

1 The unequal contribution to global energy 2 consumption along the supply chain

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11 HIGHLIGHTS

- 12 • Different frameworks of energy consumption are proposed and discussed.
- 13 • National energy consumptions at different production stages are identified.
- 14 • Sectoral contributions to energy consumption are identified
- 15 • China accounts for the majority of global energy consumption.
- 16 • Energy consumptions of emerging countries increased faster than the
17 developed.

18

19

20 ABSTRACT

21 Reducing fossil fuel consumption is a top priority option for climate change
22 mitigation, which requires collaborations of partner along the supply chain, such
23 as energy suppliers, energy consumer and consumers of goods and services.
24 A comprehensive analysis of the fossil fuel consumption is useful for policy
25 makers to reduce demand but still absent. This study explores the national
26 contribution to global energy consumption from different perspectives in global
27 supply chain and is designed to complement current energy reduction policies.
28 For the developed countries, energy consumptions are stable from 2000-2014,
29 while that of emerging countries almost doubled (e.g., China and India). Most
30 of the developing countries are producers whose production-based and final
31 production-based energy consumptions are higher than their consumption-
32 based ones, except India after global financial crisis. In contrast, the developed
33 countries are consumers, whose consumption-based energy consumptions are
34 higher. At sectoral level, service sector is the biggest contributor of
35 consumption- and income-based energy consumption. The analysis in this

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36 study can create opportunities for all the parties alongside the supply chain in
37 reducing fossil fuel consumption.

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39 Keywords: inequality; energy consumption; production-based; consumption-
40 based; income-based

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42

43 **1 Introduction**

44 Climate change is one of the biggest and urgent threat to the planet and human
45 societies (Thomas et al., 2004). Fossil fuel combustion is the primary source of
46 global greenhouse gas (GHG) emissions (Davis and Socolow, 2014), which
47 contributes to the climate change. However, the need for energy to satisfy
48 social and economic development is increasing (Arto et al., 2016). Climate
49 change mitigation and energy security are two critical challenges toward a
50 sustainable future. In current trajectory, the world's total energy consumption is
51 projected to rise by 28% from 575 quadrillion British thermal units (Btu) in 2015
52 to 736 quadrillion Btu in 2040 (U.S. Energy Information Administration), which
53 challenges the current climate change mitigation actions. Meanwhile, it is
54 reported (Quadrelli and Peterson, 2007) that energy consumption has
55 contributed to over four fifths of global anthropogenic carbon emissions.
56 Therefore, more efforts are supposed to be in place in informing and implanting
57 policies on curbing energy consumptions and the related carbon emissions.

58

59 Different methods are used for accounting regional energy consumptions. A
60 traditional method is production-based energy consumption accounting, which
61 measures all energy consumption generated by the production activities of a
62 country (Peters, 2008). However, in a globalized world, final consumptions in
63 one country often cause production and energy consumption elsewhere (Davis
64 and Caldeira, 2010). Considering the interaction of energy consumption and
65 international trade, consumption-based accounting has been proposed to
66 adjust the production-based accounting by adding the energy consumption
67 associated with the production of imports and removing that the associated with
68 the production of exports (Malik et al., 2018; Wiedmann and Lenzen, 2018; Wu
69 and Chen, 2017). In this framework, Leontief demand-driven Input-Output (IO)
70 models have been used to help integrate the energy consumption and
71 economic activities (Lan et al., 2016). However, challenges still remain in
72 adequately charactering the temporal change of national energy consumption
73 from different perspectives. Furthermore, the link of final consumption of
74 products and services to the producers represent part of the global supply chain
75 so that it is also important to look at the potential for supply-side policies
76 (Marques et al., 2012).

