various peer-reviewed models are summarised in Table 1 (see section 2.1.3). Error! Reference source not found. shows the UK carbon footprint time series as reported by four global models (Eora, Exiopol, GTAP and WIOD), and two variants of Eora (CCC and DEFRA). Only one or two years of data are available from the Exiopol and GTAP models. In 2007, the latest year allowing comparison across the majority of models, the lowest reported UK consumption emissions (GTAP) are 72% below the highest reported emissions (Eora).

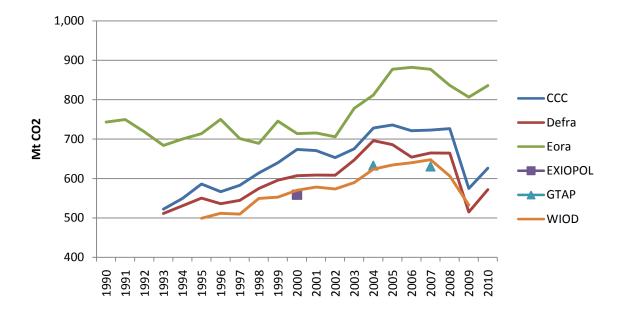


Figure 3: UK consumption-based CO₂ estimates from alternative MRIO models

The University of Leeds uses Eora data to develop estimates of UK consumption emissions for Defra, but results differ from the Eora model as Leeds integrates more detailed (unpublished) UK data with Eora data to generate a four region⁶ model. The CCC requested more regional disaggregation (an eight-region versus four region model for Defra) and as a result CCC estimates are higher than Defra results⁷. This is because models which allocate emissions to greater numbers of regions and sectors tend to reveal higher emissions for the UK. These models are able to detect the impact of trade with developing nations whose impact (CO₂) per unit of output (£) tends to be higher than that assigned to a general Rest of World region⁸. For example GTAP analyses 127 regions totalling 7,239 sectors while Eora analysis 187 regions totalling 15,909 sectors.

This holds true when comparing the Eora model with the modified model used by the University of Leeds to develop the Defra and CCC estimates. Aggregating Eora's more detailed format (187 countries and heterogeneous sectors ranging from 26 to 515) to a UK-centric eight and four region model with 110 UK sectors and 26 harmonised rest of world sectors results in estimates of the UK's carbon footprint that is lower. Figure 4 compares emissions embodied in product groups for the UK in 2010 between the Defra and CCC models⁹.

⁷ UK, OECD – Europe, OECD – other, China, India, Russia, Developing Asia, Rest of World

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⁶ UK, EU 27, China and Rest of World

⁸ The strength of this hypothesis is currently being tested (between University of Leeds and University of Sydney)

⁹ This excludes household direct emissions resulting from on-site burning of fuel for heat and private travel

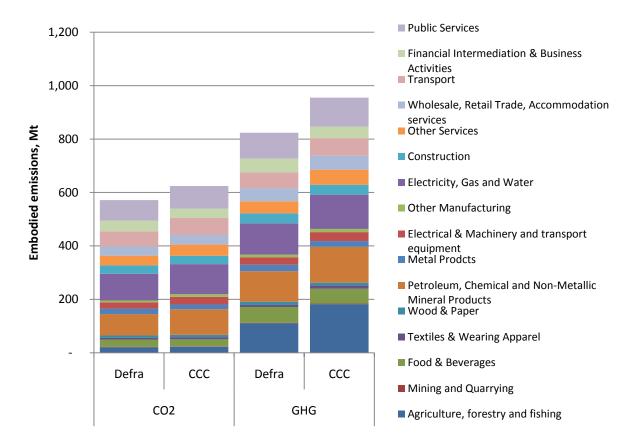


Figure 4: UK consumption emissions by product for 2010 comparing the Defra and CCC models

Overall emissions are 9% and 16% higher in CCC results for CO_2 and GHGs respectively; which varies between product groups. The CCC has a separate analysis of Russia, Developing Asia and India. The more detailed model is able to detect the impact of trade with these nations, whose impact per unit of output is higher than a generic rest of world sector, resulting in higher emissions embodied in imports. This is particularly noticeable for greenhouse gas emissions embodied in agricultural products. Figure 5 compares GHG emissions embodied in agricultural products consumed in the UK originating in the different regions.

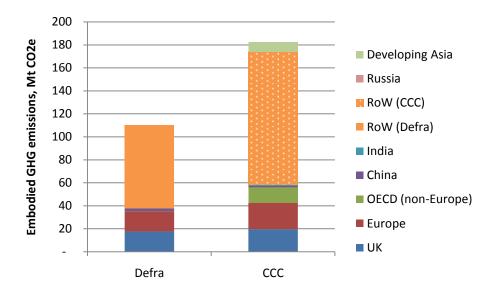


Figure 5: UK GHG consumption emissions for agricultural products for 2010 comparing the Defra and CCC models

The contribution from domestic and European industry is similar between Defra and the CCC model. However, where Defra has a single Rest of World region, the CCC disaggregates into five regions: OECD nations, Russia, India, Developing Asia and Rest of World. Excluding OECD (non-Europe), where the impact per unit of output for Agriculture is lower, the impact per unit of output for the remaining rest of world regions are much higher. The OECD nations' lower impact has a diluting effect in the Defra model. Agriculture is one of the few sectors where the majority of UK consumption is sourced from abroad and so this effect is most strongly seen for this product.

2.5 Uncertainty

An uncertainty analysis has not been conducted within the timescales of this project. However, the sources of uncertainty in MRIO models are discussed and references to other similar MRIO studies that undertake uncertainty calculations are provided where possible.

2.5.1 Sources of uncertainty

EE-MRIO analysis relies on secondary economic, environmental and trade data sources which add uncertainty to EE-MRIO analysis (Lenzen et al., 2010, Peters et al., 2012, Wiedmann et al., 2008). One source of uncertainty is the use of monetary data to represent physical commodity flows. Representing a quantity of a good by monetary data rather than using physical data such as weight assumes the same quantity of the commodity is represented by the same monetary amount regardless of which sector the commodity is bought by. For example, electricity prices will vary depending on the importing industry; however, the model assumes that every industry purchases electricity at the same price. Emissions are attached per pound of electricity purchased, and will be distributed through supply chains according to this homogenous price assumption. One production industry might have paid less for the same quantity of electricity as another. The emissions attributed to both should therefore in be the same, however, with IO assigning an emissions per pound spent, the industry which paid less will show as having less emissions from electricity embodied in their product.

