

The Causal Link Between Circular Economy And Economic Growth In EU-25

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Acronyms and nomenclature				
ARDL	Autoregressive lag model	distributed	R&D	The expenditure of R&D
CE	Circular Economy		RbW	Recycling of bio-waste
CUR	Circularity rate		ReP	Recycling rate of e-products
C2C	Cradle to cradle		RecyFact	Recycling factor
EC	Energy consumption		ResoFacts	Resource consumption factors
EE	Environmental employment		ReW	Recycling rate of e-waste
ELEC	Electricity consumption		RMW	Recycling rate of municipal waste
ETax	Environmental Taxes		RP	Resource productivity
GDP	Gross Domestic Product		RpW	Recycling rate of packaging waste
GMWp	Municipal waste generation per capita		S_Innov	Market share of environment-related innovative products
GPP	National Green Procurement Plans		S_REC	Share of renewable energy in electricity
HE	Heating Energy		TMR	Trade in recyclable raw materials
INV	CE-related investment		VAR	Vector Autoregression model
LF	Labor force-related variables		VECM	Vector error correction model
LU	Luxembourg.		YCG	Per capita GDP growth
MSWG	Municipal solid waste generation		≅/≈/≠	Negative/positive/no influence
PAT	Recycling-related patents		↔/→/~	Bidirectional/Unidirectional/No causality
REC	Renewable Energy Consumption			

27 1. Introduction

28 The 2021 Circularity Gap Report (CGR 2021) has shown that our world is
29 getting less circular. The world economy Circular Gap from 9.1% in 2018 to 8.6%
30 in 2020. The Report signal that large-scale unsustainable influences, processes, and
31 behaviors have occurred in our ongoing linear economy. This results in the
32 production of greenhouse gases (GHGs) from resources extraction to final use
33 accounting for about 70 percent of the total GHGs. If the circular strategy proposed
34 in the Report is adopted, it is expected to reduce global GHG emissions and raw
35 material usage by 39% and 28%, respectively. In 2021, the European Commission

36 released its new Circular Economy Action Plan (CEAP 2021). It fits in a list of EU
37 strategic documents that have a significant impact on standardization, including the
38 new Biodiversity, Farm-to-Table, Industrial, Sustainable Chemicals, and Sustainable
39 Product Initiative strategies. The Commission’s vice-president, Frans Timmemans
40 pointed out that the European economy is still largely linear, with only 12% of
41 materials being recycled and returned to the economy. He said “To achieve climate-
42 neutrality by 2050, to preserve our natural environment, and to strengthen our
43 economic competitiveness, requires a fully circular economy”. Understanding how
44 a circular economy affects economic growth is an important issue in moving towards
45 more circularity.

46 Promoting a circular economy requires an innovative business model that closes
47 the loop throughout the life cycle of products, materials, and resources to achieve
48 sustainability and profitability, while being attractive to customers and suppliers.
49 Therefore, strengthening the CE can achieve mutual benefits in three aspects, that is,
50 increasing company profits, reducing customer costs, and environmental
51 sustainability (Korhonen et al. 2018). McKinsey calculated that by 2030, in Europe
52 alone, the circular economy would create a net benefit of 1.8 trillion Euros due to
53 the technology revolution (McKinsey & Company 2015). The social outcomes
54 created by this economic model are expected to improve the lives of Europeans, such
55 as improving the quality of life and the environment, creating local green jobs, and
56 increasing household income by almost €3000 (Ellen MacArthur Foundation 2015).

57 To understand the current state of the EU’s promotion of a circular economy, we
58 collected six CE related data for preliminary analysis, including municipal waste
59 recycling rate (RMW), CE-related investment (INV), municipal waste generation

60 per capita (GMWp), circularity rate (CUR), trade in recyclable raw materials (TRM),
 61 and real GDP. The second row of Table 1 is the average value of each variable in the
 62 EU-27 as a whole from 2010 to 2017, the next row is the value of each variable in
 63 2018 (Eurostat 2021; World Bank 2021). The last row of Table 1 shows the
 64 percentage increased for each variable in 2018. Of them, CE-related investment and
 65 waste recycling rate increased the most, materials recycling volume and its recycling
 66 rate increased slightly, and waste generation increased the least. The growth of
 67 circular economy indicators and GDP imply that European countries were making
 68 efforts to promote efficient resource management and sustainable economic growth.

69 Table 1: The comparison between the average value of each indicator from 2010 to 2017 and the
 70 corresponding value in 2018 for the EU-27 as a whole

	GMWp kg	TRM Million tonne	CUR %	RMW %	INV Billion euro	GDP Billion us dollar
	Eurostat, 2021				World Bank, 2021	
2010-2017	489	80.15	11.03	42.63	114.17	13360.35
2018	496	84.10	11.50	47.20	130.80	4500.41
Growth %	1.43	4.93	4.31	10.73	14.56	8.53

71 Most recent studies indicate that a circular economy is conducive to economic
 72 development. However, there are few quantitative articles that comprehensively
 73 explore the nexus between circular economy and economic growth. To fill this gap,
 74 this study uses a panel vector error-correcting econometric model (VECM) to
 75 examine whether the causal relationship between the circular economy and
 76 economic growth is beneficial, inhibitory, neutral, or feedback. Given the short
 77 annual data cycles of circular economy indicators, analysis using cross-country
 78 panel data can improve the validity of the model.

79 After introducing the literature gap and the objectives of this paper in the first
 80 section, the literature review in the second section discusses topics that are critical
 81 to this study. The third section proposes the research framework and research

82 methods. The next section contains descriptive statistics of the connected data,
83 empirical evidence, and discussion. The last section proposes conclusions, policy
84 implications, and research limitations.

85 **2. Literature review**

86 The "take-make-waste" approach in the global production and consumption
87 sectors contributed to around half of global carbon dioxide emissions in 2019, and
88 the resulting waste is causing damage to the environment and human health. And a
89 circular economy that promotes waste elimination and the continued safe use of
90 natural resources could generate economic benefits of up to \$4.5 trillion by 2030
91 (World Economic Forum 2019). CE aims to model human industrial following
92 natural processes through a Cradle-to-Cradle (C2C) design philosophy. This way
93 there will be no waste as all materials are considered recyclable and useful nutrients.
94 Therefore, the CE strategy is seen as a key way to achieve both resource decoupling
95 and impact decoupling. This two types of decoupling are one of the necessary
96 conditions for sustainability.