77

78 Downstream responsibility is little addressed in academic literature and
79 corporate sustainability reports (Lenzen and Murray, 2010). In contrast to the
80 Leontief demand-driven IO models, the Ghosh supply-driven model links
81 production to the primary inputs in the supply chain (Ghosh, 1958; Miller and
82 Blair, 2009). It is characterized with energy consumption enabled by primary
83 suppliers which are required to generate income of a country through wages,
84 profits and rents (payment to primary factors of production). The supply-side
85 model has been applied to GHG emissions to analyse the forward linkage
86 effects. Marques et al. (2012) quantified income-based environmental
87 responsibility for GHG emissions by 112 regions in the world and compared the
88 results with those obtained from production-based and consumption-based
89 frameworks. Liang et al. (2017) assessed the income-based emissions and new
90 profiles for nations and sectors. Mathematically, income-based accounting
91 adjusts the production-based accounting by removing the domestic energy
92 consumption generated downstream of imported products and adding the
93 foreign emissions generated downstream of exported products. However,
94 downstream responsibility has never received the same attention as its
95 consumption-based cognate.

96
97 Meanwhile, energy consumptions are induced both domestically and abroad
98 when a country produces final goods and services. Since only final goods enter
99 the domain of consumption, in recent years a final production-based accounting
100 has been raised to associate the energy consumption with the final producing
101 activities. Difference between this and the consumption-based accounting is
102 the agents (final producers or final consumers) that are adopted to allocate the
103 factor uses. Therefore, for a region that mainly serves as producer of
104 intermediate products, the energy consumption allocated to it is supposed to
105 be much less than that allocated to a producer of final goods. To identify
106 differences between these methods, Kanemoto et al. (2011) compared
107 emission inventories established under consumption-based, final production-
108 based and production-based accounting frameworks.

109
110 Drawing the recent literature on allocating responsibility in different frameworks,
111 this study focuses on energy consumption from different perspectives and is
112 designed to complement current energy mitigation policies. This study
113 complements previous works by identifying national energy consumption at
114 different production stages and sectors to provide insights into energy policies.
115 Specifically, we construct a time-series energy consumption inventory of
116 nations during 2000-2014 from the perspectives of income, production and
117 consumption. We also reveal the temporal changes and sectoral contributions
118 in regional income-based, production-based and consumption-based energy
119 consumption.

120

121

122 2 Methods and data

123 2.1 Environmentally Extended Input-output Analysis

124 This study uses a globally Environmentally Extended Input-output Analysis
125 (EEIOA) to assess the production-based, final production-based, consumption-
126 based and income-based energy consumption of nations from 2000 to 2014.
127 EEIOA is originally developed by Leontief (Leontief, 1970), which is also
128 referred to Leontief demand-driven model and links environmental pressure
129 data to the final consumer of the related products or services. Here, we adopt
130 the framework of Multi-regional Input-Output (MRIO) model which is based on
131 monetary flows to analyse the economic interdependence between different
132 national economies/regions, each composed by a number of industrial sectors
133 (Davis et al., 2010; Mi et al., 2018a; Rocco et al., 2018). The MRIO model has
134 been widely used in environmental analysis, e.g., greenhouse gases emissions
135 (Meng et al., 2018b; Mi et al., 2017; Vogt-Schilb et al., 2019), air pollutant
136 emissions (Meng et al., 2016b; Meng et al., 2018a; Wang et al., 2019), energy
137 consumption (Chen et al., 2018b), water-energy nexus (Chen et al., 2018a;
138 Zhang et al., 2019), biodiversity (Lenzen et al., 2012), etc., over the past
139 decades.

140

141 The typical single region Leontief demand-driven modelling (Meng et al., 2016a;
142 Meng et al., 2015) is based on a sector-by-sector matrix (\mathbf{z}) in which the total
143 output (\mathbf{x}) required by a certain final demand vector (\mathbf{y}) in the region or country
144 under consideration can be described as equation (1):

145

$$146 \quad \mathbf{x} = \mathbf{z} + \mathbf{y} \quad (1)$$

147

148 The standard MRIO model can be expressed as:

$$149 \quad \begin{pmatrix} \mathbf{x}^1 \\ \mathbf{x}^2 \\ \vdots \\ \mathbf{x}^r \end{pmatrix} = \begin{pmatrix} \mathbf{A}^{11} & \mathbf{A}^{12} & \dots & \mathbf{A}^{1s} \\ \mathbf{A}^{21} & \mathbf{A}^{22} & \dots & \mathbf{A}^{2s} \\ \vdots & \vdots & \ddots & \vdots \\ \mathbf{A}^{r1} & \mathbf{A}^{r2} & \dots & \mathbf{A}^{rs} \end{pmatrix} \begin{pmatrix} \mathbf{x}^1 \\ \mathbf{x}^2 \\ \vdots \\ \mathbf{x}^r \end{pmatrix} + \begin{pmatrix} \sum_s \mathbf{y}^{1s} \\ \sum_s \mathbf{y}^{2s} \\ \vdots \\ \sum_s \mathbf{y}^{rs} \end{pmatrix} \quad (2)$$

