

1 **Promoting Chinese urban residents' participation in source**
2 **separation and recycling**

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18

19 **Abstract**

20 Source separation and recycling (SSR) for municipal solid waste is an important
21 strategy for the transition to a circular economy and requires broader resident
22 participation. How can residents' participation in SSR be promoted? Here, we
23 consider 13 cities in Jiangsu as microcosms of China. We quantify residents'
24 intentions to participate in SSR by distributing a validated questionnaire to 2,963
25 urban residents, analyze the results through structural equation modeling, and propose
26 localized policy recommendations. We find that residents have positive attitudes
27 toward SSR, although 92.6% of residents in southern Jiangsu were more willing to
28 participate than those in northern Jiangsu (84.6%). Additionally, the influencing
29 factors and their degree of influence on resident SSR participation intentions exhibit
30 disparities across cities. "Accessibility of SSR facilities" simultaneously affects the 13
31 studied cities and is a key factor. "Environmental knowledge" and "environmental
32 attitudes" are important impact factors, with occurrence frequencies of 84.6% and
33 69.2%, respectively. However, laws and regulations have no significant effect on
34 residents' SSR participation intentions. We recommend that the government create
35 favorable external conditions related to facilities and services, promote extensive
36 publicity and educational activities through various channels, and improve the
37 effectiveness of SSR laws and regulations. Future SSR management strategies should
38 be localized, flexible and comprehensive. This research could help decision makers in
39 China and other countries design policy guides to promote SSR and help link current
40 research areas to social development.

41

42 **Keywords:**

43 Municipal solid waste, Source separation, Recycling, Urban residents, China.

44 **1. Introduction**

45 Global municipal solid waste (MSW)¹ generation is expected to increase from
46 2.01 billion tonnes in 2016 to 3.40 billion tonnes in 2050 and to reach 3.83 billion
47 tonnes by 2100 (World Bank, 2018), approximately 70% of which is currently not
48 recycled (Wilson et al., 2015). Poorly managed MSW can harm human health and the
49 ecological environment, as recently reported particularly in connection with heavy
50 metal-contaminated soils (Iftikhar et al., 2021; Tauqeer et al., 2021 (a, b); Turan, 2021
51 (a, b)) and ocean plastic pollution (Schweizer et al., 2020). As a result, the increasing
52 amounts of MSW generation and rapidly increasing resource shortages have long
53 been recognized as two major challenges facing human society sustainable
54 development (Iyamu et al., 2020). Although the most economical method for handling
55 MSW is to minimize its generation (Maung et al., 2017), given the development of the
56 economy and the improvement in living standards, a rapid increase in MSW is
57 inevitable. At present, various strategies are available with which to address an excess
58 of MSW, such as eco-design and the research and development of products and
59 function- or service-based business models, source separation and recycling (SSR)
60 represents an important strategy and one that simultaneously transitions to an
61 integrated circular economy framework (Czajkowski et al., 2014; Yildizbasi, 2021)
62 because it can transform waste into resources. With this characteristic, SSR possesses
63 a potential to create social wealth. At present, various strategies are available with
64 which to address an excess of MSW, such as eco-design and the research and
65 development of products and function- or service-based business models, source

¹ Acronyms—MSW: municipal solid waste; SSR: source separation and recycling; RIPSSR: residents' intentions to participate in source separation and recycling; EK: environmental knowledge; EA: environmental attitudes; FS: facilities and services; SN: social norms; CL: cost losses; SEM: structural equation model; KMO: Kaiser–Meyer–Olkin; RMSEA: root mean square error of approximation; NFI: normed fit index; CFI: comparative fit index; CMB: common method bias.

66 separation and recycling (SSR) still represents an important strategy. Meanwhile, SSR
67 simultaneously transitions to an integrated circular economy framework (Yildizbasi,
68 2021) because it can transform waste into resources. Some developed countries and
69 regions, such as Germany (Bilitewski, 2008), Japan (Tang et al., 2014), Hong Kong of
70 China (Sakai et al., 2008), have had clear success in MSW management via SSR. This
71 implies that SSR can also be successful in developing countries, including China.

72 In fact, China has been devoting considerable effort to promoting its SSR. As
73 early as 2000, China launched an SSR pilot in eight cities (Fig. S1), but an assessment
74 of this practice has indicated a generally poor performance (Tong et al., 2019). In
75 2016, Chinese President Xi Jinping specifically noted the need to introduce SSR in
76 more cities, regions, and provinces and even in rural areas. The ultimate goal was to
77 promote SSR nationwide. Since 2017, the national government has restarted SSR
78 efforts, requiring 46 cities nationwide to take the lead in implementing mandatory
79 SSR and requiring that the recycling rate exceed 35% by 2020. SSR has received
80 unprecedented levels of attention. However, promotion of SSR is still not satisfactory.
81 Since 2011, we began to systematically track MSW in Suzhou, Yangzhou, and Suqian,
82 Jiangsu Province, China (Gu et al., 2014, 2015, 2018, 2021), and recyclable
83 components of MSW exceeding 90% were found. We also reviewed the status of
84 MSW management from a national perspective (Gu et al., 2017). We found that there
85 is no substantial SSR momentum in localized cities, and the participation rate remains
86 low. Few cities have even reported an official recycling rate. SSR has become a
87 political task of local government rather than an activity that involves active
88 participation by the public. Several other studies have identified similar outcomes
89 (Xiao et al., 2017; Meng et al., 2019). Fan et al. (2019) explored stories of successful
90 SSR implementation in developed regions. They found a full level of participation

91 among residents to be the key. Residents are the largest group directly involved in
92 SSR practice, and the SSR policy takes effect through residents. If residents' support
93 and participation are low or inefficient, it may be particularly challenging to build
94 social acceptance for SSRs. Meng et al. (2019) reported that effective policies fully
95 incorporate the views of local residents into specific policy formulations. Thus, a clear
96 understanding of local residents' intentions to participate in SSR (RIPSSR) and the
97 main factors influencing those intentions, as well as the mechanisms underlying
98 decision-making about RIPSSR, is required.