97 In 2018, the European Commission proposed using four aspects of production
98 and consumption, waste management, secondary raw materials, and competitiveness
99 and innovation to measure progress in resource use and circular economy. Each
100 aspect contains some quantitative indicators of circular economy, such as resource
101 productivity (RP), recycling rate of e-products (ReP), municipal solid waste
102 generation (MSWG), and municipal waste generation per capita (GMWp) in the
103 production and consumption aspect; the recycling rate from municipal waste, bio-
104 waste, e-waste, and packaging waste (RMW, RbW, ReW, and RpW) in the waste

105 management aspect; CE-related private investment (INV) and recycling-related
106 patents (PAT) in the competitiveness and innovation aspect; as well as trade volume
107 of recyclable raw materials (TRM) and circularity rate (CUR) in secondary raw
108 materials aspect. Table 2 Panel A shows the literature that uses these indicators and
109 GDP-related variables to construct a linear econometric model to study the impact
110 of circular economy on economic growth, namely the CE–growth nexus study. The
111 empirical results presented that indicators RMW (including ReW, RpW, and RbW),
112 CUR, TRM, INV, PAT, ReP, or RP had a positive impact on the growth of GDP per
113 capita (Busu and Trica 2019; Busu 2019; Trica et al. 2019; Hysa et al. 2020; and
114 Sverko Grdic et al. 2020), indicators CUR, RP, and TRM positively influenced
115 RMW (Tantau et al. 2018), as well as recycling factor (RecyFact) and resource
116 consumption factor (ResoFact) positively influenced RP (Pineiro-Villaverde and
117 García-Álvarez 2020). In addition to the above research, there are some literatures
118 discussing this issue from different angles. Siminică et al. (2020) pointed out that
119 the implementation of the “National Green Procurement Plan” had a positive impact
120 on the EU economy. Sulich and Sołoducho-Pelc (2022) studied the creation of Green
121 Jobs market in the circular economy. They found RbW, INV, and PAT can enhance
122 a number of Green Jobs in the EU-28. About causality, Magazzino et al. (2020) found
123 a bidirectional Granger causality between MSWG and economic growth in
124 Switzerland. Gardiner and Hajek (2020) revealed bidirectional causalities between
125 GMWp and economic growth and between GMWp, heating energy, and R&D
126 intensity indicators using panel VECM in EU countries. Based on the findings, they

127 propose policies, such as fees, incentives, and eco-innovations, to strengthen the
128 circular economy and reduce waste generation.

129 Regarding energy resources and economic growth nexus, many historical
130 literatures use panel VECM to analyze the causal relationship between them (i.e.,
131 energy–growth causality). One of its extensions is the study of CE–growth causality,
132 because CE is highly related to resource consumption, efficiency, and conservation.
133 Panel B of Table 2 shows the literature on the energy-growth and CE-growth nexus.
134 In order to understand the impact of the effective use of energy resources in the EU
135 on the economy in recent years, we only selected literature whose research data
136 period exceeds 2015. For the Central and Eastern European countries, Bercu et al.
137 (2019) found a long-run bidirectional causality between electricity consumption and
138 economic growth and Manta et al. (2020) found no causality between total energy
139 consumption and growth. For clean energy, Smolović et al. (2020) found a long-run
140 bidirectional causality between renewable energy consumption and growth in new
141 EU-13 and a long-run unidirectional causality from growth to renewable in
142 traditional EU-15. Simionescu et al. (2019) found no causality between share of
143 renewable energy in electricity and growth in EU-27. Busu (2020) found a long-run
144 unidirectional causality from renewable energy consumption to growth and a
145 bidirectional causality between resource productivity and growth in EU-28. One of
146 the possible reasons for the inconsistent research results is that the proxy variables
147 used for energy in the literature are different.

148 To the best of our knowledge, there are few articles using quantitative indicators
149 of the four aspects of circular economy to construct an econometric model to

150 comprehensively analyze their causal relationship with economic growth. That is,
151 whether the growth of circular economy will lead to economic growth, reverse
152 growth, co-evolution, or neutrality. Our study aims to fill this gap, using a panel
153 VECM to investigate the causal relationship between CE and economic growth in
154 EU countries.

155 Table 2: Literature survey

Author	Period	Country/Region	Methodology	Depend var.	Independent var. and results
<i>Panel A: GDP-CE nexus</i>					
Busu and Trica (2019)	2010–2017	EU-27	Pooled regression	YCG	CUR, RMW, TRM, ETax, and LF (All \approx YCG)
Busu (2019)	2008–2017	EU-27	Pooled regression	YCG	RMW, S_INNOV, REC, and LF (All \approx YCG)
Trica et al. (2019)	2007–2016	EU-27	Pooled regression	YCG	RP, EE, ReP, S_Innov (All \approx YCG)
Hysa et al. (2020)	2000–2017	EU-28	Panel regression	GDP per capita	ETax, RMW, and INV \approx GDP, TRM \neq GDP
Sverko Grdic et al. (2020)	2008–2016	EU-28	Pooled regression	GDP per capita	INV, GMWp, RMW, RpW, RbW, and ReW \approx GDP
Tantau et al. (2018)	2010–2014	EU-28	Panel regression	RMW	CUR, RP, TRM, ETax, RD, (All \approx RMW except ETax \cong RMW)
Pineiro-Villaverde and García-Álvarez (2020)	2001–2018	EU-28	Pooled regression	RP	RecyFact \approx RP, ResoFacts \approx RP
Siminică et al. (2020)	2007–2018	EU-28	Panel unrestricted VAR	GDP, CE, CO ₂	GPP (GPP \neq CO ₂ ; GPP \approx GDP/CE)
Sulich and Sołoducho-Pelc (2022)	2009–2019	EU-28	Pooled regression	Green Jobs	RbW, PAT, INV \approx Green Jobs
Magazzino et al. (2020)	1990–2017	Switzerland	Granger test	GDP per capita, MSWG	GDP \leftrightarrow MSWG
Gardiner and Hajek (2020)	2000–2018	EU-28	Panel VECM	GDP, GMWp, HE, and R&D intensity	GMWp \leftrightarrow GDP, GMWp \leftrightarrow HE \leftrightarrow R&D intensity
<i>Panel B: Energy–GDP causality</i>					
Author	Period	Country/Region	Methodology	Results	
Bercu et al. (2019)	1995–2017	14 Central and Eastern European countries	Panel VECM	ELEC \leftrightarrow GDP	
Manta et al. (2020)	2000–2017	10 Central and Eastern European Countries	Panel VECM	EC \sim GDP	
Smolović et al. (2020)	2004–2018	New EU-13 and traditional EU-15	Panel ARDL	REC \leftrightarrow GDP (EU-13), GDP \rightarrow REC (EU-15)	
Simionescu et al. (2019)	2007–2017	European Union (EU-28, except LU)	Panel Granger causality	S_REC \sim GDP	
Busu (2020)	2004–2017	European Union (EU-28)	Panel VECM	5-type REC \rightarrow GDP, RP \leftrightarrow GDP	