150 where \mathbf{X}^r is a vector for sectoral total outputs in region r , \mathbf{A}^{rs} represents the
151 coefficient of industry requirements from region r to s to produce per unit of
152 output j . \mathbf{y}^{rs} is the final demand supply from region r to s ; and s indicates the
153 total number of regions, which is 43 in this study.

154

155 In this framework, production-based accounting assesses a nation's role as a
 156 direct consumer, which refers to the energy consumption within the territorial
 157 boundary. The production-based energy consumption in region r is:

$$158 \quad \mathbf{P}^r = \mathbf{E}^r (\mathbf{I} - \mathbf{A})^{-1} \mathbf{y} = \mathbf{E}^r \mathbf{L} \mathbf{y} \quad (3)$$

159 Final production-based accounting assesses a nation's role as the final
 160 producer, which refers to both direct and indirect energy consumption
 161 embodied in the final products of the nation along the whole production chain.
 162 The final production-based energy consumption in region r is:

$$163 \quad \mathbf{F}^s = \mathbf{E} (\mathbf{I} - \mathbf{A})^{-1} \mathbf{y}^{*s} = \mathbf{E} \mathbf{L} \mathbf{y}^{*s} \quad (4)$$

164 Consumption-based accounting assesses a nation's role as a final consumer
 165 (Meng et al., 2017; Yi et al., 2019), which refers to both direct and indirect
 166 energy consumption embodied in the products consumed by the nation. The
 167 consumption-based energy consumption in region s can be expressed as:

$$168 \quad \mathbf{C}^s = \mathbf{E} (\mathbf{I} - \mathbf{A})^{-1} \mathbf{y}^{*s} = \mathbf{E} \mathbf{L} \mathbf{y}^{*s} \quad (5)$$

169 where \mathbf{E}^s and \mathbf{E}^r are the direct energy intensity vector for region s and r but
 170 zeros for all other regions. \mathbf{E} is calculated by each sector's energy consumption
 171 divided by the sector's total output x (Lin et al., 2014; Meng et al., 2019). $\mathbf{L} = (\mathbf{I} -$
 172 $\mathbf{A})^{-1}$ is the Leontief inverse matrix, which captures both direct and indirect inputs
 173 to satisfy one unit of final demand in monetary value, Leontief MRIO model is
 174 regarded as demand-driven. Changes in the final demand initials the upstream
 175 outputs. \mathbf{y}^{*s} is the final consumption of products in region s from each sector
 176 from all regions, and \mathbf{y}^{*s} is the final consumption of all regions from region s .

177 2.2 Supply-side Input-output Analysis

178 In contrast to the Leontief demand-driven model, Ghosh MRIO model is
 179 regarded as supply-driven. Changes in primary inputs (e.g., labour and capital)
 180 drive downstream production activities (Ghosh, 1958; Liang et al., 2017).
 181 Income-based accounting investigates a nation's role as a primary supplier at
 182 the beginning of the supply chain, which refers to both direct and indirect
 183 downstream energy consumption enabled by its primary inputs of labour,
 184 capital, etc. Income-based energy consumption in region s is calculated as:

$$185 \quad \mathbf{D}^s = \mathbf{V}^s (\mathbf{I} - \mathbf{B})^{-1} \mathbf{E} \quad (6)$$

186 where \mathbf{V}^s is the row vector which indicates the primary input of each sector in
 187 region s . The element b_{ij} of matrix \mathbf{B} is direct sales from sector i to sector j , in
 188 terms of unitary output in sector i . The matrix $(\mathbf{I} - \mathbf{B})^{-1}$ reflects both direct and

189 indirect outputs from various sectors enabled by primary inputs of particular
190 sectors, defined as Ghosh Inverse matrix.

