Background qualitative analysis of the European reference life cycle database (ELCD) energy datasets – part II: electricity datasets

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Abstract

The aim of this paper is to identify areas of potential improvement of the European Reference Life Cycle Database (ELCD) electricity datasets. The revision is based on the data quality indicators described by the International Life Cycle Data system (ILCD) Handbook, applied on sectorial basis. These indicators evaluate the technological, geographical and time-related representativeness of the dataset and the appropriateness in terms of completeness, precision and methodology. Results show that ELCD electricity datasets have a very good quality in general terms, nevertheless some findings and recommendations in order to improve the quality of Life-Cycle Inventories have been derived. Moreover, these results ensure the quality of the electricity-related datasets to any LCA practitioner, and provide insights related to the limitations and assumptions underlying in the datasets modelling. Giving this information, the LCA practitioner will be able to decide whether the use of the ELCD electricity datasets is appropriate based on the goal and scope of the analysis to be conducted. The methodological approach would be also useful for dataset developers and reviewers, in order to improve the overall Data Quality Requirements of databases.

Keywords: ELCD; Electricity; ILCD, Data Quality

Introduction

The European Platform of Life Cycle Assessment (EPLCA), a project initiated by the Institute for Environment and Sustainability (IES), has the objective of promoting Life Cycle Thinking (LCT) and providing appropriate support to business and public administrations within the European Union (EU), as well as in close coordination with international activities. This support is essential, and is being achieved through the development of a number of different deliverables, being the European Reference Life Cycle Database (ELCD) one of them. The ELCD provides core Life Cycle Inventory (LCI) data from front-running EU-level business associations and, where not available, other sources. Several energy-related data are provided within the ELCD, since energy is a key input to most environmental analyses of products or processes. The ELCD latest version can be consulted on the JRC webpage: http://eplca.jrc.ec.europa.eu/ELCD3/.

Data quality in LCA still represents a major bottleneck to a broader use of LCA and environmental footprint methods in business and in policy (Fazio et al. Method applied to the background analysis of energy data to be considered for the European Reference Life Cycle Database (ELCD). Springer Plus – Submitted in 2014). Under the framework of ISO standards (ISO 14044:2006) some guidelines have been developed to address several requirements: ILCD handbook, UNEP/SETAC LC Initiative, or USLCI Database (Garraín et al. Background qualitative analysis of the European Reference Life Cycle Database (ELCD) energy datasets – Part I: Fuel datasets. Springer Plus - Submitted in 2014).

The objective of this analysis is to identify areas of potential improvement of the ELCD electricity datasets quality, considering data available in third party life cycle databases and from authoritative bodies and/or business associations. The work has consisted in analysing and comparing electricity datasets from different databases, considering the ELCD database as the basis for this
analysis. This effort has been carried out in two stages: i) Selection of datasets, databases and quality standards, in order to assure the methodology, ii) Analysis and qualitative comparison of the datasets, each selected electricity dataset was analysed according to previously defined quality standards. Then, findings and recommendations were derived in order to identify the potential improvements of ELCD datasets.

Methodology
Selection of datasets and databases
The energy datasets to be analysed should be representative of a significant share (such as 40 to 60%) of the European electricity market and associated technology mixes/geographic origins, therefore a deep review of the most updated data in terms of electricity for EU-27 has been conducted.

According to European statistics (EUROSTAT, 2012; EC, 2011), the energy sources that contribute the most to electricity generation in 2011 were the following: Nuclear (27%), coal (26%), gas (23%), hydro (13%) and wind (4%). Other renewable energy sources have lower contribution to electricity generation in EU-27, such as biomass and waste, and solar energy (3% and 0.68%, respectively). However, due to their foreseen potentials, their contribution is expected to increase in the future. So, electricity from these sources was considered for the analysis. An electricity mix for EU-27 was also taken into account.

The latest ELCD version includes one dataset of European average electricity mix as well as electricity mix datasets from each EU-27 country. However, the unit processes used to build the datasets cannot be broken down into technologies. This limitation had to be solved, since the final objective of the analysis is to analyse the quality of the different datasets, focusing on the underlying models and data used. These ELCD electricity mix datasets by country have been originated from PE International (GaBi 2012). Taking into account the above mentioned limitation, the use of specific datasets from GaBi for conducting the analysis seemed to be essential. Whenever ELCD database did not provide the required datasets, GaBi datasets from the last updated version were analysed. It must be noticed that GaBi provides these datasets for each EU-27 country, but does not include datasets for each technology referring to the European context (which are available in the developer’s internal database -PE International-, but so far not in the commercially available databases, i.e. electricity production from hard coal, European Mix). As a first approximation, in order to take into account the European energy market, the datasets by country were chosen from GaBi database considering only those countries that sum up 60% of the electricity produced in Europe for each technology (this value has been decided by the leaders of this evaluation as a first approach, and considering that it will be representative enough for the European energy market). Hereinafter, the nomenclature of ELCD energy datasets will refer to GaBi datasets.

In order to identify those countries that sum up more than 60% of the electricity produced in Europe by technology, data of electricity production by sources from Eurostat (data from 2010) were collected and analysed. Germany (23%), United Kingdom (21%) and Poland (20%) were the main producers of electricity from hard coal; Germany (41%), Czech Republic (14%), Poland (14%) and Greece (9%) were the main contributors to lignite electricity production; the main producers of electricity from natural gas were United Kingdom (20%), Italy (20%), Germany (13%)