156 Note: The abbreviations are in the abbreviation table.

157 **3. Model and methodology**

158 CE strategies are seen as a key way to decouple resource use and
159 environmental impacts from economic growth. We selected five key
160 quantitative indicators from four aspects of CE as a benchmark for
161 comprehensively measuring the progress of circular economy in the EU. They
162 are municipal waste generation per capita (GMWp) in the production and
163 consumption aspect, municipal waste recycling rate (RMW) in the waste
164 management aspect, trade in recyclable raw materials (TRM) and circularity
165 rate (CUR) in the aspect of secondary raw materials, and CE-related private
166 investments (INV) in the aspect of competitiveness and innovation. Using
167 these indicators, we constructed econometric models to analyze the causal
168 relationship between CE and economic growth (i.e., CE–growth causality). In
169 recent years, the use of panel econometric models to study the causal
170 relationship between energy resources and economic growth has achieved
171 fruitful results in the EU (i.e., energy resources–growth causality), see Table
172 1 Panel B. Following previous studies and Pao and Chen (2021), this study
173 uses panel VECM to investigate CE–growth causality through the following
174 framework

$$175 \quad LGDP_{it} = \omega_0 + \omega_1 RMW_{it} + \omega_2 LTRM_{it} + \omega_3 LINV_{it} + \omega_4 LGMWp_{it} + \omega_5 CUR_{it} + \varepsilon_{it} \quad (1),$$

176 where the subscript $i=1, \dots, 25$ denotes an individual of European Union
177 countries, t represents the timeline from 2010 to 2018, and ε_{it} is the error
178 term. The variables $LGDP$, $LINV$, $LGMWp$, and $LTRM$ are the natural
179 logarithms of GDP, CE-related investments, generation of municipal waste
180 per capita, and trade volume of recyclable raw materials, respectively. Two
181 percentage-based variables, municipal waste recycling rate (RMW) and

182 circularity rate (CUR), are not converted. The parameter ω_i is the CE-related
183 indicator i elasticity of GDP.

184 We constructed the following equation to examine whether the three
185 explanatory variables CUR, LTRM, and RMW belonging to the resource
186 recycling system in Eq. (1) have multicollinearity.

$$187 \quad \text{CUR}_{it} = r_0 + r_1 \text{LTRM}_{it} + r_2 \text{RMW}_{it} + \varepsilon_{it} \quad (2)$$

188 If Eq. (2) is a goodness-of-fit model, then multicollinearity occurs in Eq. (1)
189 and CUR should be removed from Eq. (1) as follows:

$$190 \quad \text{LGDP}_{it} = \omega_0 + \omega_1 \text{RMW}_{it} + \omega_2 \text{LTRM}_{it} + \omega_3 \text{LINV}_{it} + \omega_4 \text{LGMWp}_{it} + \varepsilon_{it} \quad (3)$$

191 In order to evaluate causality between time series variables in Eq. (3),
192 three steps are required. First, the panel unit root test is used to assess for
193 stationary in a time series. The null hypothesis is that there is a unit root and
194 the alternative is stationary. Time series with unit root is nonstationary and is
195 called integrated of order 1 or $I(1)$. A stationary time series is called integrated
196 of order 0 or $I(0)$. An $I(1)$ series can be changed to $I(0)$ through first-order
197 difference. Three panel unit tests, namely Fisher-type ADF (Augmented
198 Dickey–Fuller), PP (Phillips–Perron) (Maddala and Wu 1999; Choi 2001),
199 and LLC (Levin Lin and Chu 2002) are used to find the order of integration
200 of LGDP, LINV, LGMWp, LTRM, RMW, and CUR.

201 In the second step, if the five series of LGDP, LINV, LGMWp, LTRM, and
202 RMW in Eq. (3) are $I(1)$, then the panel cointegration analysis is performed.
203 If there exists a linear combination of the five variables that is $I(0)$, then these
204 five variables are said to be cointegrated and Eq. (3) is a cointegration
205 equation. Cointegration equation has super-consistent OLS estimator $\hat{\omega}_i$,

206 which means that it is very close to the true parameter (Kao 1999). Two panel
 207 cointegration tests, Pedroni (1999) and Kao (1999), were employed. They
 208 have a common null hypothesis assumes of no cointegration. Pedroni (1999)
 209 derived seven cointegration statistics, four of which are based on the
 210 assumption of homogeneous panels, and the other three are in heterogeneous
 211 panels. Kao (1999) introduced an ADF t-statistics based on homogeneous
 212 panels. Briefly, based on Eq. (3), if (LGDP, RMW, LTRM, LINV, LGMWp)
 213 are $I(1)$ and there exist $\hat{\omega}_i$ $i=0, \dots, 4$ such that residual $\hat{\varepsilon}_{it}$ is $I(0)$, then Eq. (3)
 214 is a cointegration equation. If a cointegration equation exists between the
 215 variables, then there is long-run equilibrium relationship between them and
 216 there is causality between them in at least one direction (Engle and Granger,
 217 1987).

218 When panel cointegration is present, the final step is to extract causal
 219 relationships between the variables in Eq. (3) using panel VECM as follows:

$$\begin{aligned}
 & \begin{bmatrix} \Delta LGDP_{it} \\ \Delta RMW_{it} \\ \Delta LTRM_{it} \\ \Delta LINV_{it} \\ \Delta LGMWp_{it} \end{bmatrix} = \begin{bmatrix} \alpha_{10} \\ \alpha_{20} \\ \alpha_{30} \\ \alpha_{40} \\ \alpha_{50} \end{bmatrix} + \sum_{d=1}^r \begin{bmatrix} \alpha_{11d} & \alpha_{12d} & \alpha_{13d} & \alpha_{14d} & \alpha_{15d} \\ \alpha_{21d} & \alpha_{22d} & \alpha_{23d} & \alpha_{24d} & \alpha_{25d} \\ \alpha_{31d} & \alpha_{32d} & \alpha_{33d} & \alpha_{34d} & \alpha_{35d} \\ \alpha_{41d} & \alpha_{42d} & \alpha_{43d} & \alpha_{44d} & \alpha_{45d} \\ \alpha_{51d} & \alpha_{52d} & \alpha_{53d} & \alpha_{54d} & \alpha_{55d} \end{bmatrix} \begin{bmatrix} \Delta LGDP_{it-d} \\ \Delta RMW_{it-d} \\ \Delta LTRM_{it-d} \\ \Delta LINV_{it-d} \\ \Delta LGMWp_{it-d} \end{bmatrix} + \begin{bmatrix} \lambda_1 \\ \lambda_2 \\ \lambda_3 \\ \lambda_4 \\ \lambda_5 \end{bmatrix} ECT_{it-1} + \\
 & \begin{bmatrix} u_{1it} \\ u_{2it} \\ u_{3it} \\ u_{4it} \\ u_{5it} \end{bmatrix} \quad (4)
 \end{aligned}$$

222 Where Δ is the first-order difference operator, d is the lag length, and u is the
 223 error term. The first-order difference after taking the logarithm of a series (e.g.,
 224 $\Delta LGDP$) approximates its growth rate. The joint-Wald test for the lag periods
 225 of the first-order difference of each explanatory series is to find the short-run
 226 causality from the independent variable to the dependent variable. The error
 227 correction term (ECT or $\hat{\varepsilon}_{it}$) is the residual resulting from the cointegration
 228 Eq. (3) as follows:

229
$$ECT_{it} = LGDP_{it} - \widehat{\omega}_0 - \widehat{\omega}_1 RMW_{it} - \widehat{\omega}_2 LTRM_{it} - \widehat{\omega}_3 LINV_{it} - \widehat{\omega}_4 LGMWP_{it} \quad (5)$$

230 A t-test of the coefficient λ_j of the lagged ECT term is used to find long-run
231 unidirectional causality from the independent variables to the dependent
232 variable. The λ_j is expected to be between -1 and 0, indicating the degree of
233 correction to the previous imbalance.