Further uncertainties can be introduced after the source data has been collected and analysts start to assemble the information into an EE-MRIO table. There are many ways in which the data can be

assembled and adjusted and each alteration to the original source data introduces further uncertainty. Economic data needs to be converted into a common currency and monetary transactions converted into basic prices. This requires price conversion statistics and taxes and subsidies to be re-distributed from a product to a value added sector. Where national data is missing, estimations are required such as the use of a representative average. Often further calculations are required to populate international trade data, the off-diagonal sectors of the table. MRIO tables must also adhere to a number of properties such as inputs must equal outputs and the sum of value added must equal the sum of the final demand. If these conditions are not met, then the table is subjected to a number of balancing iterations until a table is produced that satisfies these constraints. Balancing methods vary and there are numerous techniques for table construction which leads to uncertainty in the final result. Each stage of data processing takes it a step further from the original data source.

In addition, the aggregation of economic sectors introduces uncertainty. For example, Eora applies an average carbon intensity to the agricultural sector when calculating consumption emissions. This aggregated sector covers all agricultural activities including a wide range of crops, animals, practices and so forth. However, cattle farming are considerably more carbon intensive than other types of agriculture. The choice of aggregation can therefore lead to different impact results. Grouping data together that exhibit very different emission intensities will lead to calculations that use aggregated sectors containing more uncertainty than calculations that involve grouping more homogenous data. Issues of aggregation occur when MRIO models are constructed with a sector classification that is common to each country. The model selected is the Eora harmonised MRIO table and original data from national tables have been either aggregated or disaggregated to match the common classification.

2.5.2 Measuring uncertainty

As Lenzen et al. (2010) and Wiedmann (2009) note, there are actually very few examples of environmental MRIO studies where uncertainty analyses are undertaken. The table below describes examples of types of uncertainty analyses and summarises their findings.

Study	Uncertainty methods used	MRIO data	Findings
Lenzen et al. (2010) and Wiedmann et al. (2008)	Uses Monte Carlo techniques to carry out a sensitivity analysis of the MRIO model. The method repeatedly simulates the MRIO model with slight perturbations to the model elements meaning the standard deviations of the emission multipliers and error propagations of the embedded emissions can be determined.	These studies use the 2008 version of the Defra UK MRIO model	The authors conclude there is an 89% probability that the UK's carbon footprint increased between 1994 and 2004 and that the relative standard error for consumer emissions lies within 3.3% for 1994 and 5.5% for 2004.
Wilting (2012)	Conducts a sensitivity analysis by allowing elements in the domestic and trade blocks of the MRIO table to vary by up to 10%. Uses Monte Carlo simulations to Investigate uncertainties for the total Dutch footprint and at sector and product level.	This study uses an aggregated version of GTAP version 6 to consider the Dutch carbon footprint for 2001.	The Dutch footprint has an uncertainty of around 4.6%, whereas uncertainties associated with the carbon emissions allocated to products ranged from 4% to 53%. Sectors with non-CO ₂ GHGs had the highest uncertainties.
Weber & Matthews 2007	Sensitivity analysis of estimated trade data to the US. The authors test the impact on the US footprint when a rest of world trade region takes multipliers of the most and least carbon intensive countries in the data set	This study measures the US footprint by using an MRIO model for the US, seven trade countries and the RoW	Choice of rest of world data can vary the US footprint by up to 20%

An additional source of uncertainty described in the literature is the exchange rate methodology used to convert currencies into a common unit. The two main methods are market exchange rates (MER) and purchasing power parities (PPP). While both methods should give identical results for consumption emissions if used consistently (i.e. to convert both trade flows and emission intensities), the emissions estimate may vary where not. Therefore it is important to ensure a common method is used throughout the estimate to minimise estimation errors. The Eora model uses MERs.

Based on the findings above, we suggest that uncertainties in the total consumption based emissions calculation for the UK may be in the order of 5% however as Wilting (2012) shows, at the product level the uncertainty level increases. This 5% represents the uncertainty in the total UK consumption account as calculated by the Defra MRIO model. It does not indicate the uncertainty of model results calculated using different models, as seen in Figure 3. Comparing different models yields greater uncertainty due to the differing model structures and data sources used.

3 UK consumption emissions projections (2010 - 2050)

Future UK consumption emissions to 2050 (at five year intervals) under various demand and emissions reduction scenarios are explored. The scenario approach is consistent with the method used to estimate historic consumption-based emissions. Using the EE-MRIO scenario framework devised by the University of Leeds, the CCC developed scenarios reflecting different combinations of UK demand (including imports) and global production emissions intensities.

3.1 Scenario descriptions

Five scenarios exploring potential future UK consumption-based emission pathways were developed by the CCC constrained to two and four degree global temperature rise and with low, medium and high levels of import growth:

- 1. 2 degree future (CO₂)
- 2. 2 degree future without availability of carbon capture and storage technology (CO₂)
- 3. 2 degree future with overseas production intensities converging to UK intensities (CO₂)
- 4. 4 degree future (CO₂)
- 5. A 2 degree future including all GHGs

3.2 Scenario framework

Figure 6 illustrates the different stages of scenario generation. As described in the previous section Eora is the starting point for estimating historic UK consumption-based accounts. Annual IO data from Eora was provided in Excel sheets and decomposed into four variables: sector output; technical coefficients (or production recipe); final demand and production intensities (see Table 2). The computational requirements to calculate emission results is too big to be carried out in Excel therefore the input-output analysis is scripted in MatLab, which generates emission results matrices in Excel files.