Table 1 List of the selected ELCD electricity datasets as basis for comparison

| Electricity from | Location | Name of LCI process/dataset |
|-----------------|----------|-----------------------------|
| Mix | EU-27 | EU-27: Electricity grid mix (1 kV - 60 kV) |
| Coal | Germany | DE: Electricity from hard coal (1 kV - 60 kV) |
|     | United Kingdom | GB: Electricity from hard coal (1 kV - 60 kV) |
| Lignite | Germany | DE: Electricity from lignite (1 kV - 60 kV) |
|     | Greece | GR: Electricity from lignite (1 kV - 60 kV) |
|     | Poland | PL: Electricity from lignite (1 kV - 60 kV) |
|     | Czech Republic | CZ: Electricity from lignite (1 kV - 60 kV) |
| Natural gas | United Kingdom | GB: Electricity from natural gas (1 kV - 60 kV) |
|     | Italy | IT: Electricity from natural gas (1 kV - 60 kV) |
|     | Germany | DE: Electricity from natural gas (1 kV - 60 kV) |
|     | Spain | ES: Electricity from natural gas (1 kV - 60 kV) |
| Nuclear power | France | FR: Electricity from nuclear (1 kV - 60 kV) |
|     | Germany | DE: Electricity from nuclear (1 kV - 60 kV) |
| Hydropower | EU-27 | EU-27: Electricity from hydro power (1 kV - 60 kV) |
| Wind power | European average | RER: Electricity from wind power (1 kV - 60 kV) |
| Biomass | Germany | DE: Electricity from biomass (solid) (1 kV - 60 kV) |
| Solar | Germany | DE: Electricity from photovoltaic (1 kV - 60 kV) |
and Spain (10%); and the main producers of electricity from nuclear power were France (47%) and Germany (15%). Then, Table 1 shows the eighteen chosen datasets as the base for the comparison with other datasets.

These datasets have been compared to their counterparts from three other databases: Ecoinvent v2.2 (Ecoinvent 2012), GEMIS 4.7 (GEMIS 2012), and E3 database (E3 2012). Considering theses databases and the availability of datasets, Table 2 presents the list of datasets to be finally analysed. The database selection have been made irrespective of the methodological compliance of the database/datasets with the ILCD quality criteria: it was indeed assumed that although other databases might have lower data quality rating (DQR) according to ILCD rules (because they were not specifically developed using these rules), datasets would represent interesting benchmarks and

| ELCD | Ecoinvent v2.2 | GEMIS 4.7 | E3 |
|------|---------------|-----------|----|
| EU-27: Electricity grid mix | Electricity, medium voltage, production RER, at grid/RER | El-generation-mix-EU-27-2010 (PRIMES) | Electricity/Electricity-Mix-EU (10-20 kV-level) |
| DE: Electricity from hard coal | Electricity, hard coal, at power plant/DE | Coal-ST-DE-import-2005 | Power Station/Hard Coal/ST/Germany |
| GB: Electricity from hard coal | - | Coal-ST-UK-2005 | - |
| PL: Electricity from hard coal | Electricity, hard coal, at power plant/PL | Coal-ST-PL-2005 | - |
| DE: Electricity from lignite | Electricity, lignite, at power plant/DE | Lignite-ST-DE-2005 Rhine | Lignite-ST-DE-2005 Lausitz |
| GR: Electricity from lignite | Electricity, lignite, at power plant/GR | Lignite-ST-GR-2010 | Power Station/Lignite ST/Rhine GER |
| PL: Electricity from lignite | Electricity, lignite, at power plant/PL | Lignite-ST-PL-2010 | - |
| CZ: Electricity from lignite | Electricity, lignite, at power plant/CZ | Lignite-ST-CZ-HU 4x200 2005 | - |
| GB: Electricity from natural gas | Electricity, natural gas, at power plant/GB | Gas-CC-UK-2010 | - |
| IT: Electricity from natural gas | Electriciy, natural gas, at power plant/IT | Gas-CC-IT-2010 | - |
| DE: Electricity from natural gas | Electricity, natural gas, at power plant/DE | Gas-CC-DE-2010 | Power Station/NG/CCGT |
| ES: Electricity from natural gas | Electricity, natural gas, at power plant/ES | Gas-CC-ES-2010 | - |
| FR: Electricity from nuclear | Electricity, nuclear, at power plant/FR | Nucler-powerplant-PWR-FR-2000 | Power Station/Nuclear (DWR-F) |
| Nucler-powerplant-PWR-FR-2010 (EPR) | Power Station/Nuclear/PWR-GER |
| DE: Electricity from nuclear | Electricity, nuclear, at power plant/DE | Nucler-powerplant-PWR-DE-2005 | - |
| EU-27: Electricity from hydro power | Electricity, hydropower, at run-of-river power plant/RER | Hydro-dam-big-generic | Power Station/Wind/on-shore/Enenercon E-66/20.70 (Germany) |
| DE: Electricity from wind power | Electricity, hydropower, at reservoir power plant/RER | Windfarm-big-generic | Power Station/Wind/off-shore/Horns Rev |
| RER: Electricity from wind power | Electricity, at wind power plant/RER | Wind-farm-big-generic | Power Station/Wind/off-shore/Horns Rev |
| DE: Electricity from biomass (solid) | - | Biomass-ST-EU-2010 | Power Station/Biomass/ST CHP/Pfaffenhofen |
| DE: Electricity from photovoltaic | Electricity, production mix photovoltaic, at plant/DE | Solar-PV-mon-framed-with-rack-DE-2010 | Power Station/Photovoltaic/multi crystalline (990 kWh) |
| Solar-PV-multi-framed-with-rack-DE-2010 | Power Station/Photovoltaic/multi crystalline (990 kWh) |
some improvement could be derived from the background analysis (Fazio et al. Method applied to the background analysis of energy data to be considered for the European Reference Life Cycle Database (ELCD). Springer Plus – Submitted in 2014).