234 **4. Results and discussions**

235 **4.1 Descriptive statistics**

236 The annual data in our study from 2010 to 2018 were obtained from
237 Eurostat 2021 and the World Development Indicators 2021 (WDI 2021) for
238 the EU 25 countries (except for Malta and Ireland due to insufficient data)
239 (EU-25). Five CE indicators, namely per capita municipal waste generation
240 (GMWp; measured in Kg), municipal waste recycling rate (%) (RMW), trade
241 in recyclable raw materials (TRM; measured in ton), circularity rate (%)
242 (CUR), and CE-related investments (INV; measured in million euro) are all in
243 Eurostat database. Real GDP (measured in million Constant 2015 US\$) is in
244 the WDI database.

245 The summary statistics of the above 6 variables in the EU-25 data set from
246 2010 to 2018 were presented in Table 3. The variables 8-year CAGR and 5-
247 year CAGR respectively represent the average annual growth rate of a
248 variable in 2010-2018 and 2013-2018 for the EU-25 as a whole. The
249 coefficient of variation (CV) is the ratio of the standard deviation to the mean,
250 and it can be used to compare the volatility of different attribute variables. Fig.
251 1 shows the annual mean trend of each variable for EU-25 as a whole from

252 2010 to 2018. Fig. 2 is a dot plot of each time series in each country. The
253 results show that the rising trends of *LGMWp*, *LINV*, and *RMW* were similar
254 to *LGDP*, indicating that they were positively correlated with real GDP. The
255 two indicators in the secondary raw materials dimension, *LTRM* and *CUR*,
256 had different trends from country to country.

257 For the real GDP, *INV*, and *TRM* variables, their first to third largest CV
258 values indicated that the EU has national differences in the three indicators of
259 economic growth, CE-related investment, and material recycling. For the time
260 series of *RMW* and *GMWp*, *RMW* had the second smallest CV value and the
261 second highest 8-year average growth rate, *GMWp* had the smallest CV value
262 and the second lowest 8-year average growth rate. Based on the CV value and
263 annual average growth rate, the EU as a whole attached great importance to
264 waste recycling and resource management. For the two indicators in the aspect
265 of secondary raw materials, *TRM* and *CUR*, the mean of their 8-year average
266 growth rate $((0.284+1.264)/2)$ was less than 1% and the 5-year average growth
267 rate was the lowest, indicating that the EU should actively understand the
268 main barriers that hinder an effective secondary raw materials market, which
269 will make the circular economy more effective.

270 In addition, by comparing the average growth rate of 8-year and 5-year, it
271 can be seen that the growth rate of waste recycling rate was the most stable.
272 The 8-year average growth rate of CE-related investment was the highest, but
273 the 5-year average growth rate was only 0.46 times the 8-year average growth
274 rate, implying that it is imperative to introduce policies to attract investment.
275 The 5-year average growth rate of per capita waste generation was 2.37 times
276 the 8-year average growth rate, while the corresponding GDP was only 1.45
277 times, implying that C2C concept should be actively promoted. Regarding

278 CUR and TRM, we discuss the mean of their annual average growth rates,
 279 because they are both indicators in the aspect of secondary raw materials.
 280 Although their 5-year average growth rate (1.216%) was higher than the 8-
 281 year average growth rate (0.774%), they were still the lowest among all
 282 indicators. Overall, the primary task of promoting a resource-efficient circular
 283 economy is to use C2C design concepts to overcome the obstacles to creating
 284 a secondary raw materials market.

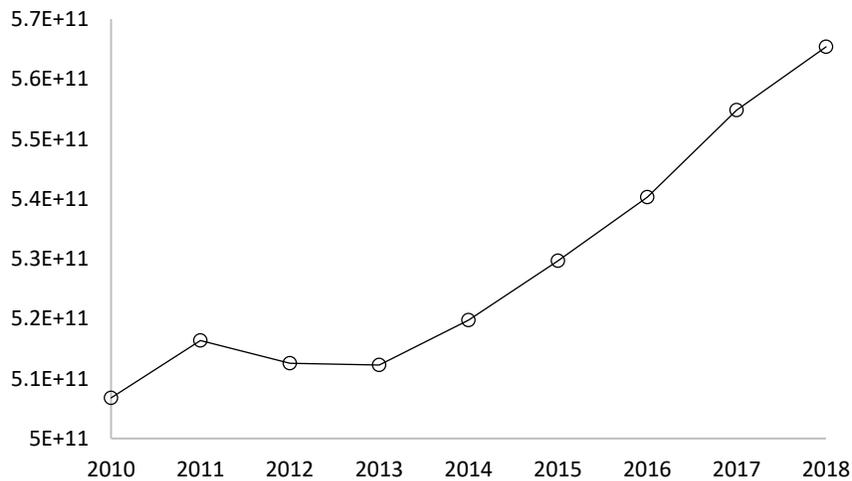
285 Table 3: The descriptive statistics of EU-25 as a whole for actual data, 2010–2018.

	GDP	INV	TRM	CUR	RMW	GMWp
	Constant US 2015 (billion)	Million euro	Million tonne	%	%	kg
Mean	528.639	5058.239	3.189	8.756	34.109	471.866
SD	818.394	7643.364	3.990	6.277	15.587	127.364
%CV	154.812	151.107	125.137	71.687	45.698	26.991
8-year %CAGR	1.377	5.678	0.284	1.264	4.808	0.695
5-year %CAGR	1.992	2.593	1.695	0.738	4.350	1.650

286 Note: SD is the standard deviations, %CV is the coefficient of variation. The 5-year
 287 %CAGR and 8-year %CAGR are the percentage-based compound annual growth rate for
 288 2013–2018 and 2010–2018, respectively.