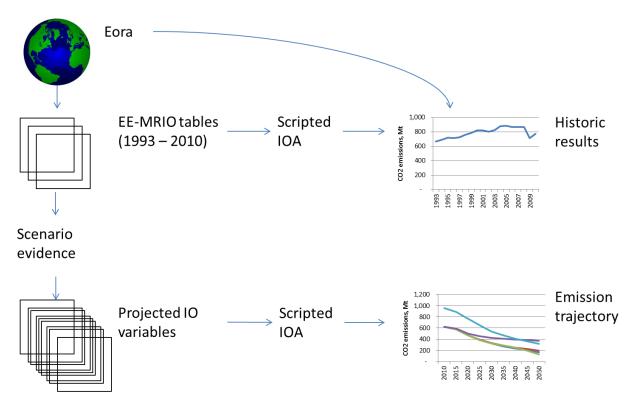


Figure 6: Scenario framework

The CCC projected future demand and emission intensities under constrained UK carbon budgets and 2050 target to reduce production emissions by 80% relative to 1990 levels. These were specified in five scenarios incorporating various pathways for global emissions reductions. A description of this approach and supporting data is provided in Appendix 3: Evidence base for scenarios (contributed by

the CCC). The limits to production intensities within defined carbon budgets, projected demand growth rates and with a low, medium and high increasing reliance on imports were explored.

Table 4 summarises the level of detail and sources used. The column 'Constant' refers to whether the values used for the variable are the same in the different scenarios; the 'Regional and sector detail' indicates the level of aggregation of projections; the 'Source' denotes whether the variables are projected using the time series or an alternative source; and 'Sensitivity' indicates whether the variable is modelled at different levels within scenarios. Variables are projected at 5 year intervals as a growth rate from the 2010 baseline and input into Excel. The input-output calculations are performed in Matlab and emission results up to 2050 are generated for each scenario and its associated sensitivity runs (the level of reliance on imports).

Variable	Constant	Region and sector detail	Source	Sensitivity
Sector output	No	Varies across countries but not across sectors within a country	UK: OBR projections; Rest of world: IMF, DECC, and DfT projections ¹⁰	No
Technical coefficients	Yes	Global production structure remains constant at 2010	2010 EE-MRIO model ¹¹	No
Final demand for products	No	Varies by country and sector (Historic trends with gradual shift towards imports arising from emerging economies and away from advanced economies, gradual shifts away from demand for fossil fuels for energy production)	Import demand projected forward in line with historic GDP growth (with range 2.25%-3.25% per year); Domestic demand adjusted to maintain historic trade balances	Yes: each scenario is run at low, central and high rates of import demand
CO ₂ and GHG sector emissions	No	Constrained to 2 degree and 4 degree global emission levels; varies by country and high level sectors	CCC analysis and IEA ¹²	No
CO ₂ and GHG intensity of production	No	Varies by country and high level sectors	Emissions divided by output	No

Table 4: Summary of projection variables

3.3 Summary of results

Scenario results at 5 year intervals from 2010 to 2050 from an origin perspective have been provided to the CCC, summarised in Figure 7. Datasets are available in Excel.

https://www.gov.uk/government/uploads/system/uploads/attachment_data/file/183931/aviation-forecasts.pdf

¹⁰ Department for Transport (2013) UK Aviation Forecasts,

¹¹ Described in section 2

¹² CCC

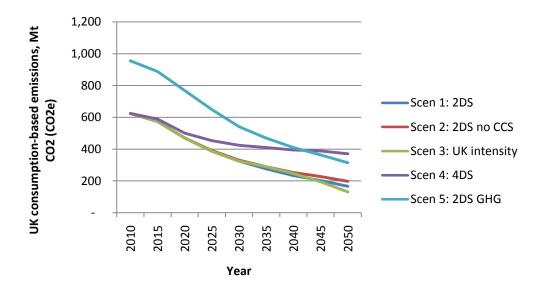


Figure 7: Summary of scenario emission results 2010 - 2050

Each scenario shows a pathway of declining UK consumption-based emissions. The highest emission reduction is achieved in a world where global production intensities converge to mirror UK sectoral production intensities, reaching 131 MtCO₂, almost a fifth of those in 2010. If global carbon budgets defined to remain within two degrees of climate change are achieved, consumption emissions in 2050 are anticipated to be 27% what they were in 2010, more than half (45%) that when budgets are weakened to a four degree future. The results suggest that without the availability of CCS technology there is an additional 31 Mt CO₂. For greenhouse gases, aligned with a two degree future, emissions in 2050 are estimated to reach a third what they were in 2010.

A sensitivity on Scenario 1 was explored with varying assumptions demand for domestic and imported products (see Appendix 3). Varying demand scenarios for imported goods and services did not result in significant changes in the UK's carbon footprint (see Figure 8), partially reflecting assumptions which ensure that imports and exports and broadly aligned over time – while any increase in imports would increase imported UK emissions, this also translates to decreased demand for UK produced goods and services and increased exports, effectively lowering the domestic contribution to the UK's carbon footprint. In the high imports scenario the average annual growth in demand for imported products is 3.25% compared to a 1.6% growth in demand for domestic products. In the low import demand scenario these figures become 2.25% and 2.2% respectively. As production emissions intensities across countries are broadly similar to the UK's under Scenario 1, even under a high import demand scenario, the UK's carbon footprint is only 6% higher than in the central demand scenario.

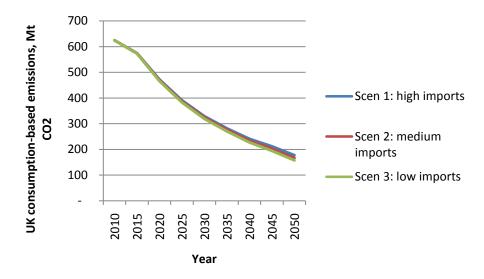


Figure 8: Summary of scenario 1 emission results with different demand patterns, 2010 - 2050

Acknowledgments

We are very grateful to the Integrated Sustainability Analysis (ISA) group at the University of Sydney for providing the Eora database and support.

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Appendix 1: EE-MRIO method

The structure of an EE-IOT is illustrated in Figure 9. Sectoral emissions released directly by sectors are appended to the table. Households also emit GHGs directly¹³ that do not enter production activities and hence the IO calculations. They are added to the consumption-based emissions account post-IOA.