Quality criteria for analysis
The evaluation has been based on the quality indicators developed within the ILCD handbook (EC-JRC, 2010a, 2010b, 2011): Technological representativeness (TeR), Geographical representativeness (GR), Time-related representativeness (TiR), Completeness (C), Precision/Uncertainty (P) and Methodological appropriateness and consistency (M). Each of those has been evaluated according to the degree of accomplishment of the criterion (from 1 to 5), and an overall DQR of the datasets has been calculated by summing up the achieved quality rating for each of the quality criteria indicator, divided by the total number of considered indicators, as described in Garraín et al. Background qualitative analysis of the European Reference Life Cycle Database (ELCD) energy datasets – Part I: Fuel datasets. Springer Plus - Submitted in 2014.

The quality indicators described in the ILCD Handbook (EC-JRC, 2011) provide a general framework to evaluate datasets. When applying these indicators to specific sectorial datasets, it is necessary to redefine them based on the specific characteristics of the processes/technologies in order to identify key aspects. For this purpose, a deep pre-analysis of the technology situation was conducted, considering the European market context. The main features for assessing each criterion are similar to those described in Fazio et al. Method applied to the background analysis of energy data to be considered for the European Reference Life Cycle Database (ELCD). Springer Plus – Submitted in 2014 and Garraín et al. Background qualitative analysis of the European Reference Life Cycle Database (ELCD) energy datasets – Part I: Fuel datasets. Springer Plus - Submitted in 2014. Table 3 shows both quality criteria definitions and values considered.