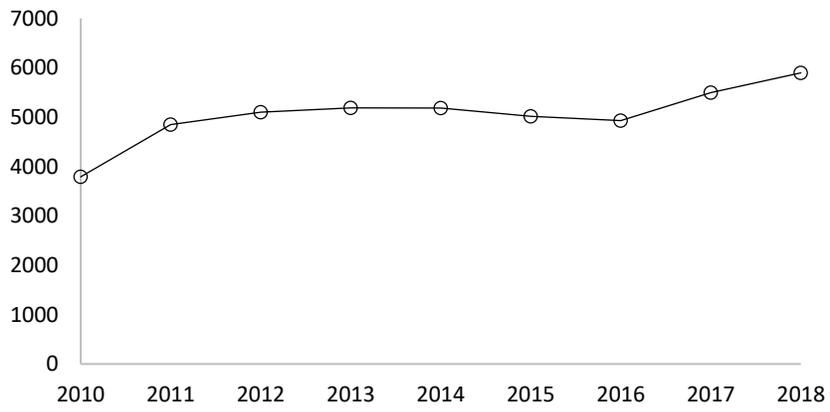
289

GDP (constant US 2015)



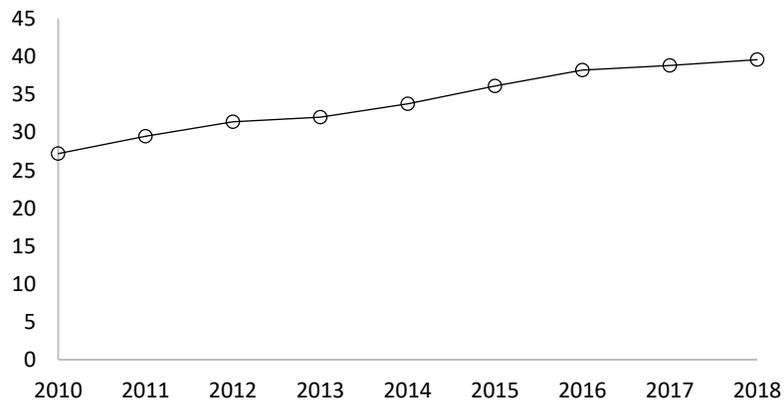
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INV (Million euro)



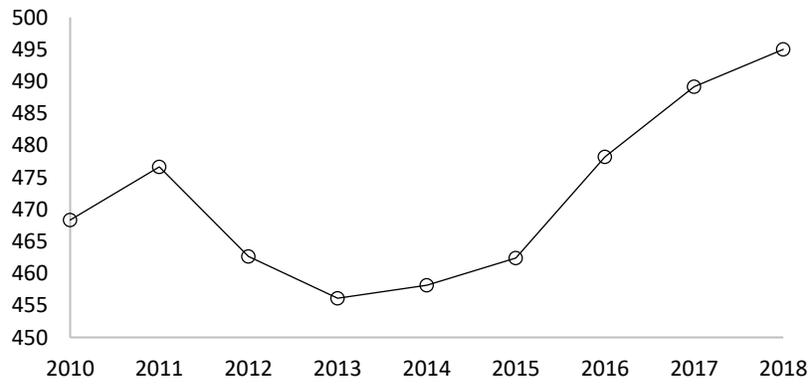
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RMW%



292

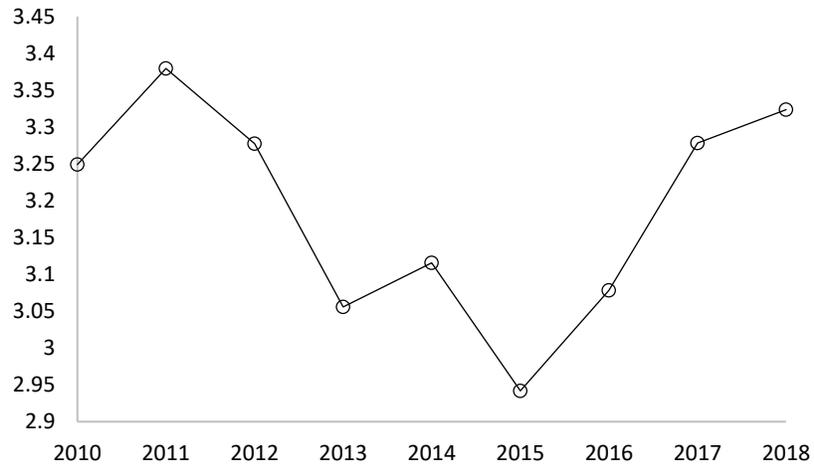
GMWp (Kilograms)



293

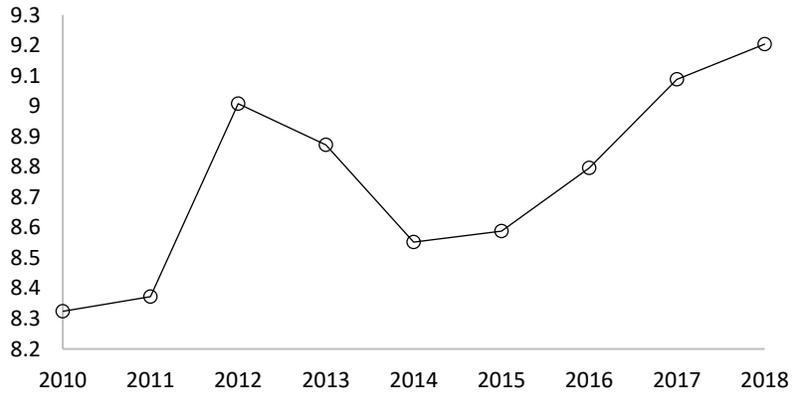
294

TRM (Million Tonne)



295

CUR%



296

297

Fig. 1 Annual average trend of 25 EU countries for each variable (2010–2018).