	Purchases by intermediate sectors	Net final demand	Total output
Sales to Intermediate sectors	Z	Y	Х
Value added	V		
Total input	X		_
GHG emissions	F	F	

Figure 9: Basic structure of an EE-IOT

The total output (X_i) of a particular sector can be expressed as:

$$X_{i=}z_{i1} + z_{i2} + \dots + z_{ij} + y_i \tag{1}$$

where z_{ij} is intermediate demand and y_i is the final demand for the Sector i. In this instance output is a measure of the sales of a sector. Alternatively expenditure on inputs equals money generated from sales. A technical coefficients matrix describes intermediate industry input requirements:

$$a_{ij} = \frac{z_{ij}}{X_j} \tag{2}$$

Where a_{ij} are direct input coefficients, z_{ij} the input from Sector i to Sector j and X_j is the total input to Sector j.

Substituting for (2) in equation (1) forms:

$$X_{i=}a_{i1}X_1 + a_{i2}X_2 + \dots + a_{ij}X_i + y_i$$
 (3)

Which, if written in matrix notation is X=AX+Y. Solving for Y gives:

$$X = (I - A)^{-1}Y \tag{4}$$

where X and Y are vectors of total output and final demand, respectively, I is the identity matrix, and A is the technical coefficient matrix. $(I-A)^{-1}$ is known as the Leontief inverse (further identified as L). It indicates the inter-industry requirements of the i^{th} sector to deliver a unit of output to final demand.

$$X = LY (5)$$

¹³ From the burning of fuels for heating and travel

A vector of CO_2 emissions F, shows the volume of emissions generated by industrial sectors. Direct emissions from households are added to the consumption-based account post-IOA. F_{χ} is the emissions per unit of output (the intensity) and multiplying both sides of (4) by F_{χ} gives:

$$F_x X = F_x L Y$$
 and simplifies to $F = F_x L Y$ (6)

Consumption-based emissions are equivalent to pre-multiplying the Leontief inverse by emissions per unit of output and post-multiplying by final demand, in this case UK demand only. The model is demand driven and shows how a unit change in final demand Y, increases the emissions by all sectors to satisfy this change. It assumes a linear relationship between production and changes in final demand, meaning that if final demand for a product doubled, the input requirements and production emissions associated with producing that product would also double. The emissions associated with final demand spend on product y_1 is the sum of:

$$F_{x1}L_{11}y_1 + F_{x2}L_{21}y_1 + ... + F_{xi}L_{i1}y_1$$
 (7)

The emissions of each sector required in the production of product y_1 are reallocated to the demand of this product, rather than the supply. This calculates the emissions associated with product consumption, also referred to as a Carbon or GHG Footprint. Environmental extensions are not limited to greenhouse gas emissions, and include land and resource consumption such as energy and water (Galli et al., 2011).

Appendix 2: EORA sector classification

UK 110 sectors according to Standard Industrial Classification (2007). The 110 sectors were aggregated to higher level sectors for ease of comparison with CCC production sectors. This allocation is provided in the third column.

No	Description	High level sector allocation (by CCC)
1	Products of agriculture, hunting and related services	Agriculture & forestry
2	Products of forestry, logging and related services	Agriculture & forestry
3	Fish and other fishing products; aquaculture products; support services to fishing	Agriculture & forestry
4	Coal and lignite	Industry
5	Crude petroleum and natural gas & metal ores	Industry
6	Other mining and quarrying products	Industry
7	Mining support services	Industry
8	Preserved meat and meat products	Industry
9	Processed and preserved fish, crustaceans, molluscs, fruit and vegetables	Industry
10	Vegetable and animal oils and fats	Industry
11	Dairy products	Industry
12	Grain mill products, starches and starch products	Industry
13	Bakery and farinaceous products	Industry
14	Other food products	Industry
15	Prepared animal feeds	Industry
16	Alcoholic beverages	Industry
17	Soft drinks	Industry
18	Tobacco products	Industry
19	Textiles	Industry
20	Wearing apparel	Industry
21	Leather and related products	Industry
22	Wood and of products of wood and cork, except furniture; articles of straw and plaiting materials	Industry
23	Paper and paper products	Industry
24	Printing and recording services	Industry
25	Coke and refined petroleum products	Industry
26	Paints, varnishes and similar coatings, printing ink and mastics	Industry
27	Soap and detergents, cleaning and polishing preparations, perfumes and toilet preparations	Industry
28	Other chemical products	Industry
29	Industrial gases, inorganics and fertilisers (all inorganic chemicals) - 20.11/13/15	Industry
30	Petrochemicals - 20.14/16/17/60	Industry

31	Dyestuffs, agro-chemicals - 20.12/20	Industry
32	Basic pharmaceutical products and pharmaceutical preparations	Industry
33	Rubber and plastic products	Industry
34	Manufacture of cement, lime, plaster and articles of concrete, cement and plaster	Industry
35	Glass, refractory, clay, other porcelain and ceramic, stone and abrasive products - 23.1-4/7-9	Industry
36	Basic iron and steel	Industry
37	Other basic metals and casting	Industry
38	Weapons and ammunition	Industry
39	Fabricated metal products, excl. machinery and equipment and weapons & ammunition - 25.1-3/25.5-9	Industry
40	Computer, electronic and optical products	Industry
41	Electrical equipment	Industry
42	Machinery and equipment n.e.c.	Industry
43	Motor vehicles, trailers and semi-trailers	Industry
44	Ships and boats	Industry
45	Air and spacecraft and related machinery	Industry
46	Other transport equipment - 30.2/4/9	Industry
47	Furniture	Industry
48	Other manufactured goods	Industry
49	Repair and maintenance of ships and boats	Industry
50	Repair and maintenance of aircraft and spacecraft	Industry
51	Rest of repair; Installation - 33.11-14/17/19/20	Industry
52	Electricity, transmission and distribution	Power
53	Gas; distribution of gaseous fuels through mains; steam and air conditioning supply	Power
54	Natural water; water treatment and supply services	Industry
55	Sewerage services; sewage sludge	Industry
56	Waste collection, treatment and disposal services; materials recovery services	Industry
57	Remediation services and other waste management services	Industry
58	Buildings and building construction works	Industry
59	Constructions and construction works for civil engineering	Industry
60	Specialised construction works	Industry
61	Wholesale and retail trade and repair services of motor vehicles and motorcycles	Services
62	Wholesale trade services, except of motor vehicles and motorcycles	Services
63	Retail trade services, except of motor vehicles and motorcycles	Services
64	Rail transport services	Transport
65	Land transport services and transport services via pipelines, excluding rail transport	Transport
66	Water transport services	Transport
67	Air transport services	Transport
68	Warehousing and support services for transportation	Services
69	Postal and courier services	Services
70	Accommodation services	Services
_		