191

192

193 **2.3 Data sources**

194 This study uses MRIO tables and sectoral energy consumption data to connect
195 the energy consumption to the economic activities. The MRIO tables used are
196 from World Input-Output Database (WIOD) released in 2016 (Timmer et al.,
197 2016), which provide detailed interregional transaction information on 44
198 regions (covering more than 85% of global GDP), including 28 EU countries
199 and 15 other major economies, and an aggregated “rest of world” region.
200 However, in this study, the number of regions is 43 because People's Republic
201 of China and Taiwan are aggregated into one region because of data availability.
202 Each economy in the MRIO table is further divided into 56 sectors. The energy
203 data used in this study is derived from International Energy Agency (2019),
204 which is also divided into 56 sectors.

205

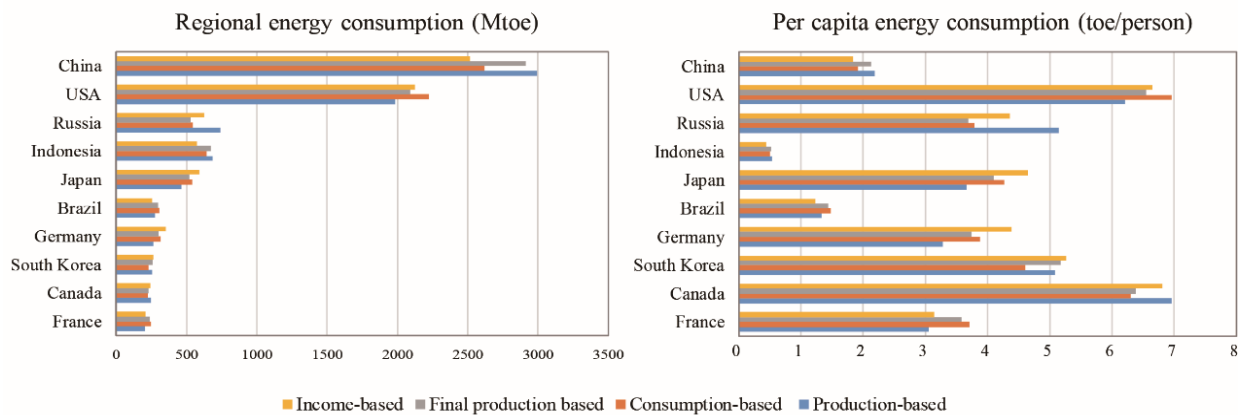
206 The sectoral value-added amounts for 43 regions were derived directly from the
207 MRIO table, consisting of employee compensation, net taxes on production,
208 depreciation of fixed assets and operating surplus. In this paper, the effects of
209 sub-items will not be distinguished, and we merely utilize total value added (i.e.
210 GDP measured by the income approach) to calculate vector D , as shown in
211 equation (6). The economic data from the WIOD are in current prices. To
212 remove the impact of inflation on the monetary output, the producer price index
213 (PPI, National Account Main Aggregates Database) is used to adjust all the
214 monetary data based on prices in year 2000 to provide a consistent analysis
215 from 2000 to 2014.

216

217

218 **3 Results and discussions**

219 **3.1 Regional contribution to global energy consumption**



220

221 Figure 1. Total and per capita income-, production-, final production- and consumption-based
222 energy consumption of selected 10 regions in 2014.

223

224 Figure 1 presents the regional breakdown of fossil fuel energy consumptions in
225 2014 from all responsibility principles for 10 selected regions, which collectively
226 account for about 70% of the global energy consumption from production
227 perspective. Clearly, China is the largest energy user by any measure. Its
228 production-, final production-, consumption-, and income-based energy
229 consumption in 2014 were 2994, 2914, 2619, and 2517 Mtoe (million tonnes of
230 oil equivalent), contributing 24.7%, 24.0%, 21.6% and 20.7% of total energy
231 consumption, respectively. Compared with the US, the world's second largest
232 consumer, China's share rose by 50.9%, 39.3%, 17.8% and 18.5%,
233 respectively.