298

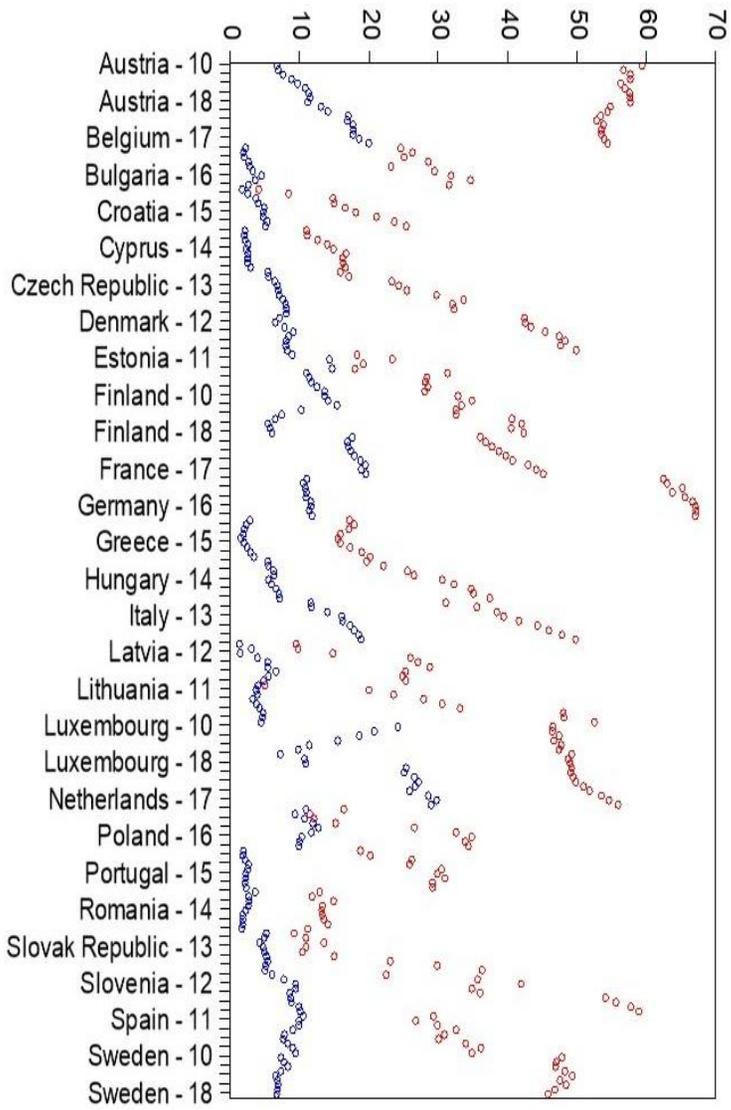
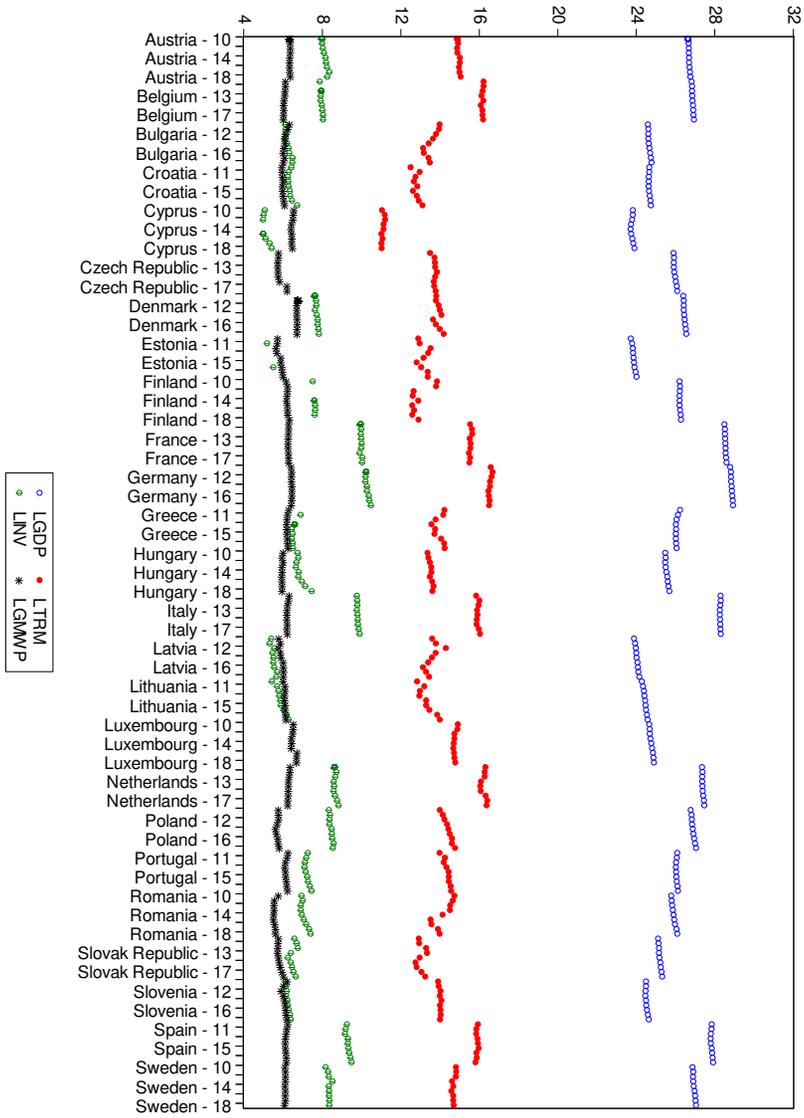


Fig. 2 Dot plots of LGDP versus the CE indicators for EU-25 (2010–2018).

299
300

301

302 **4.2 Long-run estimates**

303 In order to avoid spurious regression occurring in Eqs. (1-3), first, the
 304 integration order of each series must be determined by panel unit root test.
 305 Three panel unit tests, ADF, PP, and LLC, were used. Their results shown in
 306 Table 4 revealed that all the series *LGDP*, *LINV*, *LGMWp*, *LTRM*, *RMW*, and
 307 *CUR* in Eq. (1) were integrated of order one or *I*(1).

308 In the second step, we performed panel cointegration test using Pedroni
 309 and Kao procedures. Table 5 shows that *CUR*, *LTRM*, and *RMW* in Eq. (2)
 310 and *LGDP*, *LINV*, *LGMWp*, *LTRM*, and *RMW* in Eq. (3) was panel
 311 cointegrated. It indicated that there was long-run equilibrium relationship
 312 between *CUR*, *TRM*, and *RMW* and between *GDP*, *INV*, *GMWp*, *TRM*, and
 313 *RMW*, and their respective OLS estimators were consider to be super-
 314 consistent.

315 Table 4: Unit root test for EU-25 panel data, 2010–2018.

Var.	Individual unit root		Common unit root
	ADF	PP	LLC
<i>LGDP</i>	22.428	21.997	4.689
<i>RMW</i>	59.795	60.597	-3.366***
<i>LTRM</i>	21.592	24.668	2.021
<i>LINV</i>	34.741	44.673	0.323
<i>LGMWp</i>	38.180	46.384	-0.150
<i>CUR</i>	62.688	57.093	-7.394***
Δ <i>LGDP</i>	70.340*	71.714*	-8.260***
Δ <i>RMW</i>	145.028***	179.826***	-14.617***
Δ <i>LTRM</i>	226.215***	228.751***	-14.188***
Δ <i>LINV</i>	90.004***	119.480***	-9.314***
Δ <i>LGMWp</i>	188.118**	196.412***	-13.451***
Δ <i>CUR</i>	106.882***	127.775***	-11.594***

316 Note: *, **, and *** denote *p*-val.<0.1, *p*-val.<0.05, and *p*-val.<0.01, respectively.

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319 Table 5: Panel cointegration tests results for Eqs. (2-3), 2010–2018.