99 To better understand the field, we searched Web of Science for related research
100 using the terms "urban residents", "public", "source separation", "recycling",
101 "participation intention/willingness", and "influencing factors" as keywords and/or
102 research topics. Sixty-two articles were found, which are included in Table S1.
103 Grazhdani (2016) revealed a positive correlation between public education,
104 knowledge, information promotion and RIPSSR. Chen and Gao (2020) reported that
105 time spent and storage space used to store waste at home hinder resident participation
106 in SSRs. Meng et al. (2019) found that the convenience of environmental facilities
107 and services is the most effective control variable for promoting resident participation
108 in SSR. Tang et al. (2014) revealed a sound system of supporting laws and regulations,
109 incentives and penalties for SSR, which are effective in promoting waste recycling
110 and reducing environmental contamination. Moreover, attitudes and social/personal
111 norms attract more attention in developed countries (Bortoleto et al., 2012). More
112 reviews are presented in the Supporting Information because the space is limited. We
113 summarized the influencing factors that occurred most frequently and that had a
114 significant effect and found that RSSRPI may be affected directly and/or indirectly by

115 five community-based concepts, namely, environmental knowledge, environmental
116 attitudes, facilities and services, social norms, and cost losses.

117 However, the limitations of these studies can be interpreted in several ways, and
118 each offers opportunities for this study. First, previous efforts have, for the most part,
119 simultaneously ignored factors influencing RIPSSR and their degree of influence.
120 Such studies have also neglected to quantify each potential influencing factor and
121 assess their importance, so these factors remain uncertain. It is difficult to fully
122 understand resident participation and provide effective government intervention
123 without first understanding the contributions of multiple influencing factors (Meng et
124 al., 2019). Second, previous work on both internal subjective factors and external
125 situational factors that influence RIPSSR is rare. The selection of residents for SSR
126 participation is the result of related external and internal factors working together,
127 which is widely recognized (Meng et al., 2019). Third, most of the relatively mature
128 research on RSSRPI has been conducted in countries other than China. It is unlikely
129 that conclusions drawn from non-Chinese studies and management theories will apply
130 to China due to China's rapid increase in MSW generation and differences in its
131 recycling potential, as well as in the cultural and social attitudes of its population and
132 legislative environment (Gu et al., 2017). Furthermore, after reviewing the 62
133 previous articles, we found 29 Chinese locations for SSR research (Fig. 1). These 29
134 locations are scattered randomly across China and composed of 23 prefecture-level
135 cities (including 11 provincial capitals and 12 prefecture-level cities), four
136 district-/county-level cities, and Hong Kong and Taiwan. Governance in China is
137 centralized and top-down with four administrative levels. Generally, villages/towns
138 belong to districts/counties that belong to prefectural cities, each prefectural city
139 belongs to a province, and each province belongs to the government of China. SSR

140 planning and management is usually presented in the form of a national strategy. That
141 is, the administrators of provinces first receive information and then pass on that
142 information to the cities in the province, which then implement the policies. It must be
143 emphasized that cities should be subordinate to provinces to facilitate the assignment
144 of tasks. However, China has not focused on the mechanisms underlying
145 decision-making, which has led residents to willingly participate in SSR strategies of
146 provincial and provincial-level city administrative systems. From a national
147 perspective, any locally effective, targeted and strategic policy, law or legislation that
148 can stimulate a province's residents to participate in SSR is welcomed.

149 The question, then, is, how provinces and cities can promote resident
150 participation in SSR. To solve this problem, three minor questions must be addressed:

151 (1) To what extent do residents intend to participate in SSR?

152 (2) What are the main factors that influence RIPSSR, and to what degree do they
153 affect it? What are the spatial disparities in these factors across cities?

154 (3) What is the localized decision-making mechanism that drives RIPSSR?

155 To answer these questions, this paper is organized as follows. Section 2 proposes
156 research hypotheses based on previous studies from around the world. Section 3
157 introduces the study area, describes the data acquisition process, and explains the
158 measurement model. Section 4 presents the results of our empirical analysis. Sections
159 4.1–4.3 answer minor questions (1)-(3), respectively. Section 5 discusses the results
160 and proposes localized policy recommendations, and Section 6 presents the
161 conclusions and limitations of this study. The results of this study provide feasible
162 theoretical and empirical support for SSR policy formulation that can promote
163 resident participation as well as for strategies to help countries worldwide promote
164 SSR and provide excellent MSW management.