234

235 In general, production-based energy consumption is higher than the
236 consumption-based ones for developing regions, such as China, Russia, and
237 Indonesia. The results of energy consumption from final production-based
238 accounting, which depend not only on all related countries' energy intensities
239 upstream, but also the inter-regional production network, reveal different
240 profiles across countries. China and Indonesia shared the same pattern, with
241 final production-based energy consumption slightly lower than production-
242 based ones, and 10.1% and 4.4% less than the consumption-based ones. In
243 Russia, the final production-based energy consumption was 26.4% less while
244 2.8% more than the production- and consumption-based ones, respectively,
245 while income-based one was 18.2% and 15.0% higher, which indicates that
246 Russia acts more as a primary supplier than as a final seller or final consumer
247 of energy consumption. This is because Russia is a major exporter of resources,
248 such as fossil fuels, which are essential and could induce substantial energy
249 consumptions in downstream processes (e.g., electricity generation). Therefore,

250 with the supply-based model, by considering the foreign energy consumption
251 generated downstream of exported products, Russia's energy use is revealed
252 as more than those obtained using the final production- and consumption-
253 based ones.

254

255 High income-based energy consumptions are observed in another two
256 resource-exporting countries: Japan and Germany. Thus, the important role of
257 resource-exporting (direct or indirect) regions as primary suppliers for global
258 energy consumption is highlighted by the income-based accounting. If global
259 energy consumption reduction considers results from the income-based
260 accounting, in addition to those from the production- and consumption-based
261 models, resource-exporting regions should share more responsibilities. This
262 finding informs that supply-side measure can identify the resource-exporting
263 regions which was overlooked before.

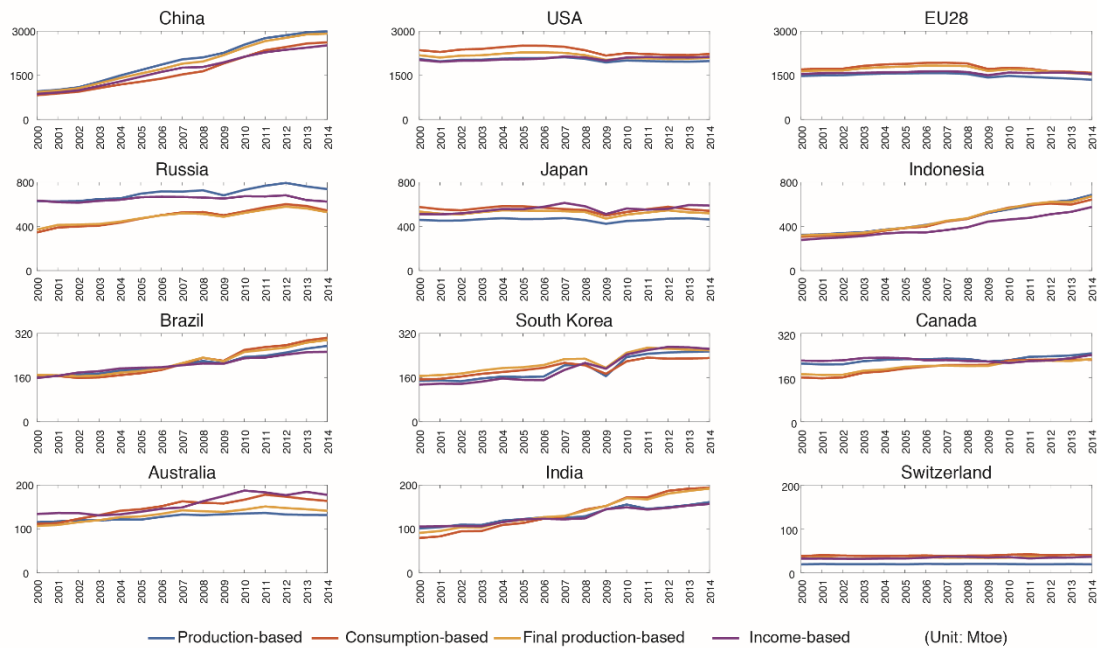
264

265 Per capita energy consumptions in developed countries (e.g., the United States,
266 Canada, Japan, France, Germany) are much higher than that in developing
267 regions (e.g., China, Brazil, Indonesia). For instance, the per capita production-,
268 consumption-, final production-, and income-based energy consumptions in the
269 US were respectively 6.21, 6.55, 6.96 and 6.65 toe/person in 2014, which were
270 2.84, 3.08, 3.64 and 3.62 times of the ones for China. Furthermore, within the
271 developing regions, per capita energy consumption in China is much higher
272 than that of in Brazil and Indonesia from all perspectives.