<i>Pedroni test</i>				
	Within dimensions		Between dimensions	
Panel v – statistic	-1.421 (2)		Group ρ – statistic	4.094 (2)
	-1.368 (3)			5.280 (3)
Panel ρ – statistic	2.129 (2)		Group PP – statistic	-4.347*** (2)
	3.322 (3)			-8.678*** (3)
Panel PP – statistic	-2.878** (2)		Group ADF – statistic	-3.481*** (2)
	-6.771*** (3)			-5.917*** (3)
Panel ADF – stat.	-2.747** (2)			
	-4.656*** (3)			
<i>Kao test</i>				
ADF – stat.	-2.803** (2)			
	-2.742** (3)			

320 Notes: ** and *** are the same as in Table 4. The (2) and (3) represent Eq. (2) and Eq. (3),
 321 respectively.

322 The two panel cointegration equations (Eqs. 6-8) shown in Table 6 have
 323 R^2 values greater than 98% and normally distributed errors based on the
 324 Jarque-Bera test statistics (JB, 1980). Through the unit root test, we get that
 325 their residual series are integrated of order zero. Therefore, all OLS estimators
 326 in Eqs. (6-8) are super-consistent and there is multicollinearity in Eq. (7)
 327 because of its best fit. Remove the CUR series from Eq. (6) to get Eq. (8). Eq.
 328 (8) was used to construct VECM as shown in Eq. (4) to find the causal
 329 relationship between economic growth and circular economy. The error
 330 correction term (ECT) in VECM is the residual series of Eq. (8).

331 The estimated coefficients of Eq. (7) provided that for every 1 percentage
 332 point increase in RMW and one percent increase in TRM, the average CUR
 333 increased by about 0.058 and 0.009 (=0.869/100) percentage points,
 334 respectively. The positive influence of waste recycling rate (RMW) and
 335 material recycling volumes (TRM) on circularity rate (CUR) is similar to that
 336 of Tantau et al. (2018) for EU-28. The estimated coefficients in Eq. (8)
 337 provided that for every 1 percent increase in INV and GMWp, the average

338 GDP increased by 0.280% and 0.126%, respectively, a 1 percentage point
 339 increase in RMW increased average GDP by 0.200%, and a 1 percent increase
 340 in TRM resulted in a decrease in average GDP by 0.039%. The negative
 341 influence of TRM on GDP can be understood from the annual average trend
 342 of TRM in Fig 1.

343 In summary, a 1 percentage point increase in the waste recycling rate and
 344 a 1% increase in CE-related investment corresponded to 0.200% and 0.280%
 345 increase in GDP, respectively. This revealed that waste recycling and
 346 investment played a key role in economic growth. In fact, Table 3 also shows
 347 that the 8-year and 5-year average growth rates of RMW and INV were the
 348 two highest. In addition, a 1% increase in materials recycling corresponded to
 349 0.039% decrease in GDP. The negative influence of materials recycling on
 350 GDP can be understood from the annual average trend of TRM in Fig 1. Based
 351 on the fact that the 8-year average growth rates of both materials recycling
 352 and materials recycling rate were the lowest, and their 5-year average growth
 353 rates were relatively low, the EU should actively understand the main
 354 obstacles hindering the efficiency of the secondary raw materials market,
 355 which will make the circular economy more effective. Increasing the use of
 356 recycled materials can not only enhance economic resilience, but is also one
 357 of the main goals of the EU Circular Economy Action Plan (CEAP 2021),
 358 which makes goods sold on the EU market clean, circular, and sustainable.

359 Table 6: Panel cointegration equations (Eqs. 6-8), 2010–2018.

	Equation	%R ²	JB-Stat.
(6)	LGDP = 23.537+0.002RMW-0.039LTRM+0.279LINV+0.158LGMWp+0.003CUR (0.218)*** (0.000)*** (0.011)*** (0.016)*** (0.031)*** (0.002)*	99.992	2.378 [0.305]
(7)	CUR = -5.586+0.058RMW +0.869LTRM (2.633)** (0.009)*** (0.190)***	98.006	3.503 [0.174]
(8)	LGDP = 23.743+0.002RMW-0.039LTRM +0.280LINV+0.126LGMWp (0.172)*** (0.000)*** (0.011)*** (0.016)*** (0.023)***	99.993	2.120 [0.347]

360 Notes: JB-stat. is the Jarque-Bera test statistic. The standard error and *p*-value are placed
 361 in parentheses and brackets, respectively. *, ** and *** are the same as in Table 4.

362 4.3 Results and discussion of causality

363 Table 7 provides the estimated results of the panel VECM shown in Eq.
364 (4). The ECT series are the residuals of Eq. (8). The short-run causality and
365 long-run causality were tested using Wald F-statistics and Student's t-statistics,
366 respectively.

367 Regarding short-run causality, Eq. (9a) reveals that no CE indicator had a
368 statistically significant effect on economic growth. According to the results of
369 Eqs. (9b-9c), LGDP had a significant positive statistical effect on RMW and
370 LTRM, but the CE-related indicators in the independent variables were
371 insignificant. In Eq. (9d) with the dependent variable INV, LGDP and
372 LGMWp were positive statistically significant, while RMW and LTRM were
373 insignificant. In Eq. (9e) with the dependent variable LGMWp, LGDP and
374 LTRM were positive and negative statistically significant, respectively, while
375 LINV and RMW were insignificant.

376 The estimated coefficients λ_j of lagged error correction term (ECT_{t-1}) in
377 Eqs. (9a-9e) were negative statistically significant at the 1% level, revealing
378 the long-run bidirectional causality between GDP, RMW, TRM, INV, and
379 GMWp, and each series responded to previous period's deviation from the
380 long-run equilibrium. The adjustment coefficient λ_j measures the mean
381 reversion speed of series j over a period of one year. The 62.2% and 44.3%
382 adjustment speeds of INV and GMWp towards equilibrium were quite fast,
383 while GDP, RMW, and TRM were relatively slow.

384 In summary, from a long-run perspective, there was a causal loop between
385 any two of the five variables (including GDP and four CE indicators) shown
386 in Fig. 3, indicating that there was a close and stable causal relationship

387 between CE and economic growth. In the short-run, 1) the existence of a
 388 negative unidirectional causality from TRM to GMWP implied that increased
 389 material recycling helped reduce waste generation; 2) the existence of a
 390 positive unidirectional causality from GMWp to INV implied that the increase
 391 in waste generation stimulated CE-related investments in order to effectively
 392 convert waste into gold for more sustainable development; and 3) the
 393 existence of a unidirectional causality from GDP to CE indicators without
 394 feedback, indicated that economic growth promoted circular economy, but not
 395 vice versa. This may be because the circular economy is still in its infancy. A
 396 recent ABI research report estimated that with sustainability efforts and
 397 upcoming legislation taking effect, by 2030, the world will achieve circularity
 398 of more than 10.5% (ABIresearch 2021).