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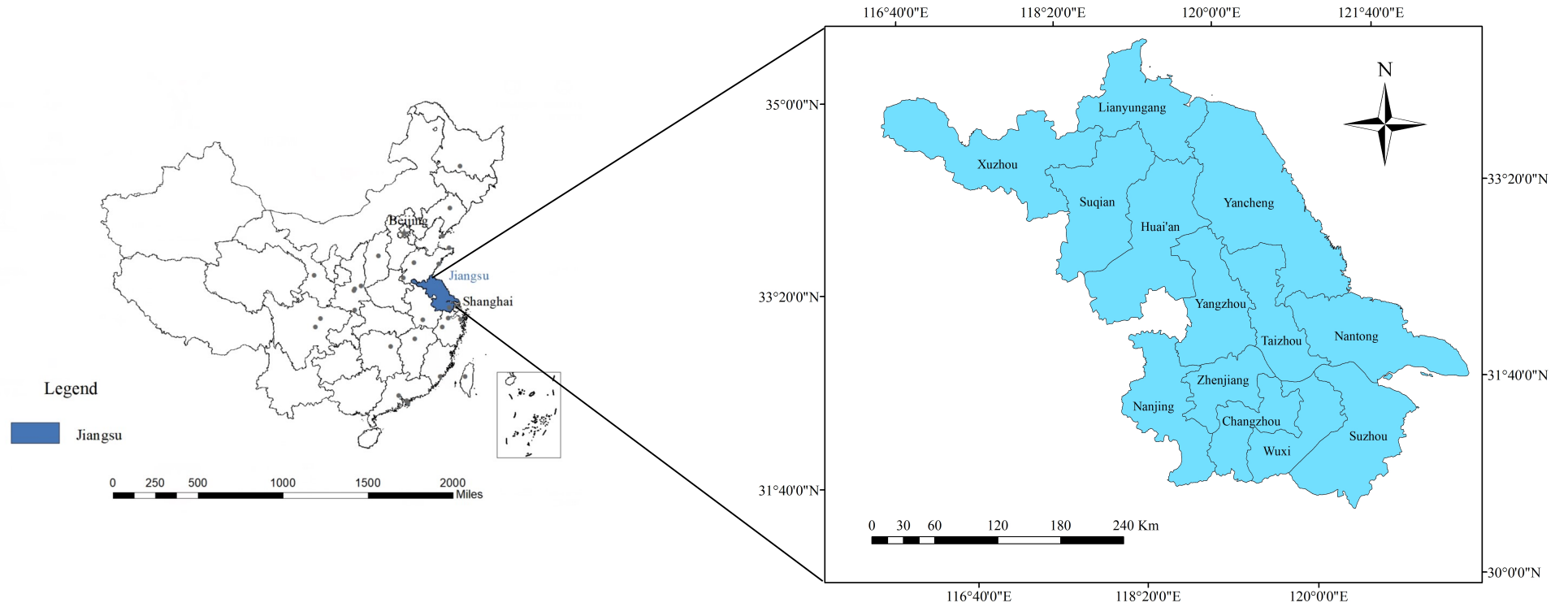


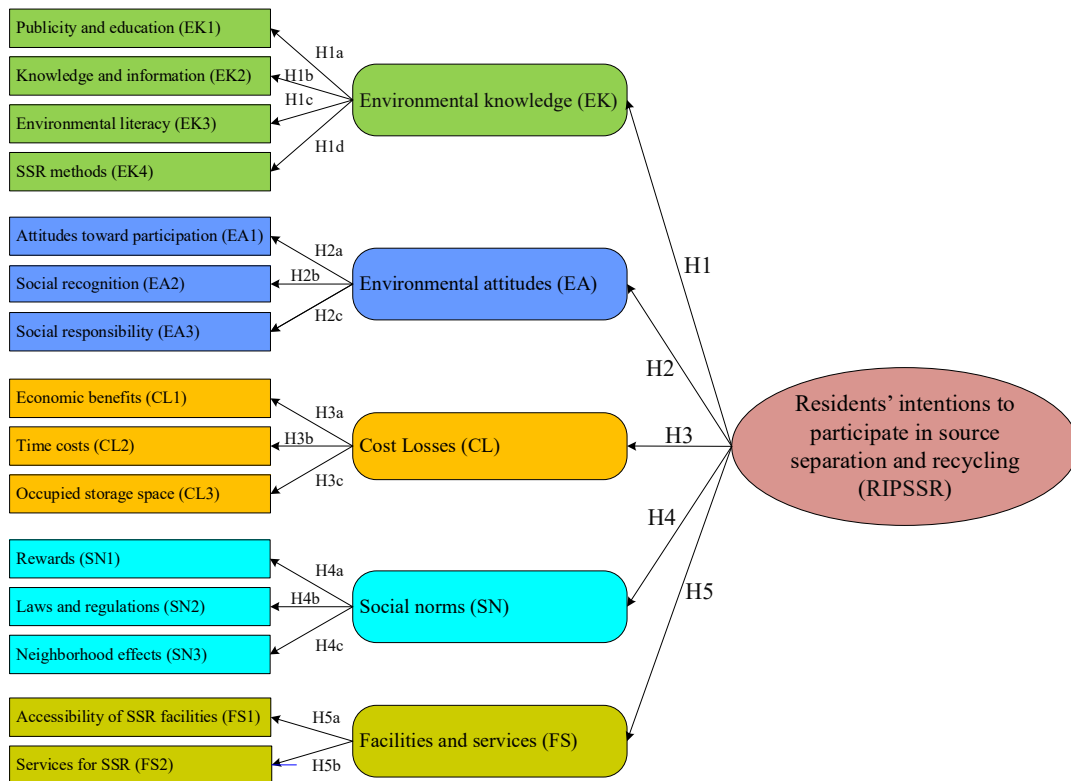
Fig. 1. Location of Jiangsu and SSR outreach throughout China

Note: The black dots represent locations throughout China in which previous SSR research has been conducted.