71	Food and beverage serving services	Services
72	Publishing services	Services
73	Motion picture, video and TV programme production services, sound recording	00.1.000
	& music publishing	Services
74	Programming and broadcasting services	Services
75	Telecommunications services	Services
76	Computer programming, consultancy and related services	Services
77	Information services	Services
78	Financial services, except insurance and pension funding	Services
79	Insurance, reinsurance and pension funding services, except compulsory social security & Pension funding services	Services
80	Services auxiliary to financial services and insurance services	Services
81	Real estate services, excluding on a fee or contract basis and imputed rent	Services
82	Imputed rent services	Services
83	Real estate activities on a fee or contract basis	Services
84	Legal services	Services
85	Accounting, bookkeeping and auditing services; tax consulting services	Services
86	Services of head offices; management consulting services	Services
87	Architectural and engineering services; technical testing and analysis services	Services
88	Scientific research and development services	Services
89	Advertising and market research services	Services
90	Other professional, scientific and technical services	Services
91	Veterinary services	Services
92	Rental and leasing services	Services
93	Employment services	Services
94	Travel agency, tour operator and other reservation services and related services	Services
95	Security and investigation services	Services
96	Services to buildings and landscape	Services
97	Office administrative, office support and other business support services	Services
98	Public administration and defence services; compulsory social security services	Services
99	Education services	Services
	Human health services	
100		Services
101	Residential care services	Services
102	Social work services without accommodation	Services
103	Creative, arts and entertainment services	Services
104	Libraries, archives, museums and other cultural services	Services
105	Gambling and betting services	Services
106	Sports services and amusement and recreation services	Services
107	Services furnished by membership organisations	Services
108	Repair services of computers and personal and household goods	Services
109	Other personal services	Services
110	Services of households as employers of domestic personnel	Services

Rest of world regions Eora 26 harmonised sector Classification. The 26 Eora sectors were aggregated to higher level sectors for ease of comparison with IEA production sectors. This allocation is provided in the third column.

No	Eora sector description	High level sector allocation (by
		ccc)
1	Agriculture	Agriculture, non-private transport,
		non-res buildings, services
2	Fishing	Agriculture, non-private transport,
		non-res buildings, services
3	Mining and Quarrying	Industry
4	Food & Beverages	Industry
5	Textiles and Wearing Apparel	Industry
6	Wood and Paper	Industry
7	Petroleum, Chemical and Non-Metallic Mineral Products	Industry
8	Metal Products	Industry
9	Electrical and Machinery	Industry
10	Transport Equipment	Industry
11	Other Manufacturing	Industry
12	Recycling	Industry
13	Electricity, Gas and Water	Power
14	Construction	Industry
15	Maintenance and Repair	Industry
16	Wholesale Trade	Agriculture, non-private transport,
		non-res buildings, services
17	Retail Trade	Agriculture, non-private transport,
		non-res buildings, services
18	Hotels and Restaurants	Agriculture, non-private transport,
10	-	non-res buildings, services
19	Transport	Agriculture, non-private transport,
20	Post and Telecommunications	non-res buildings, services Agriculture, non-private transport,
20	rost and refeconfindincations	non-res buildings, services
21	Financial Intermediation and Business Activities	Agriculture, non-private transport,
		non-res buildings, services
22	Public Administration	Agriculture, non-private transport,
		non-res buildings, services
23	Education, Health and Other Services	Agriculture, non-private transport,
		non-res buildings, services
24	Private Households	Agriculture, non-private transport,
	Other was	non-res buildings, services
25	Others	N/A
26	Re-export & Re-import	N/A

Appendix 3: Evidence base for scenarios (contributed by the CCC)

The CCC scenarios for future UK consumption emissions incorporate scenarios for UK production emissions together with scenarios for demand, imports and emissions intensity in other countries. These scenarios required making a number of assumptions regarding future emissions trajectories, economic output, and UK demand, which are described in detail below.

The University of Leeds provided the CCC with historic (1993-2010) datasets extracted from Eora¹⁴, which are inputted into the EE-MRIO model to estimate current and historic UK consumption emissions. These datasets included historical trends for the UK (for 110 individual economic sectors) and for seven other world regions (for 26 individual sectors) for the following variables:

- Historic production emissions for both CO₂ and all greenhouse gases (CO₂e)
- Historic sectoral economic output
- Historic emissions intensities (production emissions divided by economic output)
- Final UK demand (in current £) for all goods and services both in the UK and regions assessed

Five scenarios explore the implications of a range of existing high-level global emissions pathways for the UK's consumption-based emissions trajectory. Historical data along with other historical trends and CCC/IEA long-term emissions pathways were used to project future levels of economic output, emissions intensity, and final demand. Developing these projections involved four key steps:

- A. Aligning future emissions pathways with historic emissions data
- B. Projecting future economic output by sector
- C. Calculating future emissions intensities of production (in the UK and rest of the world)
- D. Projecting future UK demand for imported and domestic goods and services

A. Aligning future emissions pathways with historic emissions data

The CCC first aligned high level future UK and rest of the world emissions trajectories with historic emissions data from Eora's sector classification.

i. UK production emissions to 2050

ONS sectors

Historic UK emissions data used for estimating the UK's carbon footprint in the Leeds EE-MRIO model are obtained from the Office for National Statistics Environmental Accounts¹⁵ and are disaggregated to <u>110</u> economic sectors on the basis of SIC codes (see Appendix 2: EORA sector classification).

CCC sectors and pathways to 2050 (production basis)

CCC scenarios for meeting carbon budgets and the 2050 target in the Climate Change Act (to reduce 2050 production emissions by 80% on 1990 levels) examine emissions reductions pathways in the key emitting sectors of the UK's economy, including power generation, buildings and industry, surface transport, international aviation and shipping emissions), agriculture and waste.