273

274

3.2 Temporal trends in regional energy consumption



276

277 Figure 2. Energy consumptions of selected regions over the period 2000-2014.

278

279 Global total fossil-fuel energy consumption witnessed a rapid growth, from
 280 8.4×10^6 Mtoe in 2000 to 1.2×10^7 Mtoe in 2014. Energy consumptions of
 281 developing regions kept growing during 2000-2014 (Figure 2), mainly due to
 282 their increasing primary inputs (e.g., capital and labour forces) to promote
 283 economic development. Since 2012, the growth rate of China's energy
 284 consumption has been stable due to the changes in energy mix and industrial
 285 structure (Guan et al., 2018; Mi et al., 2018b).

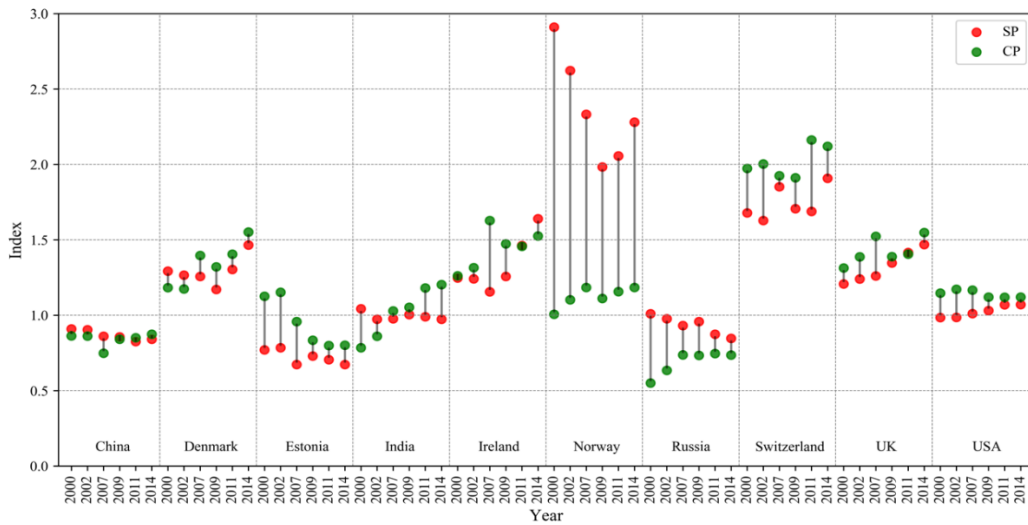
286

287 Income-based energy consumptions of China, Indonesia, India, and Brazil in
 288 2014 increased by 190%, 108%, 49%, and 60%, respectively, compared with
 289 2000. This shows these developing regions gain increasing benefits from both
 290 energy consumption income and by serving the providers of primary inputs.
 291 Since the 1990s, China has implemented a series of policy incentives (e.g., tax
 292 exemption) to attract foreign investment. Besides, the constant migration of
 293 rural peasants into urban areas in China has satisfied the increasing labour
 294 needs of domestic industries for producing the exported commodities. The
 295 robust investment and low-cost labour have led to the booming economic
 296 growth of Chinese economy, whose income in the form of payment to primary
 297 factors of production has increased by around nine times from 2000 to 2014
 298 according to the World Bank. Therefore, income-based energy consumptions
 299 of China nearly tripled during this time-span. Even around 2007 or 2008, the
 300 effect of global financial crisis on the income-based energy consumption in
 301 China is very limited.

302

303 The energy consumptions of developed regions remained relatively stable
304 during 2000–2014, except for Australia and South Korea, whose income-based
305 energy consumption in 2014 increased by 33% and 96% than 2000 levels,
306 respectively (Figure 2). This demonstrates the economies of developed regions
307 have been in a comparatively steady state during the last decade except that
308 there is a short-term drop during global financial crisis. However, the energy
309 consumption rebounded in 2010 because of the rapid easing of energy price
310 and substantial investment in many countries (Peters et al., 2012).