186 **2. Research hypotheses**

187 After conducting our literature review, hypotheses of RIPSSR are proposed in
 188 Fig. 2. The hypotheses were developed by combining the theory of planned behavior
 189 and attitude-behavior conditions. It states that resident intentions to participate in SSR
 190 are based on five community-based concepts, which are related to RIPSSR through
 191 five paths (H1–H5). These paths provide direct routes to tasks and goals related to
 192 RIPSSR: H1 provides a direct line to environmental knowledge, H2 leads way to
 193 environmental attitudes, H3 points to cost losses, H4 shows way to social norms, and
 194 H5 gives direction to those seeking to promote facilities and services. More
 195 information on H1a-H5b is presented in the Supplementary File.

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198 Fig. 2. Initial conceptual flow chart of RIPSSR hypotheses

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200 **3. Data and methodology**

201 3.1. Study area

202 In China, there are 34 provinces, 333 prefecture-level cities, 2,846
203 district/county-level cities, and 38,755 villages/towns (CNBS, 2020). Jiangsu is a
204 province with 13 prefecture-level cities, 96 districts/counties and 757 villages/towns
205 and is located on the southeast coast of China (Fig. 1), bordering Shanghai and having
206 an urban area that covers 15,536 km², with an urban residential population of more
207 than 80.7 million people in 2019. Its annual per capita GDP (based on calculations
208 using the residential population) reached 123,607 RMB in 2019 and was ranked 3rd in
209 China, just below that of Beijing (164,220 RMB) and Shanghai (157,279 RMB)
210 (CNBS, 2020). MSW generation in Jiangsu increased from 4.3 million tons in 1996 to
211 18.1 million tons in 2019. Each inhabitant produced 0.9 kg of MSW per day in 2019,
212 1.8 times higher than in 1980 (Table S2). Its MSW management pattern is in line with
213 that of most other Chinese provinces and/or municipalities, and it is evolving from
214 mixed to source-separated recycling and treatment. To help the reader better
215 understand why we can view Jiangsu as representative of China, more information on
216 country and the 13 studied cities in Jiangsu, including urban area, urban resident
217 population, GDP, and MSW generation, is provided in Table S3.

218 3.2. Questionnaire design and data collection

219 Data collection for this study was performed through a questionnaire (Table S4).
220 Based on the initial conception of the RIPSSR hypotheses, four types of questions
221 (single choice, multiple choice, five-point Likert scale, and open ended) were used in
222 the design of the questionnaire to assess the relationship between the RIPSSR and its

223 influencing factors. The five-point Likert scale is a scale ranging from 1 to 5 (Strongly
224 agree, Agree, Neither agree nor disagree, Disagree, Strongly disagree). The formal
225 questionnaire consists of 30 questions, of which 29 questions reflect the 15 observable
226 variables in Fig. 2 (H1a-H5b). In the 29 questions, there were 21 positive questions
227 and 8 negative questions (Additional details are provided in Table S4 and Fig. S2).
228 The other question explicitly asks about RIPSSR. The survey divides resident waste
229 into four categories: organic waste (food waste, grass and wood), recyclable waste
230 (plastic, paper, textiles, glass, metal), hazardous waste (e.g., batteries, insecticides, oil
231 paint), and miscellaneous (ceramics, ash, unclassifiable waste). The four categories
232 are generally used in mainstream SSR in China, although other sorting categories, e.g.,
233 three categories and five categories, have also been used.

234 The questionnaire consists of four parts: (1) a brief introduction to the
235 investigation, including its background and research purpose; (2) questions about
236 respondents' current level of SSR participation, including knowledge and information,
237 attitudes toward participation, sense of responsibility, time spent on SSR, and
238 methods of selling recyclable waste; (3) questions about respondents' socioeconomic
239 characteristics, including gender, age, education level, income level, and profession
240 (Table S5); and (4) open-ended questions allowing respondents to answer freely.

241 The questionnaire respondents aged between 18 and 70, were residents of the 13
242 cities of Jiangsu and had lived in their city for more than one year. To verify the
243 rationality of the initial questionnaire design, including its structure, questions and
244 answer options, preliminary research was conducted in Nov. 2019. The preliminary
245 investigation helped us to better understand the ways that residents tend to sort and/or
246 recycle their recyclable waste, as well as the extent and nature of difficulties in SSR.
247 Then, the preliminary questionnaire was revised and redesigned. A formal

248 questionnaire investigation was conducted from Dec. 2019 to Feb. 2020. We collected
249 2,963 valid questionnaires out of 3,177 sent out in total, resulting in a valid response
250 rate of 93.3%. In these valid questionnaires, 1,997 were received via the internet
251 (WeChat, Tencent QQ, and multimedia networks). The others were collected by
252 face-to-face interviews (in households, at markets, on the roadside, and other
253 institutions).