¹⁴ Eora World MRIO database (2012), http://www.worldmrio.com/

¹⁵ ONS (2012) Environmental Accounts

In its International Aviation and Shipping advice published in 2012¹⁶ the CCC identified a range of abatement options for reducing emissions across the key emitting sectors to achieve the 2050 target. These options reflected a combination of improved energy efficiency, behaviour change to reduce demand for emitting activities, and increasing use of low-carbon sources of energy supply in place of unabated fossil fuels. The scenarios also reflect the UK's expected growth in population from around 63 million in 2010 to 75 million in 2050 (+19 million).

The CCC developed deployment ranges for key abatement measures in each sector based on detailed modelling of technology costs, deployment constraints and interactions within the energy sectors. Deployment ranges were combined with sectoral deployment levels to create economywide scenarios. These identified how an 80% reduction target could be met, including when some barriers to deployment of technologies cannot be overcome (e.g. potential consumer resistance to uptake of heat pumps or electric vehicles), or in the absence of key technologies (e.g. CCS).

All scenarios meet the 2050 target but with different contributions from individual sectors. For the modelling of future UK consumption emissions, the "Barriers in Industry" production emissions scenario was selected. This scenario was chosen as it required maximum deployment of abatement in just one sector (surface transport). A sensitivity on this scenario, where carbon capture technology is not available, was also explored. In this scenario, additional renewable and nuclear capacity replaces CCS (at higher costs) and (higher cost) electrification of industry as well as full decarbonisation of surface transport is required in order to meet the 2050 target.

The 2012 advice did not model detailed emissions pathways between 2030 and 2050. For the Leeds modelling, the CCC applied a linear trend to estimate annual emissions reductions between 2030 and 2050 in 5-year intervals.

Aligning CCC with ONS sectors

The future emissions pathways for these key emitting sectors needed to be aligned with historic emissions data for the 110 ONS sectors. First, the ONS 110 sectors were aggregated to higher level sectors for ease of comparison with CCC production sectors (see Appendix 2: EORA sector classification for aggregation).

Next, the high level ONS sectors were aligned with the CCC sectors:

- For some sectors, aligning emissions was straightforward (e.g. CCC power sector emissions encompass ONS emissions allocated to SIC code 35 "Electricity, transmission and distribution and Gas; distribution of gaseous fuels through mains; steam and air conditioning supply").
- Aligning emissions arising in the ONS "Services" sectors to CCC sectors was less straightforward.
 Discussions with ONS and Defra suggested that ONS "Services" emissions encompass mainly
 non-residential buildings and surface transport emissions arising from commercial and public
 sector activities. To understand the precise breakdown of Service sector emissions, energy use
 statistics by UK SIC codes¹⁷ were analysed, which suggested that 20% of all surface transport
 emissions are allocated to the Services sector (e.g. are directly emitted by Services sectors).
- ONS Environmental Accounts emissions differentiate between direct household travel (e.g. emissions arising from personal car use by residents) and surface transport emissions occurring

¹⁶ CCC (2012) The 2050 target – achieving an 80% reduction including emissions from international aviation and shipping, http://www.theccc.org.uk/publication/international-aviation-shipping-review/

¹⁷ ONS (2013) Energy Use by Industry - Source and Fuel, 1990-2010

in the rest of the economy. CCC scenarios for future surface transport emissions do not make this distinction. Analysis of energy use statistics showed that 60% of UK transport emissions are related to private transport. This assumption was applied forward (i.e. 60% of surface transport emissions in the CCC scenarios were allocated to the ONS direct household travel sector).

• As a result, only 20% of surface transport emissions in the CCC's scenarios were assigned to the ONS transport sector (60% are assigned to private transport and 20% to Services).

Table A3.1 describes how CCC production emissions were allocated to the high level ONS sectors.

Table A3.1 Alignment of CCC UK production emission sectors with ONS high level sectors

ONS high level sectors	CCC production emission sectors
Agriculture & forestry	Agriculture & forestry emissions
Industry	Industry emissions
Power	Power emissions
Services	20% Surface transport emissions
	All non-residential buildings emissions
Transport	20% Surface transport emissions
	All International aviation & shipping emissions
Direct household transport	60% of Surface transport emissions
Direct household heat	Residential buildings emissions

ii. Rest of the world production emissions to 2050

The International Energy Agency (IEA) provided detailed emissions trajectories by sector and region from its 2012 *Energy Technology Perspectives* (ETP) publication, which explores global emission scenarios and strategies to achieve the objective of limiting the global average temperature rise to 2°C (2DS). It also explores less ambitious energy futures including a scenario where international actions do not go beyond the pledges made at the UN Climate Change Conference in Copenhagen in 2009. This scenario is projected to lead to a long-term temperature rise of 4°C (4DS):

The IEA ETP model explores pathways for reducing emissions in the following high-level sectors:

- Power generation
- Industry (and other transformation)
- Transport
- Residential and commercial buildings
- Energy-related emission from agriculture, fisheries, and other activities.

The ETP model covers CO_2 emissions only from 28 regions. The CCC requested that the IEA aggregate emissions data to the seven regions selected in the EE-MRIO, including OECD Europe (as a proxy for the European Union), rest of the OECD, China, India, the rest of developing Asia, Russia, and rest of the world). Table A3.2 details IEA emissions trajectories by sector and region for the 2DS scenario.

Table A3.2 IEA two degree emissions scenario by region and sector (Mt CO₂)