Table 3 Matrix for assessing LCI of electricity datasets

| Quality indicator | Sub-quality parameters | Rating | 1 (Very Good) | 2 (Good) | 3 (Fair) | 4 (Poor) | 5 (Very Poor) |
|-------------------|------------------------|--------|---------------|----------|----------|----------|--------------|
| TeR               | Expert judgement based on the consideration of a technology mix | Technology aspects have been modelled as the technology mix | Technology aspects are very similar to the technology mix | Technology aspects are similar to the technology mix | Technology aspects are different to the technology mix | Technology aspects are completely different to the technology mix |
| GR                | Expert judgement based on geographical coverage of data | The list of countries is the same as the referenced countries | The list of countries is very similar to the referenced countries | The list of countries is slightly different from the referenced countries | The list of countries is significantly different from the referenced countries | The list of countries is totally different from the referenced countries |
| TiR               | Expert judgement based on defined time on data inventory (±5 years) | The majority of the data sources refer to the defined time | At least half of the data sources refer to the defined time | Less than half of the data sources refer to the defined time | None of the data sources refer to the defined time |
| C                 | Consideration of impact categories and share of elementary flows (to adjust the final rating) | 15-16 considered impact categories | 12-14 considered impact categories | 8-11 considered impact categories | 5-7 considered impact categories | <5 considered impact categories |
| P                 | Expert judgement based on the precision/uncertainty of data sources | Very low uncertainty and/or very high precision | Low uncertainty and/or high precision | Fair uncertainty and/or fair precision | High uncertainty and/or low precision | Very high uncertainty and/or very low precision |
| M                 | Definition of situation context and subsequent expert judgement of system boundaries, multi-functionality and EoL | Inclusion of all LCA stages (with the EoL stage). Consideration of allocation procedures. Completion in a very high degree | Inclusion of most relevant LCA stages. Consideration of allocation procedures. Completion in a high degree | Inclusion of a still sufficient LCA stages. Consideration of allocation procedures. Completion in a sufficient degree | Inclusion of a sufficient LCA stages. Consideration of allocation procedures. Completion in a low degree | No inclusion of sufficient LCA stages. No consideration of allocation procedures (multi-functionality has not been solved according to the situation context). Completion in a low degree |
| Datasets                          | Database | DQI | Score | Short justification of DQI                                                                 | DQR |
|----------------------------------|----------|-----|-------|------------------------------------------------------------------------------------------|-----|
| Electricity grid mix (EU27)      | ELCD     | TeR | 1     | Modelled as the EU27 technology mix. Each Member State modelled with the own technology mix | 1.17|
|                                  |          | GR  | 1     | Modelled according the most updated EU27 country mix                                      |     |
|                                  |          | TiR | 1     | Ref. year 2009, data from 2006-2010                                                       |     |
|                                  |          | C   | 1     | 100% of impact categories and 95% of reference flows covered                               |     |
|                                  |          | P   | 2     | Sources from national statistics and IEA, relevant flows measured. Elementary flows are quantified |     |
|                                  |          | M   | 1     | Cradle-to-grave, EoL included, exergetic and market value allocation                       |     |
| GR 1                            |          |     |       |                                                                                           |     |
|                                 |          | TiR | 2     | Ref. year 2004, data from average production in 2000. Reference period 2000-2002, some references from '90s |     |
|                                 |          | C   | 1     | 100% of impact categories and 100% of reference flows covered                              |     |
|                                 |          | P   | 2     | References from authoritative sources, but no info about emission factors or direct emissions |     |
|                                 |          | M   | 3     | Cradle-to-grave, EoL not included, allocation only in wastes                               |     |
|                                 |          |     |       |                                                                                           |     |
| GEMIS                            | Ecoinvent| TeR | 1     | Modelled as the EU technology mix. Each country modelled with the own technology mix       | 1.92|
|                                 |          | GR  | 2     | EU27 are included except Baltic countries. Norway, Switzerland and countries of former state of Yugoslavia are included |     |
|                                 |          | TiR | 2     | Ref. year 2004, data from average production in 2000. Reference period 2000-2002, some references from '90s |     |
|                                 |          | C   | 1     | 100% of impact categories and 100% of reference flows covered                              |     |
|                                 |          | P   | 2     | References from authoritative sources, but no info about emission factors or direct emissions |     |
|                                 |          | M   | 3     | Cradle-to-grave, EoL not included, allocation applied but not defined                      |     |
|                                 |          |     |       |                                                                                           |     |
| E3                               |          | TeR | 3     | Modelled as the technology mix, but obsolete (1999)                                       | 3.17|
|                                 |          | GR  | 4     | Electricity mix from 1999 (EU-15)                                                         |     |
|                                 |          | TiR | 2     | Ref. year 1999, data from JEC (2007)                                                      |     |
|                                 |          | C   | 2     | Less than 50% impact categories, 90% of reference flows covered                           |     |
|                                 |          | P   | 3     | Sources are relevant, but no info about emission factors or direct emissions              |     |
|                                 |          | M   | 3     | Cradle-to-grave, EoL not included, allocation applied but not defined                      |     |
|                                 |          |     |       |                                                                                           |     |
| Electricity from hard coal (DE)  | ELCD     | TeR | 1     | Both electricity and CHP plants considered, use of technology mix                          | 1.50|
|                                 |          | GR  | 2     | Domestic production and imports considered, but slightly differences in shares of each country with the reference |     |
|                                 |          | TiR | 2     | Ref. year 2009, data from 2006-2010. Some emission data from '90s                          |     |
|                                 |          | C   | 1     | 100% of impact categories and 96% of reference flows covered                               |     |
|                                 |          | P   | 2     | References from relevant literature and authoritative sources. Some emission data from outdated and no German conditions studies |     |
|                                 |          | M   | 1     | Cradle-to-grave, EoL included, exergetic and market value allocation                       |     |
|                                 |          |     |       |                                                                                           |     |
|                                 | EcoInvent| TeR | 2     | Modelled as an average plant in EU, in German conditions. Infrastructure based in 2 units from '80s | 2.00|
|                                 |          | GR  | 3     | Import countries fulfilled, but the share differs to the value in 2000                    |     |
|                                 |          | TiR | 2     | Ref. year 1993-2000, data from 1991-2004 (mainly from '90s)                                 |     |
|                                 |          | C   | 1     | 100% of impact categories and 100% of reference flows covered                              |     |
|                                 |          | P   | 2     | Emission from calculated data from power plants (internal document)                       |     |
|                                 |          | M   | 2     | Cradle-to-grave, EoL not included but info about treatment of outputs, energy content allocation included (only in hard coal coke) |     |
| Dataset                        | TeR | Criteria                        | Value |
|-------------------------------|-----|---------------------------------|-------|
| GEMIS                         | 3   | Modelled as a single plant in Germany | 2.50  |
|                               | 3   | Import countries are the same as the reference, but no share of domestic vs imported hard coal |       |
|                               | 2   | Ref. year 2005, data from 2001-2009 |       |
|                               | 2   | 75% of impact categories and 90% of reference flows covered |       |
|                               | 2   | Sources are authoritative sources, but no info about emission factors or direct emissions |       |
|                               | 3   | Cradle-to-grave, EoL not included, allocation applied but not defined |       |
| E3                            | 3   | Modelled as a single plant in Germany | 3.67  |
|                               | 4   | Consideration of EU mix of hard coal in 2009 (very different from the German coal imports in 2005) |       |
|                               | 3   | Ref. year 2005, data from 2001-2009 (plants and mining) and from '90s (statistical data) |       |
|                               | 4   | Less than 50% impact categories, 90% flows covered |       |
|                               | 3   | Sources are relevant, but no info about emission factors or direct emissions |       |
|                               | 5   | Cradle-to-gate, EoL not included, allocation not defined (assumed as GEMIS) |       |
| Electricity from lignite (DE) | 1   | Both electricity and CHP plants considered, use of technology mix | 1.33  |
|                               | 1   | Domestic production (only 0.02% imported) and most updated data |       |
|                               | 2   | Ref. year 2009, data from 2006-2010. Some emission data from '90s |       |
|                               | 1   | 100% of impact categories and 96% of reference flows covered |       |
|                               | 2   | References from relevant literature and authoritative sources. Some emission data from outdated and no German conditions studies |       |
|                               | 1   | Cradle-to-grave, EoL included, exergetic and market value allocation |       |
| Ecoinvent                     | 2   | Modelled as an average plant in EU, in German conditions. Infrastructure based in 2 units from '80s | 1.92  |
|                               | 2   | Average EU conditions (RER) in lignite mining and power plant |       |
|                               | 2   | Ref. year 1993-2000 (technology) and 1980-1992 (plants), data from 1991-2004 (mainly from '90s) |       |