254 3.3. Structural equation model (SEM)

255 SEM is a family of multivariate statistical models that allow analysts to estimate
256 effects and relationships between multiple variables and the intensity of those effects
257 and relationships. SEMs combine the advantages of different statistical methods, e.g.,
258 factor analysis, path analysis, and multiple regressions. SEMs are well established and
259 have been frequently used in the field of MSW management and policy (Xiao et al.,
260 2017; Meng et al., 2019). Additionally, SEMs have been widely applied in other
261 relevant fields, such as management science (Chou et al., 2014), political science
262 (Shao and Hao, 2020), and social behavior (Lee et al., 2017).

263 The general formula for an SEM is:

264

$$265 \begin{cases} \eta = B\eta + \Gamma\xi + \zeta \\ Y = \Delta_y\eta + \varepsilon \\ X = \Delta_x\xi + \delta \end{cases}$$

266

267 where η is an endogenous variable, which refers to a variable that is affected by any
268 other variable in the model; ξ is an exogenous variable, indicating that it is not
269 affected by any other variable but can affect other variables. ζ is a random term; η can
270 be explained by observation variable Y, ξ can be explained by observation variable X,

271 δ represents measurement error in exogenous variables, and ε captures measurement
272 error in endogenous variables.

273 In this study, a hypothetical SEM was tested and debugged with IBM SPSS 22.0.
274 The following tasks were completed: (1) the data were described and inspected; (2)
275 the survey data's reliability and validity were tested; (3) factor analysis was used to
276 reduce the dimensionality of influencing factors and to evaluate the validity of
277 constructs; (4) maximum likelihood estimation was used to evaluate and correct the
278 model; and (5) the model was constructed, and a sensitivity analysis was completed.
279 Additionally, all SEMs of 13 cities were statistically tested before construction, and
280 the results are recorded in Tables S6-8.

281

282 **4. Results**

283 4.1. Resident intentions to participate in SSR

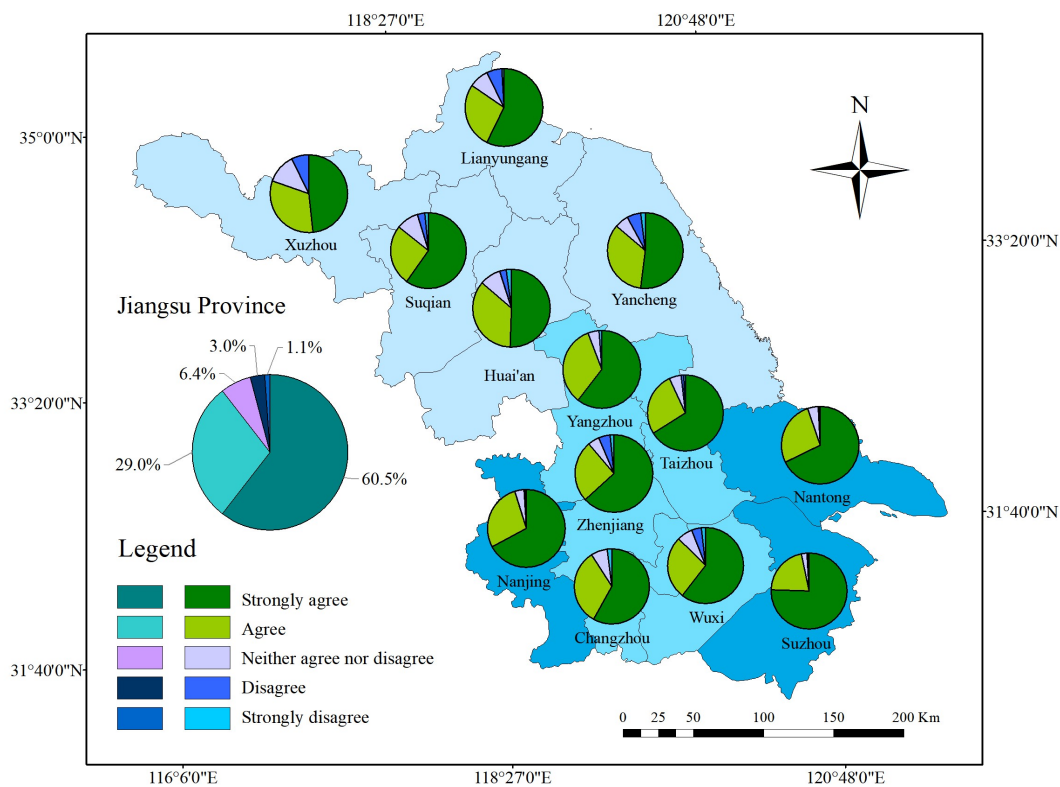
284 The questionnaire results show a positive attitude toward SSR in Jiangsu. A total
285 of 60.5% respondents were very willing to participate in an SSR program, 29.0%
286 were willing, 6.4% were indifferent and only 4.0% stated that they were unwilling to
287 do so (Fig. 3).