	Scenario	2009	2010	2015	2020	2025	2030	2035	2040	2045	2050
OECD Europe	2DS	3,888	3,963	3,876	3,749	3,184	2,771	2,366	2,107	1,868	1,659
All other OECD	2DS	8,549	8,745	8,842	8,621	7,530	6,139	5,021	4,232	3,622	3,146
China	2DS	7,897	8,378	9,419	9,537	8,438	6,835	5,327	4,354	3,907	3,561
India	2DS	1,727	1,795	2,278	2,338	2,127	1,985	1,972	1,978	1,996	1,913
Rest of developing Asia	2DS	1,701	1,754	2,000	2,072	1,946	1,807	1,681	1,574	1,504	1,406
Russia	2DS	1,709	1,701	1,622	1,506	1,334	1,169	1,017	885	764	657
ROW	2DS	5,608	5,786	6,178	6,261	5,843	5,391	4,956	4,605	4,258	3,811
Total		31,079	32,122	34,216	34,085	30,403	26,098	22,342	19,734	17,919	16,152
	Scenario	2009	2010	2015							
		2003	2010	2013	2020	2025	2030	2035	2040	2045	2050
Power generation	2DS	11,827	12,048	13,298	12,766	2025 10,062	7,183	2035 4,836	2040 3,418	2045 2,868	2050 2,351
Power generation Industry	2DS 2DS										
	2DS	11,827	12,048	13,298	12,766	10,062	7,183	4,836	3,418	2,868	2,351
Industry	2DS	11,827 7,864	12,048 8,347	13,298 8,862	12,766 8,923	10,062 8,636	7,183 8,168	4,836 7,710	3,418 7,419	2,868 7,082	2,351 6,695
Industry Non-residential building	2DS 2DS	11,827 7,864 874	12,048 8,347 858	13,298 8,862 869	12,766 8,923 883	10,062 8,636 895	7,183 8,168 897	4,836 7,710 870	3,418 7,419 839	2,868 7,082 809	2,351 6,695 779
Industry Non-residential building Residential buildings	2DS 2DS 2DS	11,827 7,864 874 1,924	12,048 8,347 858 1,930	13,298 8,862 869 1,857	12,766 8,923 883 1,812	10,062 8,636 895 1,753	7,183 8,168 897 1,666	4,836 7,710 870 1,578	3,418 7,419 839 1,491	2,868 7,082 809 1,395	2,351 6,695 779 1,296
Industry Non-residential building Residential buildings Transport	2DS 2DS 2DS 2DS 2DS 2DS	11,827 7,864 874 1,924 6,422	12,048 8,347 858 1,930 6,756	13,298 8,862 869 1,857 6,907	12,766 8,923 883 1,812 7,339	10,062 8,636 895 1,753 6,926	7,183 8,168 897 1,666 6,385	4,836 7,710 870 1,578 5,889	3,418 7,419 839 1,491 5,460	2,868 7,082 809 1,395 5,014	2,351 6,695 779 1,296 4,676

Source: IEA (2012) Energy Technology Perspectives

The next step aligned historic Eora sectoral emissions data with IEA sectoral emissions trajectories:

- First, UK CO₂ emissions data was subtracted from the IEA CO₂ emissions data set to better compare IEA emissions data with Eora rest of the world emissions data provided to the CCC.
- As in the UK analysis, aligning ONS emissions for the Service and Transport sector with IEA emissions pathways was less straightforward.
 - First, emissions released directly by households abroad (e.g. residential heating and private transport) were subtracted from IEA emissions pathways data as they are not part of intermediate production activities and therefore do not become embodied in UK imports.
 - IEA scenarios for buildings emissions distinguish between residential and non-residential emissions, so subtracting residential emissions was straightforward.
 - However, IEA transport sector emissions scenarios do not differentiate between household and non-household travel. Eora contains direct household emissions for all regions however these are not split by heating and travel, but rather aligned with EDGAR emissions for the residential sector. This split was interpolated by examining the proportion of IEA residential building emissions as a proportion of total Eora direct household emissions data (i.e. including residential buildings and transport).
- Having re-aligned IEA emissions data to the Eora high level sectors, emissions data for 2010 between the two datasets were compared. In power and industry sectors, emissions data were found to be similar in IEA and Eora databases (+/10% difference). Agriculture and forestry, services, and transport sector emissions data were quite different therefore these IEA sectors were aggregated to one sector where they better aligned with Eora data (5% difference).

Table A3.3 below compares emissions data between Eora and IEA.

Taking the high level CCC domestic production sectors and the three IEA sectors (power, industry and a combined sector of agriculture, transport, and services) the CCC used proportional analysis to model detailed sectoral emissions trajectories using CCC/IEA emissions trajectories out to 2050. For example, if emission from textiles production represented 3% of total Chinese industry emissions in

2010, it was assumed that Chinese textiles emissions would continue to represent 3% of total emissions under the IEA's decarbonisation pathways for Chinese industrial emissions.

Table A3.3 Comparison of 2010 global CO₂ emissions (excluding UK) in IEA and Eora databases

MtCO ₂	IEA	Eora	% difference
Power	12,048	12,783	6%
Industry	9,811	8,613	-12%
Agriculture, non-private transport, non-res buildings, services	8,095	8,515	5%

iii. Emissions scenarios

The above steps were repeated for <u>five</u> scenarios incorporating various emissions pathways in the UK and rest of the world. As IEA covers reductions in energy-related CO_2 emissions only, most scenarios focused on estimating the UK's carbon footprint for CO_2 emissions only. A final scenario (Scenario 5) includes non- CO_2 emissions. These scenarios are described below:

- 1. **2 degree future (CO₂):** The UK reduces its emissions to meet its 2050 target compatible with the 2 degree climate objective ("Barriers in industry" scenario described above). Rest of the world emissions follow the IEA's 2DS emissions scenario.
- 2. 2 degree future without availability of CCS technology (CO₂): The UK meets its 2050 target but without the availability of CCS (thus requiring more deployment of renewable and nuclear, electrification in industry, and full decarbonisation of transport). Rest of the world emissions fall in line with the IEA's 2DS scenario but without the availability of CCS (thus global emissions are higher than the 2DS scenario).
- 3. 2 degree future with overseas production intensities converging to UK intensities (CO₂): Rest of the world emissions intensities fall in line with the UK's (reflecting a 2 degree "Barriers in industry" scenario) starting in 2030.
- **4. 4 degree future (CO₂):** The UK meets its 2050 target under a "Barriers in industry" scenario but rest of the world emissions fall in line with the IEA's 4DS scenario.
- 5. **2 degree future including all GHGs:** As the UK's 2050 target is based on all GHGs, a scenario for non-CO₂ emissions reductions based on climate modelling work described in the CCC's 2008 report on setting 2050 target¹⁸ was explored:
 - This modelling explored several pathways for reductions in all greenhouse gases
 - We used a 2DS scenario consistent with IEA, where non-CO₂ emissions are around 7.6 GtCO₂e in 2050
 - Eora emissions data for CO₂ were subtracted from all CO₂e data to determine non-CO₂ emissions for each sector and region in 2010 (totalling around 12.8 GtCO₂e).

¹⁸ CCC and Met Office Hadley Centre analysis for CCC (2008), Building a low-carbon economy – the UK's contribution to tackling climate change, Chapter 1 Technical Appendix: Projecting global emissions, concentrations, and temperatures.