|                               | 1   | 100% of impact categories and 100% of reference flows covered |       |
|                               | 2   | Emission from calculated data from power plants (internal document) |       |
|                               | 2   | Cradle-to-grave, EoL not included but info about treatment of outputs, energy content allocation included |       |
| GEMIS                         | 3   | Modelled as single plants in Germany (only one of coal) | 2.75  |
|                               | 2   | Domestic production of lignite, plants sited in Germany |       |
|                               | 3   | Ref. year 2010, data from 2001-2009 |       |
|                               | 2   | 75% of impact categories and 90% of reference flows covered |       |
|                               | 3   | Data comes from Oko Institute reports, but no info about emission factors or direct emissions |       |
|                               | 3   | Cradle-to-grave, EoL not included, allocation applied but not defined |       |
| E3                            | 3   | Modelled as single plants in Germany | 3.42  |
|                               | 2   | Domestic production of lignite, plants sited in Germany |       |
|                               | 3   | Ref. year 2010, data from GEMIS and Ecoinvent (Lausitz plant); Ref. year 1994, data from 1992 (rest of plants) |       |
|                               | 4   | Less than 50% impact categories, 90% flows covered |       |
|                               | 4   | Sources are relevant (not authoritative sources), but no info about emission factors or direct emissions |       |
|                               | 4   | Cradle-to-gate, EoL not included, allocation not defined (assumed as GEMIS) |       |
| Electricity from natural gas (GB) ELCD | TeR | Both electricity and CHP plants considered, use of technology mix | 1.50 |
|--------------------------------------|-----|---------------------------------------------------------------|------|
|                                      | GR  | Domestic production and imports considered, but slightly differences in shares of each country with the reference |      |
|                                      | TIR | Ref. year 2009, data from 2006-2010. Some emission data from ‘90s |      |
|                                      | C   | 100% of impact categories and 96% of reference flows covered |      |
|                                      | P   | References from relevant literature and authoritative sources. Some emission data from outdated studies |      |
|                                      | M   | Cradle-to-grave, EoL included, energetic and market value allocation |      |
| Ecoinvent                            | TeR | Modelled as an average plant in EU, based in a German CHP plant | 2.17 |
|                                      | GR  | Only domestic origin, when imports represent 40-50% of raw material in 2009 |      |
|                                      | TIR | Ref. year ‘90s, data from ‘90s (statistical reports) |      |
|                                      | C   | 100% of impact categories and 100% of reference flows covered |      |
|                                      | P   | Emission from calculated data from power plants (internal document) and authoritative sources (IEA) |      |
|                                      | M   | Cradle-to-grave, EoL not included, energy content allocation included in CHPs |      |
| GEMIS                                | TeR | Modelled as a single plant | 3.33 |
|                                      | GR  | No info of plant location. Roughly 80% of country suppliers are considered. Important increase of Qatar imports not considered (2009-2011) |      |
|                                      | TIR | Ref. year 2010, data from 1994-2003. Data cannot be checked |      |
|                                      | C   | 75% of impact categories and 90% of reference flows covered |      |
|                                      | P   | Data comes from Oko Institute reports, but no info about emission factors or direct emissions |      |
|                                      | M   | Cradle-to-grave, EoL not included, allocation applied but not defined |      |
| Electricity from nuclear (FR) ELCD   | TeR | Modelled as the French technology mix | 1.83 |
|                                      | GR  | Some activities of milling and reprocessing refers to US data |      |
|                                      | TIR | Some references are 20 years older than the ref. year (2009) |      |
|                                      | C   | 100% of impact categories and 100% of reference flows covered |      |
|                                      | P   | Relevant flows measured, other flows taken from literature |      |
|                                      | M   | Cradle-to-grave, EoL of intermediate activities is missing |      |
| Ecoinvent                            | TeR | Some data extrapolated from Swiss power plants | 1.67 |
|                                      | GR  | Infrastructure data from Swiss plants, only 1 uranium supplier |      |
|                                      | TIR | Ref. year 2002, relevant data are more updated than ELCD |      |
|                                      | C   | 100% of impact categories and 100% of reference flows covered |      |
|                                      | P   | Relevant flows measured, other flows taken from literature |      |
|                                      | M   | EoL and allocation also for sub-processes |      |
| GEMIS                                | TeR | Refered to French representative plants but not as a mix | 3.08 |
|                                      | GR  | Only the modeling of enrichment is correct |      |
|                                      | TIR | (depending on plant) literature comes from 5-15 years before |      |
|                                      | C   | 75% of impact categories, 90% of flows covered |      |
|                                      | P   | Literature data and auto-estimated data |      |
|                                      | M   | EoL not modeled, not including infrastructures. |      |
| E3                                   | TeR | Considering a process scale instead of real plant | 4.00 |
|                                      | GR  | Only the modeling of enrichment is correct |      |
|                                      | TIR | Reference year 2000, data from 1994-99 |      |
|                                      | C   | Less than 50% impact categories, 90% flows covered |      |
| Electricity | ELCD | TeR | Modelled as the EU27 technology mix (run-of-river, storage and pump storage) | GR | Modelled according the EU27 mix | TiR | Ref. year 2009, data from 2005-2010 | C | 94% of impact categories and 96% of reference flows covered | P | Data of technology issue from authoritative sources, and data of energy consumption and emissions from specific countries | M | Cradle-to-grave, EoL and infrastructure lacking |
|------------|------|-----|--------------------------------------------------------------------------------|----|-------------------------------|-----|-------------------------------|---|-------------------------------|---|-----------------------------|---|----------------------------|
| from hydro power (EU27) | TeR 1 | 1.33 |                                                                                   |    |                               |     |                               |    |                               |    |                                         |    |                                           |
| Ecoinvent | TeR 3 | 2.50 | Technologies from Swiss and Austrian plants (reservoir and run-of-river) which represent the 5th and 6th countries in the ranking of electricity generation in EU |    |                               |     |                               |    |                               |    |                                         |    |                                           |
| GEMIS | TeR 4 | 3.67 | Modelled as a generic dam plant                                                                                       |    |                               |     |                               |    |                               |    |                                         |    |                                           |
| Electricity from wind power (RER) | ELCD | TeR 1 | Modelled the onshore and offshore wind technologies available at the commercial level in Europe |    |                               |     |                               |    |                               |    |                                         |    |                                           |
| Ecoinvent | TeR 2 | 2.00 | Modelled the onshore and offshore technology mix, but sizes of turbines and capacities are lower than referenced |    |                               |     |                               |    |                               |    |                                         |    |                                           |
| GEMIS | TeR 4 | 3.67 | Modelled a generic wind farm (10 turbines/1 MW). Not possible to identify the technologies                                                                 |    |                               |     |                               |    |                               |    |                                         |    |                                           |
| Dataset                          | Modelled by:                              | Quality Criteria                                                                 |
|---------------------------------|-------------------------------------------|----------------------------------------------------------------------------------|
| Electricity from biomass (DE) ELCD | Ecoinvent                                 | TeR 1 Modelled as a technology mix of different PV technologies                   |
|                                 |                                           | GR 1 Domestic production considered (Germany)                                    |
|                                 |                                           | TiR 1 Ref. year 2009, data from 1998-2007                                         |
|                                 |                                           | C 1 94% of impact categories and 95% of reference flows covered                  |
|                                 |                                           | P 1 Data direct from production plants                                           |
|                                 |                                           | M 2 Cradle-to-grave, Eol. not considered, market allocation applied              |
|                                 |                                           |                                                                                   |
| Electricity from photovoltaic (DE) ELCD | Garraín et al. (2015) SpringerPlus         | TeR 1 Modelled as a technology mix based on worldwide average production          |
|                                 |                                           | GR 2 Modelled considering production processes in US and Europe, but German production. Some correction factors for adapting data to Swiss and German context |
|                                 |                                           | TiR 1 Ref. year 2007, data from 2002-2007                                         |
|                                 |                                           | C 1 100% of impact categories and 100% of reference flows covered                |
Results
Table 4 shows the rates of the quality criteria assessment of the selected ELCD electricity datasets. Information contained in each dataset and additional confidential documents provided by the dataset developer (GaBi, 2012) were considered to define a final single value for each criterion. It should be noticed that only one dataset of each technology has been included in this article in order to show the full application of the evaluation method.