288 The spatial distribution shows that the RIPSSR in southern Jiangsu is higher than
289 that in northern Jiangsu. "Strongly agreed" and "agreed" respondents accounted for
290 95.2%, 94.7%, 96.7%, 90.9%, 93.1%, 87.4%, 94.2%, and 88.8% that they intended to
291 participate in SSR in Suzhou, Nantong, Nanjing, Changzhou, Taizhou, Wuxi,
292 Yangzhou, Zhenjiang, respectively. The corresponding data for the other five cities
293 are 86.3% (in Huai'an), 84.5% (in Lianyungang), 85.7% (in Suqian), 80.3% (in
294 Xuzhou), and 86.2% (in Yancheng). Further examination of respondents "strongly

295 agreed” and “agreed” to participate in SSR found that the cities of Suzhou, Nantong,
 296 and Nanjing had higher levels of intentions to participate than the other 10 cities in
 297 Jiangsu. The proportions of respondents who “strongly agreed” in Nantong, Suzhou
 298 and Nanjing were 75.5%, 67.8%, and 67.1%, respectively.

299 Participation intention in Jiangsu was slightly higher than that in Xiamen (Xiao
 300 et al., 2017); in there, 50.2% of respondents were very willing to participate in waste
 301 separation, a further 33.3% were willing, 14.0% were indifferent and 2.5% stated that
 302 they were reluctant to do it. Wu et al. (2021) reported that a large proportion of the
 303 Chinese public has a positive attitude toward waste sorting policy. The results of this
 304 study agree with Wu et al. (2021), who reported that regions with more developed
 305 economies paid more attention to SSR.

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307

308 Fig. 3. RIPSSR in Jiangsu

309 4.2. Localized SEMs construction

310 Based on the results for residents' intentions to participate, we constructed 13
311 initial SEMs for RIPSSR. We used maximum likelihood estimation to estimate the
312 parameters, and the initial evaluation results are presented in Table 1(a) and Fig. S3.
313 The test results were less than satisfactory.

314 The initial SEMs were adjusted and optimized. A small number of rules and
315 steps were required: (1) a path coefficient value between 0.5 and 0.95 was considered
316 good; (2) a path coefficient corresponding to a driving factor has practical
317 significance; (3) the chi-squared value was reduced according to modification index
318 (MI) until all fitness indicators (e.g., root mean square error of approximation
319 (RMSEA), normed fit index (NFI), and comparative fit index (CFI)) satisfied
320 statistical criteria; (4) Harman's single-factor test for common method bias (CMB)
321 was executed to eliminate subjectivity of sociological investigation.

Table 1(a). Evaluation of suitability of internal structure of initial SEMs

Variables	Initial Model												
	Suzhou	Wuxi	Changzhou	Nanjing	Zhenjiang	Nantong	Taizhou	Yangzhou	Huai'an	Suqian	Yancheng	Xuzhou	Lianyungang
EK	0.918***	1.006***	0.920***	0.908***	0.935***	0.964***	0.927***	0.969***	1.003***	0.867***	0.934***	1.030***	0.917***
EA	0.992***	1.067***	0.993***	1.01***	1.033***	0.991***	0.969***	1.017***	0.918***	0.865***	0.873***	1.019***	0.975***
FS	0.766***	0.882***	0.847***	0.867***	0.740***	0.893***	0.925***	0.908***	0.732***	0.881***	0.904***	0.628***	0.902***
SN	0.796***	0.935***	0.792***	0.873***	1.033***	0.908***	0.909***	0.962***	0.800***	1.159***	0.939***	0.855***	0.667***
CL	0.368**	0.394**	0.213*	0.015	0.205	0.241***	0.177*	0.135*	0.659***	0.439***	0.012	0.070	0.299
EK1	0.570***	0.746***	0.665***	0.764***	0.746***	0.840***	0.709***	0.796***	0.558***	0.721***	0.760***	0.613***	0.647***
EK2	0.647***	0.673***	0.602***	0.842***	0.603***	0.862***	0.782***	0.807***	0.590***	0.409***	0.693***	0.627***	0.755***
EK3	0.607***	0.608***	0.621***	0.365***	0.639***	0.611***	0.528***	0.456***	0.697***	0.515***	0.474***	0.470***	0.608***
EK4	0.436***	0.645***	0.527***	0.434***	0.632***	0.581***	0.469***	0.509***	0.421***	0.323***	0.472***	0.311***	0.638***
EA1	0.690***	0.677***	0.684***	0.570***	0.626***	0.747***	0.588***	0.610***	0.694***	0.617***	0.556***	0.709***	0.650***
EA2	0.410***	0.434***	0.407***	0.560***	0.406***	0.548***	0.426***	0.525***	0.372***	0.409***	0.309***	0.429***	0.380***
EA3	0.760***	0.720***	0.827***	0.365***	0.723***	0.878***	0.785***	0.834***	0.601***	0.822***	0.996***	0.692***	0.814***
FS1	0.493***	0.628***	0.623***	0.781***	0.676***	0.807***	0.631***	0.703***	0.459***	0.479***	0.709***	0.500***	0.591***
FS2	0.786***	0.884***	0.838***	0.816***	1.013***	1.004***	0.833***	0.957***	0.696***	0.783***	0.920***	0.900***	0.810***
SN1	0.668***	0.585***	0.682***	0.652***	0.580***	0.686***	0.596***	0.678***	0.602***	0.583***	0.737***	0.538***	0.650***
SN2	0.077	0.192*	0.266**	0.311***	0.188*	0.357***	0.406***	0.383***	0.013	0.226**	0.343***	0.331***	-0.018
SN3	0.591***	0.542***	0.745***	0.803***	0.534***	0.809***	0.681***	0.758***	0.488***	0.453***	0.864***	0.642***	0.685***
CL1	0.449***	0.500***	0.491***	0.482***	0.341***	0.553***	0.384***	0.471***	0.669***	0.887***	0.165***	0.347***	0.483***
CL2	0.874***	0.777***	0.852***	1.063***	1.102*	0.932***	1.015***	0.967***	0.603***	0.347	1.148	1.062*	0.933*
CL3	0.456***	0.533***	0.624***	0.522***	0.493***	0.705***	0.585***	0.586***	0.389***	0.197	0.331**	0.478***	0.404**