311 **3.3 Indicator change**



312

313 Figure 3. The evolution of role in driving energy consumption of selected
314 countries (SP = income-based / production-based energy, CP = consumption-
315 based / production-based energy).

316

317 Figure 3 shows the temporal change of indicators in turning points for selected
318 countries. As consumption-based accounting sheds light on how energy is
319 required to generate final demand, income-based accounting sheds light on
320 how energy is enabled to generate income. We define two indicators here, one
321 is SP, the ratio of income-based energy to production-based energy, is used to
322 compare the role of a country as a supplier or producer. The other one is CP,
323 the ratio of consumption-based energy to production-based energy, is used to
324 compare the role of a country as a consumer or producer. These indicators can
325 help us clearly understand the role of each country in driving energy
326 consumption and how they evolve.

327

328 We find that, for some countries, responsibility values vary substantially when
329 applying different allocation methods, while for some other countries they are
330 comparable. Notably, the contributions of Norway as a producer and consumer
331 are comparable ($CP \approx 1$), but the energy consumption from the income-based

332 accounting is 2-3 times of that from the production-based one. However, the
 333 big gap has shrunk from 2000 to 2014. This indicates that income-based
 334 responsibility can complement production- and consumption-based
 335 responsibility in some cases by highlighting countries which was overlooked
 336 before as resource-exporting countries.

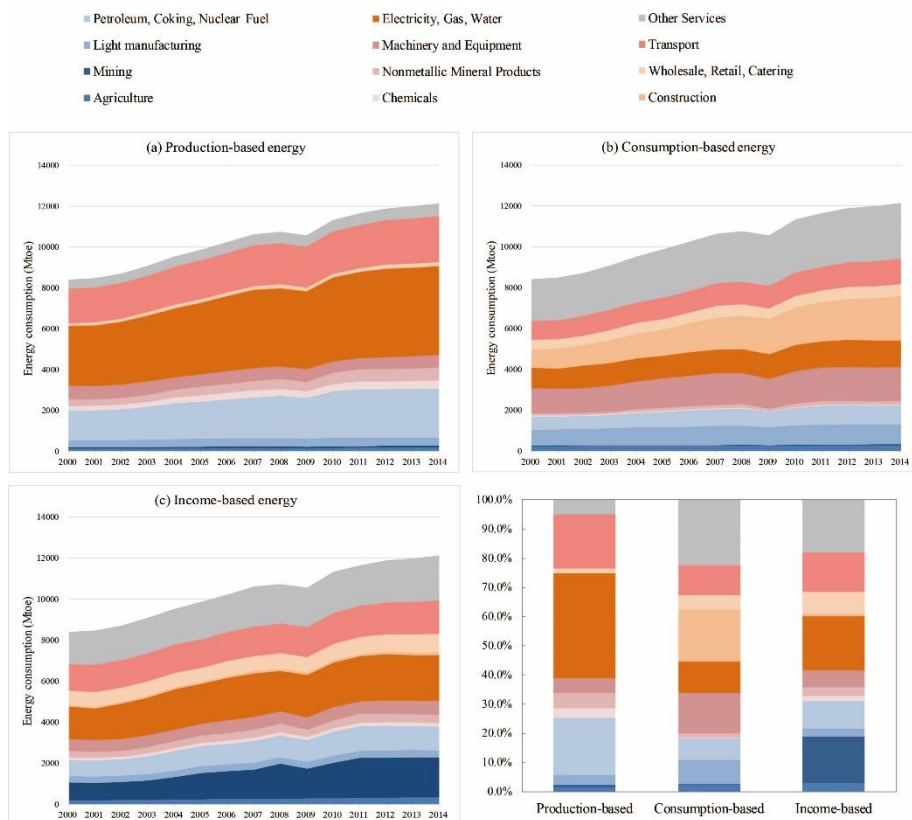
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338 For developed countries in Europe the income-based and consumption-based
 339 energy consumption are all larger than the production-based energy ($SP, CP >$
 340 1), while the difference is much larger for Switzerland ($SP, CP \approx 2$). For
 341 developing countries such as China and Russia, their consumption-based
 342 energy consumptions are less than the production-based ones ($CP < 1$), while
 343 the gaps are shrinking. However, their gaps between income-based and
 344 production-based energy consumption (SP) are widening during 2000-2014.
 345 Though India is a developing country, its consumption-based energy
 346 consumption has outpaced the production-based one ($CP > 1$) after global
 347 financial crisis, because of the escalating final consumption. In contrast, India's
 348 income-based energy consumption is comparable to the production-based
 349 energy consumption during the last two decades.