Discussion
The comparison of the selected datasets from different databases, referred to the same technology, can lead to the identification of potential improvements in each quality criteria. Moreover, relevant Authoritative Sources and Business Associations, which could provide additional information to improve the quality of the ELCD results, can be also identified in order to enhance the overall quality of data. It must be remarked that many recommendations are related to future updated versions of ELCD electricity datasets. Table 5 shows a summary of the findings and recommendations that arose from such cross assessment.

Conclusions and recommendations
This extended analysis of the ELCD electricity datasets aimed at providing better founded information related to its data quality, following the indicators developed and described within the ILCD handbook (EC-JRC, 2011). This analysis, together with the study on ELCD fuel datasets (Garraín et al. Springer Plus - Submitted in 2014), have meant an opportunity to implement these quality indicators to different datasets for the first time. It has had two main consequences. Firstly, the implementation of the quality indicators to the energy-related datasets from the ELCD has been used to understand the room for improvement in future ELCD versions. Additionally, it has also served to identify whether these data quality indicators are applicable and useful for the database developers in general, as well as for the LCA practitioners. It should be stated that results obtained from this analysis ensure the quality of the energy-related datasets to any LCA practitioner, and provide insights related to the limitations and assumptions underlying in the datasets modelling. Giving this information, the LCA practitioner will be able to decide whether the use of the ELCD datasets is appropriate based on the goal and scope of the analysis to be conducted.

Along the current analysis, several assumptions have been made in order to facilitate the analysis, such as the selection of databases and datasets or the definition of data quality indicators (DQIs). The results have to be understood under this context. Taking those considerations into account, the data quality assessment conducted in here should not be extrapolated to datasets under different contexts. Furthermore, the analysis has been performed only in a selection of the most representative electricity datasets from the ELCD as well as from the other selected databases. The conclusions obtained in this analysis cannot be extrapolated to other type of datasets, nor can be used to compare databases among them.

From the deep analysis conducted, it must be highlighted that the ELCD datasets have been modelled based on an extensive review of the most relevant literature and statistics. The documentation used to model the ELCD

| Code | Dataset | Data quality indicators | Value |
|------|---------|-------------------------|-------|
| P    | Data mainly from production plants or literature (and personal communications) | 2.84 |
| M    | Cradle-to-grave, EoL included, economic allocation considered | 4.33 |
| GEMIS | Modelled as two types of PV technologies (mono and multi-crystalline) | |
| GR  | Modelled as Europe and US markets. German plants considered | |
| TiR  | Ref. year 2010, data from 1995-2004 | |
| C    | 75% of impact categories, 90% of flows covered | |
| P    | Data mainly from literature but not possible to check the used data | |
| M    | Cradle-to-gate, EoL not included, allocation applied but not defined | |
| E3   | Modelled as one type of technology (multi-crystalline) | |
| GR  | Generic power plant, no clear info about its location | |
| TiR  | Ref. year 1992, data from 1995 and 2002 but not possible to check | |
| C    | Less than 50% impact categories, 90% flows covered | |
| P    | Not possible to check references, no info about elementary flows | |
| M    | Not clear the system boundaries and allocation due to lack of info | |
Table 5 Recommendations for improving ELCD electricity datasets by DQI

| ELCD datasets                                      | DQI | Potential improvements and recommendations                                                                 |
|----------------------------------------------------|-----|-----------------------------------------------------------------------------------------------------------|
| Electricity grid mix                               | TeR | • Inclusion of minority technologies could have an important share in the future (e.g. solar thermal technologies already present in the mix of countries like Spain, or ocean technologies or even carbon capture and storage – CCS – technologies). |
|                                                    | C   | • To fulfill the criterion in a 100% share, the following flows should be considered: Halon 1211 for ozone depletion, and indium for resource depletion impact category. |
|                                                    | P   | • Statistical information used to construct the electricity mixes of each country has been retrieved from the IEA (authoritative source). However, and due to the ELCD database has been developed by the EC in a European context, it seems adequate to use the data reported by each country to Eurostat. |
|                                                    | M   | • Inclusion of the EoL modelling of PV facilities.                                                      |
| Electric from fossil fuels (hard coal, lignite and natural gas) | TeR | • CCS technologies can be included due to the importance in future environmental scenarios, as stated in several studies (Koornneef et al., 2008; Stanley and Dávila-Serrano, 2012). |
|                                                    | C   | • To fulfill the criterion in a 100% share, the following flows should be considered: Halon 1211 for ozone depletion, and indium for resource depletion impact category. |
|                                                    | P   | • The use of a database with well reported emissions based on data from a large power plant database in Europe, such as in Ecoinvent, could improve the results. |
|                                                    | M   | • Some analysed databases make use of energy models to derive future European electricity mixes, although this is not the scope of the ELCD. |
| Electricity from nuclear power (FR and DE)         | GR  | • It could be improved using data from Canadian mines and mills that can be obtained from CERI (2008) or UNSCEAR (1993, 2000). In case of the French dataset, conversion data in facilities are available in the ExternE study of the French nuclear fuel cycle (EC, 1995). |
|                                                    | TIR | • In both German and French datasets, TiR is the worst scored category in the ELCD database. The reason lies on the use of several old references. However, no better references could be found in the other databases analysed in this study. Other datasets (e.g. Ecoinvent) perform better since the validity period of the dataset is closer to the oldest references. |
|                                                    | P   | • Concerning radioactive emissions data, uncertainty can be decreased by using data published by UNSCEAR (2000), considered as an authoritative source. |
|                                                    | M   | • It could be improved with the consideration of a final repository for spent fuel and high activity waste. Data source can be those included in NAGRA (2002a, 2002b). |
| Electricity from hydro power                        | TeR | • In a future scenario, Small Hydropower Plants (SHPP) should be included due to the potential importance in the mix. According to statistical data from Arcadis (2011), a considerably reduction of electricity from hydropower mix is expected and the large facilities might be the main affected. Then, the share of SHPP in electricity from hydropower mix might increase; although a reduction of their potential is foreseen. |
|                                                    | P   | • To get additional inventory data, ESHA (European Small Hydropower Association, www.esh.be) publishes EU data facts and statistics of hydropower generation. |
|                                                    | C   | • The inclusion of documentation related to the data collection process and additional references to identify the origin of the data values could be useful to achieve a better rating. On the other hand, the IHA (International Hydropower Association, www.hydrowpower.org), might be a relevant information source for double checking (annual reports and GHG Risk Assessment Tool that provides estimation of the level of gross GHG emissions from freshwater reservoir). |
| Electricity from wind power                         | TeR | • Capacity factors and average sizes described are in line with the statistics provided by authoritative sources, such as the European Wind Energy Association (EWEA) and the International Energy Agency (IEA). It would be recommended to include additional
energy related datasets can be found in the Life Cycle Thinking Platform web-site (http://eplc.jrc.ec.europa.eu/ELCD3/).