 Using proportional analysis, non-CO₂ emissions in each sector by region were reduced in line with global non-CO₂ emissions pathways (less UK non-CO₂ emissions).

As a result, detailed emissions trajectories for each scenario for 110 UK sectors and 26 sectors in each of the seven trading regions were developed (between 2010 and 2050).

B. Projecting future economic output by sector

Having modelled detailed emissions pathways for each sector in step A, the next step was to project economic output for all regions and sectors. Office for Budget Responsibility (OBR) projections were used to project UK economic output for the whole economy and IMF and other sources were used to project economic output in the seven trading regions (Table A3.4).

As for emissions data, proportional analysis was used to project economic growth by sector, such that a given sector was assumed to account for the same proportion of total economic output in 2010 as in 2050. These assumptions therefore do not account for structural changes in the economy.

Table A3.4 CCC assumptions for annual growth in regional economic output

	2011-15	2016-20	2021-25	2026-30	2031-35	2036-40	2041-50
Rest of OECD							
Europe	1.7%	1.9%	2.8%	1.9%	1.4%	1.2%	1.5%
Rest of world	4.9%	3.7%	3.8%	3.3%	2.9%	3.0%	3.9%
China	8.5%	10.2%	8.0%	5.6%	4.7%	3.9%	2.8%
India	6.2%	9.3%	8.8%	7.5%	8.1%	7.5%	5.5%
United Kingdom	1.3%	1.9%	2.7%	2.0%	1.5%	1.1%	1.4%
Russia	3.9%	4.4%	3.1%	4.6%	6.9%	6.6%	3.6%
Rest of dev. Asia	7.2%	6.7%	6.0%	4.0%	2.9%	2.5%	3.3%
Rest of OECD	2.9%	2.5%	2.6%	2.2%	2.0%	1.8%	2.0%

Source: OBR (2012); Department for Transport (2013) obtained from a combination of IMF projections and assumptions used by DECC,

https://www.gov.uk/government/uploads/system/uploads/attachment_data/file/183931/aviation-forecasts.pdf

C. Calculating future emissions intensities of production

Taking together projections for emissions and economic output by sector (110 for the UK and 26 for all other regions), we estimated emissions intensities out to 2050 (sectoral emissions divided by sectoral economic output).

D. Projecting future UK demand for imported and domestic goods and services

i. Final demand

To account for sensitivity in consumption-based emissions resulting from trade patterns, growing demand is met by three levels of demand between domestic and imported products. These assumptions are summarised in Table A3.5.

Table A3.5 CCC assumptions for growth in imports and domestic demand

	Demand (annual	growth, 2010-2050)	
Scenario	Imports	Domestic demand	Source/Notes
Low imports	2.25%	2.2%	Import growth in line with average long-run UK GDP
			growth; UK demand for domestic goods/service
			adjusted such that trade balance similar to current
			levels (deficit less than 10%).
Central imports	2.75%	1.9%	Import growth halfway between low/high import
			growth scenario, reflecting increase in import share
			of GDP to ~40% in 2050; domestic demand growth
			adjusted to maintain trade balance.
High imports	3.25%	1.6%	Import growth in line with historic rate of import
			growth from 1975-2011. This rate may not be
			sustainable in future as it reflects a period of strong
			growth in trade and would imply an increase in
			imports share of GDP to 50% in 2050 (and therefore
			is applied in the high demand scenario).

ii. Import penetration by region

As UK imports have gradually shifted away from the rest of Europe towards emerging economies, we assumed that UK import demand continues to shift towards emerging economies, although at less than recent rates, such that by 2050, 50% of UK imports are from emerging economies, including China and India. Table A3.4 provides more detail of our assumptions.

Table A3.4

UK import demand share (historic and CCC projections)														
		1993	1995	2000	2005	2010	2015	2020	2025	2030	2035	2040	2045	2050
Emerging	Rest of developing Asia	4%	4%	4%	4%	8%	9%	10%	12%	13%	14%	15%	17%	18%
Advanced	Rest of OECD Europe	66%	63%	64%	59%	47%	45%	43%	41%	40%	38%	36%	34%	33%
Emerging	India	0%	0%	1%	1%	1%	1%	1%	2%	2%	2%	2%	3%	3%
Advanced	Rest of OECD	16%	18%	17%	17%	25%	24%	23%	22%	21%	20%	19%	18%	17%
Emerging	Rest of world	11%	9%	11%	12%	11%	11%	10%	10%	10%	10%	10%	10%	10%
Emerging	China	2%	4%	2%	5%	7%	8%	10%	11%	12%	14%	15%	16%	18%
Emerging	Russia	1%	2%	2%	3%	2%	2%	2%	2%	2%	2%	2%	2%	2%
		100%	100%	100%	100%	100%	100%	100%	100%	100%	100%	100%	100%	100%
	Emerging	18%	19%	19%	24%	29%	31%	34%	36%	39%	42%	45%	47%	50%
	Advanced	82%	81%	81%	76%	71%	69%	66%	64%	61%	58%	55%	53%	50%
		100%	100%	100%	100%	100%	100%	100%	100%	100%	100%	100%	100%	100%

iii. Shift in demand away from fossil fuels

As the UK moves to a low-carbon economy, demand for fossil fuels and associated products is likely to decrease and move towards other goods and services. To explore this future, the scenarios incorporate a shift away from fossil fuels sectors and towards all other economic sectors (on an equal basis). Exploring this shift for imported goods and services was complicated by the fact that final demand for fossil fuels data from Eora is only available in the higher level economic sector "Petroleum, chemicals and non-metallic minerals" which covers a broad set of sub-sectors including fossil fuels (both crude and refined), petrochemicals/petrochemical products, other chemical products such as pharmaceuticals, and minerals such as cement, ceramics, glass and lime.

To understand the breakdown of imports for fossil fuels for energy use, HMRC highly disaggregated trade data was examined. HMRC data showed that around 50-60% of imports in the aggregated category are related to fossil fuels, so this share was applied forward for future demand. While UK demand for other products within the sector (chemicals, non-metallic mineral products, petrochemicals) was forecast to increase at the projected rates (see "Final demand" above), demand for fossil fuels for energy use gradually declines over time.