Table 1(b). Evaluation of suitability of internal structure of improved SEMs

Variables	Improved Model												
	Suzhou	Wuxi	Changzhou	Nanjing	Zhenjiang	Nantong	Taizhou	Yangzhou	Huai'an	Suqian	Yancheng	Xuzhou	Lianyungang
EK	0.930***	0.991***	/	0.943***	0.918***	0.959***	0.949***	/	0.893***	0.723***	0.945**	/	0.998***
EA	0.984***	0.937***	0.984***	0.956***	0.9933***	0.973***	0.954***	/	0.769***	0.831***	/	0.987***	0.950***
FS	0.765***	0.890***	0.870***	0.857***	/	/	0.914***	0.856***	0.767***	0.852***	0.848***	0.652**	0.808***
SN	0.753***	0.920***	0.744***	0.857***	/	0.926***	0.885***	0.926***	0.721***	/	0.974***	0.920***	0.604***
CL	0.702***	0.638***	0.737***	/	/	0.655***	0.504***	0.636***	0.743***	0.540***	/	0.598***	0.732***
EK1	0.563***	0.735***	0.640***	0.761***	0.670***	0.851***	0.724***	/	0.575***	0.834***	0.797***	0.622***	0.637***
EK2	0.652***	0.675***	/	0.843***	0.516***	0.870***	0.778***	0.822***	0.807***	0.581***	0.717***	/	0.841***
EK3	0.736***	0.6594***	0.737***	/	0.678***	0.744***	0.696***	0.659***	/	0.908***	/	0.572***	0.744***
EK4	/	0.661***	0.637***	/	0.672***	0.867***	0.783***	0.759***	/	/	0.488***	0.526***	0.745***
EA1	0.706***	/	0.678***	0.590***	0.653***	0.771***	0.604***	0.603***	0.831***	0.588***	/	0.690***	0.656***
EA2	/	0.467***	/	0.537***	/	0.561***	/	/	/	/	/	0.481***	/
EA3	0.769***	0.832***	0.844***	0.866***	0.744***	0.859***	0.791***	/	0.525***	0.896***	/	0.742***	0.814***
FS1	0.488***	0.619***	0.639***	0.741***	0.537***	0.676***	0.630***	0.681***	0.511***	0.479***	0.702***	0.490***	0.617***
FS2	0.794***	0.903***	0.817***	0.845***	/	/	0.833***	0.990***	0.608***	0.785***	0.923***	0.918***	0.780***
SN1	0.697***	0.626***	0.676***	0.668***	/	0.683***	0.603***	0.6561***	0.592***	0.700***	0.737***	0.521***	0.547***
SN2	/	/	/	/	/	/	/	/	/	/	/	/	/
SN3	0.568***	0.503***	0.762***	0.814***	0.567***	0.816***	0.684***	0.783***	0.548***	/	0.865***	0.581***	0.771***
CL1	0.536***	0.674***	0.447***	/	/	0.510***	0.492***	0.538***	0.762***	0.585***	/	0.532***	/
CL2	0.532***	0.458***	/	/	/	0.621***	0.660***	/	0.523***	/	/	/	0.483***
CL3	/	/	/	/	/	/	0.460***	/	/	/	/	/	/

Note: *** p < 0.001; ** p < 0.01; * p < 0.05. The latent variables of EK, EA, FS, SN and CL are environmental knowledge, environmental attitudes, facilities and services, social norms, and cost losses, respectively. The observable variables of EK1, EK2, EK3 and EK4 are publicity and education, knowledge and information, environmental literacy, and SSR methods, respectively. The observable variables of EA1, EA2 and EA3 are attitudes toward participation, social recognition and social responsibility, respectively. The observable variables of FS1 and FS2 are accessibility of SSR facilities and services for SSR, respectively. SN1, SN2 and SN3 are rewards, laws and recognition, and neighborhood effects, respectively. CL1, CL2 and CL3 are economic benefits, time cost and occupied storage space, respectively.