In terms of the quality criteria, the analysed ELCD datasets showed a very good performance in the majority of the criteria, especially in those criteria related to TeR, C and M. Nevertheless, several recommendations for improving have been detailed above.

Concerning the different technologies analysed, ELCD datasets have the best quality rating in the majority of the technologies, with the exception of electricity from nuclear datasets in which TiR and M criteria score worse than other databases and PV dataset where M criterion also performs worse than in other databases. Several recommendations have been also made to overcome these limitations.

Table 5 Recommendations for improving ELCD electricity datasets by DQI (Continued)

| Technology                        | TeR | C      | General | M      |
|-----------------------------------|-----|--------|---------|--------|
| Electricity from biomass (DE)     |     | In order to improve the criterion, Halon 1211 for ozone depletion, and cadmium and indium for resource depletion impact category, should be considered. |         |        |
| ELCID dataset models a non-defined region in Europe. It must be highlighted that this energy source has a very site-specific resource and therefore, this technology applied in each European country and their contribution to the total electricity generation by wind in Europe might vary. However, ELCD takes into account this particularity by considering the full load hours for the actual region using statistical information. |     |        |         |        |
| It could be 100% fulfilled with the inclusion of Halon 1211 and CFC-12 for ozone depletion and cadmium and indium for resource depletion impact category. |     |        |         |        |
| The Wind Power Net (http://www.thewindpower.net) gives access to a large database with the current commercial wind turbines and the installed wind farms in the world. It provides information about the location of the farm, technology use, type of turbine, capacities, etc. This database can be used for double check some data. |     |        |         |        |
| If re-powering systems are to be included in future versions, other EoL scenarios should be reviewed and considered, if applicable. |     |        |         |        |
| Electricity from photovoltaic     |     | It should be noted that this dataset has been modelled in a way that the European current technology is included. Among the other databases, the ELCD dataset contains the most updated information and provides deep details concerning the precision of the data used. To model this technology at least two relevant Authoritative Bodies have been used: the European Photovoltaic Technology Platform (EPTP) and the EuroObservER Barometer (www.euroobserv-er.org). The European Photovoltaic Industry Association (www.epia.org) provides detailed information related to the evolution of this sector yearly, and should be considered a relevant source for future versions. |     |        |
| It should be noted that no additional authoritative source has been found that could improve the ELCD dataset. |     |        |         |        |
| One of the most relevant weaknesses of the ELCD is the lack of datasets that model electricity produced by each technology in each European country. Currently, the ELCD includes electricity mix datasets for each country, modelled considering an established share of sources that might be different to the needs of the user. The inclusion in future versions will improve the flexibility and usefulness of the database. Moreover, in some renewable technologies (PV or biomass) regional specificities are not always well considered in terms of capacity factors, forest management, etc. In these cases, it would be desirable to split the dataset in different country specific or bioclimatic regions datasets. Although the optimal solution to this limitation would be to model new datasets for electricity production by technology and for each country, this might not be feasible in the short term. An alternative solution would be to model
datasets for each technology under a European context, and to introduce parameters in the electricity mix datasets to vary the shares of each technology. In order to give response to any change or advance in technologies, and to be able to model new datasets and/or to modify the current ones if necessary, it is highly recommended to constantly review the evolution of advanced technologies and their share in the European market. According to the approach endorsed by several authors for the modelling of consequential-LCA of energy systems (see e.g. Igos et al. 2014, Vázquez-Rowe et al. 2014, Earles et al. 2013, and Dandres et al. 2012), also future electricity scenarios can be developed using data from energy projective models such as PRIMES or TIMES (The Integrated MARKAL-EFOM System). This is an important improvement of the database that could be very useful for prospective and consequential LCA studies.

Modelling the End of Life (EoL) of the systems appears to be a difficult task due to the novelty of some technologies and the lack of data from other technologies (solar PV, final repository for spent nuclear fuel and natural gas plant dismantling). Efforts on this challenge should be kept in the future.