350

351 3.4 Sectoral contributions in different perspectives

352



353

354 Figure 4. Temporal change in sectoral energy consumption from (a) production-,
355 (b) consumption-, (c) income-based accounting and (d) comparison of sectoral
356 contribution in 2014.

357

358 Sectoral breakdown for energy consumption from different perspectives (Figure
359 3) shows different profiles. The top 20 sectors in income-based energy
360 consumption are mainly related to basic materials (i.e., agriculture, mining,
361 metal, and electricity) and manufacture-related services. These sectors located
362 upstream of the supply chain are critical to industrial production and result in
363 significant downstream energy consumption. Besides, these sectors mainly
364 locate in regions with high GDP, i.e., in US, China, India, Russia, and Brazil. In
365 summary, under the income-based accounting, the major contributors are
366 electricity (18.4%), other services (18.1%), mining (16.1%) and transport sector
367 (13.4%). The biggest sectoral contributor to global production-based accounting
368 is electricity (35.7%), followed by petroleum, coking and nuclear fuel (18.7%)
369 and transport sector (18.7%). Under the consumption-based accounting, the
370 main contributors are other services (22.4%), construction (17.7%), machinery
371 and equipment (13.7%), electricity (10.89%) and transport sector (10.4%).
372 Under the consumption-based and income-based accounting, service sector
373 (including transport, wholesale and other services) respectively shares 37.5%
374 and 38.9% of global total energy consumption, compared to a ratio of 24.8%
375 under the production-based one. Therefore, the tertiary industries as major
376 beneficiary of income and the supplier of high value-added consumer products
377 should take more responsibility in curbing energy consumption.

378

379 **4 Conclusion and policy implications**

380 The aim of this study is to clarify the role of each region as a supplier, producer,
381 final producer and final consumer in energy consumption. The analysis of
382 national development characteristics and contribution along the global supply
383 chain from different points of view provides a more comprehensive
384 understanding on how energy consumption can be curbed.

385

386 The new finding in this study can be summarized as 1) Global energy
387 consumption increased rapidly, and China is the largest energy user from all
388 perspectives. For the developed countries, energy consumptions are stable
389 from 2000-2014, while that of emerging countries almost doubled. 2) Most of
390 the developing countries are producers, whose production- and final
391 production-based energy consumptions are higher than their consumption-
392 based ones. In contrast, the developed countries are consumers, whose
393 consumption-based energy consumptions are higher. 3) At sectoral level,
394 service sector is the biggest contributor of consumption- and income-based
395 energy consumption.

396

397 The policy implications are also different because of the diverse trajectory
398 across countries. China and Russia serve as the producers and they use
399 energy in the production of goods or services. Therefore, more efforts should
400 be emphasized on improving energy efficiency. This applies especially for
401 China since it is the largest energy consumer in the world. Norway is an
402 important supplier of resources, which enables the energy consumption of
403 downstream countries.

404

405 From a consumption-based perspective, importing countries can improve their
406 environmental preference by selecting producers from abroad with higher
407 energy efficiency. Recent studies have suggested that changes in lifestyles and
408 consumer choice are necessary to reduce environmental pressures (Hubacek
409 et al., 2007; Wiedenhofer et al., 2017). For example, He et al. (2018) has shown
410 that increasing consumption of meat, cooking oil and other-starchy foods drive
411 the environmental burdens, which can be addressed by changing our daily diet
412 habits.

413

414 Based on this study, we can identify some possible future researches. In
415 supply-side, we can further explore the upstream and downstream links of the
416 supply chain and international trade, and then consider adopting better policies
417 to complement or replace production-side and demand-side approaches.
418 Besides, the feasibility and effectiveness of policy implementation should be
419 conducted based on these different frameworks of energy consumption.

420

421

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425

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427

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