399 Table 7: Panel causality test results, 2010–2018.

Dependent var.	Independent variable					Long-run t -stat. ECT _{t-1} [Coff. λ_j]	%R ²
	Short-run F -stat.						
	Δ LGDP	Δ RMW	Δ LTRM	Δ LINV	Δ LGMWp		
(9a) Δ LGDP		0.823(+)	2.354(-)	0.334(+)	0.538(+)	-4.824 [-0.205]***	75.779
(9b) Δ RMW	4.577(+)**		0.635 (+)	----	1.674(-)	-3.799 [-0.189]***	45.079
(9c) Δ LTRM	8.661(+)**	0.027(+)		----	0.431(+)	-4.236 [-0.225]***	58.264
(9d) Δ INV	7.015(+)**	0.111(-)	1.236(-)		15.127(+)**	-7.284 [-0.622]***	62.685
(9e) Δ LGMWp	9.531(+)**	0.008(-)	7.868(-)**	1.724(+)		-7.228 [-0.443]***	57.923

400 Notes: +/-: the sign of the sum of the coefficients of each lagged explanatory variable. The
 401 coefficients of lagged ECT are in brackets. ** and *** are the same as in Table 4.
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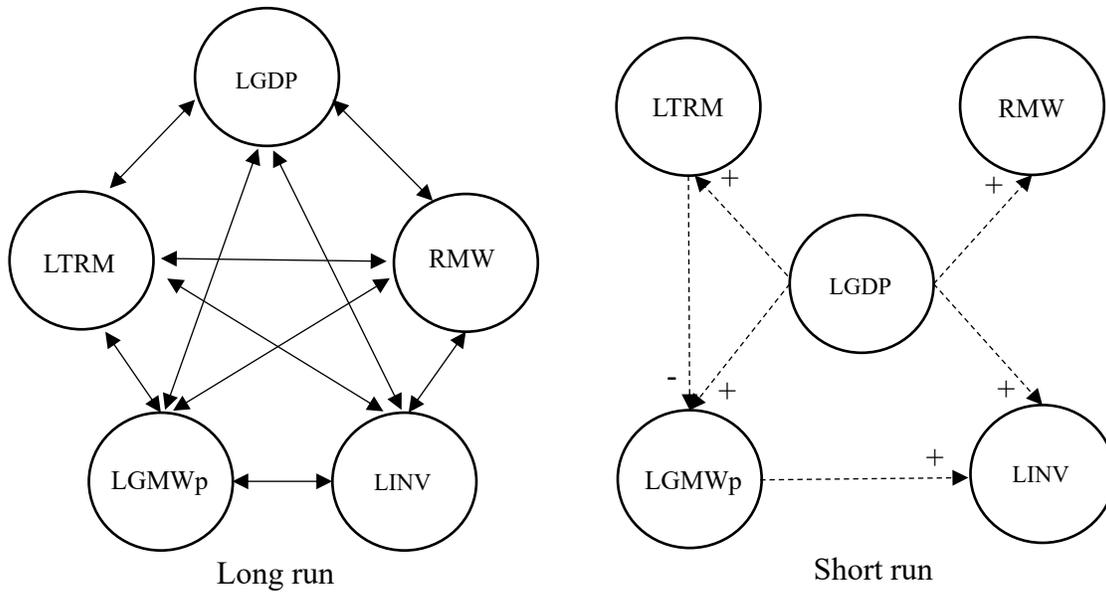
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423 Fig. 3 Causal relationships between CE indicators and economic growth

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5. Conclusions, policy implications, and research limitations

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This research uses panel data from the 25 EU countries from 2010 to 2018 to innovatively explore the causality between circular economy and economic growth (CE-growth causality). The purpose is to introduce policies to achieve a comprehensive decoupling of resources environment as a whole from economic growth. It is actually an extension of the research on the nexus between energy consumption and economic growth nexus (energy-growth causality). The summary statistics of this study showed that the 8-year and 5-year average growth rates of the waste recycling rate and CE-related investment were the highest, while the material recycling volumes and its rate were very low. The result of the long-term equilibrium relationship between the CE indicators and GDP revealed that the two indicators of waste recycling rate and CE-related investment had a positive effect on GDP, while the material recycling indicator had a negative effect. The comprehensive results reveal that it is imperative to introduce policies to encourage CE-related

439 investment and stimulate the secondary raw materials markets. The EU should
440 actively understand the main obstacles hindering the efficiency of the
441 secondary raw materials market, which will make the circular economy more
442 effective. Increasing the use of secondary raw materials is also one of the
443 important goals of the EU's CEAP, which makes goods sold on the EU market
444 clean, circular, and sustainable.

445 Regarding causality, the estimated results of the panel VECM showed that
446 in the short-run, the increased in material recycling led to a decrease in
447 waste generation and the increase in waste generation led to an increase in
448 CE-related investment, indicating that EU countries are committed to
449 achieving zero waste environmental benefits through investment in resource
450 efficiency, which should be the effect of the EU's active implementation of its
451 waste policy. The key target of EU waste policy is to improve waste
452 management and stimulate innovation in recycling (European Commission
453 website). Furthermore, economic growth promoted a circular economy in the
454 short-run, but not vice versa. In the long-run, GDP and CE indicators
455 constituted a causal loop. The findings revealed that the active and effective
456 use of resources had no significant impact on economic growth in the short-
457 term, but there was a close feedback relationship in the long-term, even though
458 the circular economy is still in its infancy. A recent ABI research report
459 pointed out that with sustainability efforts and upcoming legislation taking
460 effect, by 2030, the world will achieve circularity of more than 10.5% (ABI
461 research, 2021).

462 The research results imply that multilateral policies that can promote
463 economic growth while expanding the circular economy should be introduced.
464 Based on the Cradle-to-Cradle design concept, the two key elements of the

465 policy should include encouraging CE-related research and innovation
466 investment to stimulate the secondary raw materials market and improve
467 materials recycling efficiency, as well as formulating laws to implement the
468 EU Waste Policy and the European Green Deal. This can improve resource
469 efficiency, achieve zero waste, and use fewer natural resources to create more
470 value. Such sustainable economic growth can bring welfare to future
471 generations.

472 The limitations of this study in terms of sample size and research methods
473 can be resolved in future studies. Regarding the sample size, due to the short
474 sample period of the CE indicators series (2010-2018), this study uses
475 country-based panel data to meet the sample required for the study. The future
476 will be better, because the general rule of quantitative research is that “the
477 larger the sample, the more accurate the results”. In addition, if the sample
478 size is large enough, more quantitative CE indicators, such as patents or
479 environmental tax rates, can be included in the research model to strengthen
480 the research results. For individual countries with different attributes,
481 individual-based VECM can also be used to explore the impact of a circular
482 economy on economic growth. Furthermore, the dynamic interaction between
483 energy intensity or resource productivity and circular economy can be studied
484 in the future. These efforts can strengthen the development of circular
485 economy policies to achieve sustainability goals.

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601 **Availability of data and materials**

602 *Data and materials are available upon request.*