Regarding the use of authoritative sources, the ELCD database makes extensive use of the statistical information provided by the IEA. This is of course an authoritative source. However, for the European context it seems appropriates the use of data reported by each country to Eurostat. In order to improve precision, it would be advisable to make a more extensive use of Business Associates and Authoritative sources data that have been proposed throughout the analysis.

Since its first release, the ELCD database has been updated two times. The needs of reviewing and updating the ELCD database depend on the different sectors and the technologies. It would be useful to define periods to revise the electricity related datasets. For this purpose, a deep analysis of the learning curves would identify the level of maturity for each technology. Then, special periods for reviewing could be identified by technology.

Finally, it should be noted that the selected databases are in a constant process of updating and improvement, e.g. Ecoinvent v3.0 or GEMIS v4.93, so a detailed analysis of these, together with a deeper analysis of related reference documents (Treyer and Bauer, 2013, 2014) can offer further potential improvements to future ELCD versions.

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References

Arcadis (2011) Hydropower Generation in the context of the EU WFD, Contract N° 070307/2010/574390, EC DG Environment, Project number 11418, version 2, http://ep.org.ua/fileadmin/user_upload/Docs/Small_Hydropowers_ Stations/11418_WFD_Hydro_draft_final_110509.pdf
CER (2008) Comparative Life Cycle Assessment (LCA) of Base Load Electricity Generation in Ontario, Canadian Energy Research Institute, Internal Report
Dandres T, Gaudreau C, Tirado-Seco P, Samson R (2012) Macroanalysis of the economic and environmental impacts of a 2005–2025 European Union bioenergy policy using the GTAP model and life cycle assessment. Renew Sust Energ Rev 16:21180–1192
E3 database (2012) http://www.e3database.com/ accessed January 2013
Earles MJ, Hallog A, Ince P, Skog K (2013) Integrated economic equilibrium and life cycle assessment modeling for policy-based consequential LCA. J Ind Ecol 17:3375–384
EC (1995) ExternE. Externalities of Energy, vol 5, NUCLEAR, pp 119–133
EC (2011) Europe’s energy position – 2010 Annual report, European Commission, Directorate General for Energy – market Observatory for Energy. Publication Office of the European Union, Luxembourg
EC-JRC (2010a) International Reference Life Cycle Data System (ILCD) Handbook – General guide for Life Cycle Assessment – Detailed guidance, European Commission - Joint Research Centre - Institute for Environment and Sustainability, First edition March 2010. EUR 24708 EN, Firstth edn. Publications Office of the European Union, Luxembourg
EC-JRC (2010b) International Reference Life Cycle Data System (ILCD) Handbook – Specific guide for Life Cycle Inventory data sets, European Commission - Joint Research Centre - Institute for Environment and Sustainability, First edition March 2010. EUR 24709 EN. Publications Office of the European Union, Luxembourg
EC-JRC (2011) International Reference Life Cycle Data System (ILCD) Handbook-Recommendations for Life Cycle Impact Assessment in the European context, European Commission-Joint Research Centre - Institute for Environment and Sustainability, First edition November 2011. EUR 24571 EN. Publications Office of the European Union, Luxembourg
Ecoinvent (2012) http://www.ecoinvent.ch/ accessed January 2013
EUROSTAT (2012) http://ec.europa.eu/eurostat/ accessed January 2013
GaBi software (2012) http://www.gabi-software.com accessed January 2013
GEMIS (2012) http://www.iinas.org/gemis-de.html accessed January 2013
Igos E, Rugania B, Regea S, Benetto E, Droueta L, Zacharya D, Haaset T (2014) Integrated environmental assessment of future energy scenarios based on economic equilibrium models. Metall Res Tech 111(3):179–189
Koumri M, J., van Keulen T, Fjaaj A, Turkenburg W (2008) 2008 Life cycle assessment of a pulverized coal power plant with post-combustion capture, transport and storage of CO2. Ind J Greenh Gas Con 2448–467
Lozanovski A, Held M (2010) Update of the Environmental Indicators and Energy Payback Time (EPBT) of CS Modules in Europe and Scenario Analysis of Solar Cell Printing, 25th European Photovoltaic Solar Energy Conference and Exhibition, 5th World Conference on Photovoltaic Energy Conversion, 6–10 September 2010, Valencia, Spain. WIP-Renewable Energies, 2010, München, ISBN 3-936338-26-4
NAGRA (2002a) Projekt Opalinuston - Konzept für die Anlage und den Betrieb eines geologischen Tiefenlagers. Entsorgungsnachweis für abgebrannte Brennelemente, verglaste hochaktive sowie langlebige mittelaktive Abfälle. Technischer Bericht 02–02. Nationale Genossenschaft für die Lagerung radioaktiver Abfälle (Nagra), Wettingen, CH.
NAGRA (2002b) Project Opalinus Clay - Safety Report. Demonstration of disposal feasibility for spent fuel vitrified high level waste and long-lived intermediate level waste (Entsorgungsnachweis). Technical Report 02–05. Nationale Genossenschaft für die Lagerung radioaktiverAbfälle (Nagra), Wettingen, CH.
Treyer K, Bauer C (2013) Life cycle inventories of electricity generation and power supply in version 3 of Ecoinvent database – Part I: electricity generation. Int J Life Cycle Ass doi:10.1007/s11367-013-0665-2.
Treyer K, Bauer C (2014) Life cycle inventories of electricity generation and power supply in version 3 of Ecoinvent database – Part II: electricity markets. Int J Life Cycle Ass doi:10.1007/s11367-013-0694-x.
UNSCEAR (1993) UNSCEAR (1993) Report: Sources and effects of ionizing radiation. Annex B.
UNSCEAR (2000) Report: Sources and Effects of Ionizing Radiation. Annex C.
Vázquez-Rowe I, Marvuglia A, Rege S, Benetto E (2014) "Applying consequential LCA to support energy policy: land use change effects of bioenergy production.". Sci Total Environ 472:78-89.