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331 Taking the SEM for Suzhou as an example, the results of the goodness-of-fit
332 tests show that the chi-squared value for the initial model is 240.432 ($P = 0.000$), there
333 are 85 degrees of freedom, and the values of all the commonly used fit indices satisfy
334 the corresponding criteria. However, according to the parameter estimations for the
335 initial model (Fig. S3 (1-a)), the standardized path coefficient for the influence of
336 “laws and regulations (SN2)” on RIPSSR is only 0.077, which is very small, and the P
337 value is 0.327, which means that the path coefficient is not significant at the 0.05 level.
338 Therefore, the initial assumption that “SN2 \leftarrow RIPSSR” is valid is not supported.
339 From a practical point of view, laws and regulations place few constraints on minority
340 residents’ participation in SSR in Suzhou because most existing SSR laws and
341 regulations in Suzhou as well as in China are merely guidelines, and thus, directives
342 and incentive mechanisms are lacking. Even though the laws and regulations for
343 mandatory SSR were introduced on June 1, 2020, in Suzhou, they targeted only a
344 small number of pilot communities and had a coverage rate lower than 1%. In other
345 words, given the current status, almost none of respondents’ actual SSR intentions are
346 significantly affected by the laws and regulations. Therefore, to optimize the model
347 and reflect reality, the path between “SN2” and “RIPSSR” was dropped.

348 Then, the model was extended with an MI. The MI value between the observed
349 variable “Environmental literacy (EK3)” and the latent variable “Cost losses (CL)”
350 was very high, 21.32. This means that adding a path between EK3 and CL to the
351 model reduces the chi-squared value for the modified model by at least 21.32.
352 Moreover, realistically, residents are easily affected by “EK3”; they invest time and
353 effort to absorb knowledge and information as well as to improve their environmental
354 literacy, their SSR methods, and their ability to engage in SSR. Based on the model
355 analysis and actual situation, a path between the observed variable “EK3” and the

356 latent variable “CL” was added. The path coefficients for the modified model were
357 estimated (Fig. S3 (1-b)). The results are shown in Table 1(b). The improved SEM for
358 Suzhou is very good.

359 The models for the other 12 cities were also optimized, mainly by dropping
360 and/or adding paths; more detailed information is presented in Table 1 (a, b) and Fig.
361 S3 (2a-13c). All estimated path coefficients for modified models are significant at the
362 0.05 level, and most parameters are significant at the 0.01 level, indicating a high
363 level of significance. This significance implies that the other 12 SEMs are credible at
364 95%. A comparison of index evaluation results for initial hypothetical models and
365 modified models shows that results of all chi-squared tests are lower; values for each
366 fit index are better than those before modification; all RMSEAs are less than 0.08,
367 indicating an acceptable level of model fit; the NFI and CFI are all greater than 0.90,
368 showing that modified SEMs for RIPSSR fit well (Bortoleto et al., 2012; Meng et al.,
369 2019); and the CMB are all less than 40%, indicating that model results present an
370 objective truth.

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Table 2. Goodness-of-fit evaluation results for the models

Model		RMSEA			NFI	CFI	CMIN/DF	CMIN	CMB
		Mean	P5	P95					
		Less than 0.1			Values higher than 0.9	Values higher than 0.10	<1 is good, 1-3 is fit and the acceptable range is 1-5	The smaller, the better	Values lower than 40%
Suzhou	Initial Model	0.085	0.072	0.098	0.755	0.823	2.829	240.432	25.2%
	Improved Model	0.059	0.037	0.080	0.902	0.950	1.881	71.460	
Wuxi	Initial Model	0.124	0.111	0.103	0.748	0.793	2.598	220.863	28.7%
	Improved Model	0.058	0.033	0.081	0.910	0.962	1.631	75.047	
Changzhou	Initial Model	0.107	0.093	0.121	0.742	0.802	3.243	275.626	25.8%
	Improved Model	0.072	0.046	0.098	0.906	0.949	2.031	62.956	
Nanjing	Initial Model	0.124	0.111	0.103	0.748	0.793	4.159	353.505	37.2%
	Improved Model	0.039	0.000	0.075	0.969	0.993	1.308	27.467	
Zhenjiang	Initial Model	0.104	0.085	0.123	0.730	0.820	2.332	198.234	27.3%
	Improved Model	0.081	0.031	0.126	0.901	0.951	1.815	30.858	
Nantong	Initial Model	0.122	0.112	0.132	0.842	0.862	6.339	538.786	38.5%
	Improved Model	0.095	0.082	0.109	0.915	0.933	4.271	205.022	
Taizhou	Initial Model	0.106	0.094	0.117	0.770	0.814	4.048	344.119	30.5%
	Improved Model	0.068	0.053	0.084	0.900	0.940	2.273	134.135	
Yangzhou	Initial Model	0.121	0.114	0.129	0.811	0.827	9.040	768.438	33.9%
	Improved Model	0.051	0.033	0.069	0.974	0.985	2.418	50.776	
Huai'an	Initial Model	0.110	0.095	0.125	0.623	0.697	3.184	270.649	22.0%
	Improved Model	0.054	0.011	0.086	0.905	0.963	1.526	39.682	
Suqian	Initial Model	1.119	0.104	0.134	0.618	0.688	3.339	283.846	25.4%
	Improved Model	0.044	0.000	0.083	0.934	0.983	1.322	29.075	
Yancheng	Initial Model	0.146	0.132	0.161	0.692	0.737	4.658	395.938	29.8%
	Improved Model	0.077	0.021	0.129	0.968	0.983	2.021	181.191	
Xuzhou	Initial Model	0.084	0.068	0.100	0.733	0.826	2.249	191.138	25.31%
	Improved Model	0.000	0.000	0.030	0.939	1.000	0.760	28.125	
Lianyungang	Initial Model	0.105	0.085	0.125	0.687	0.793	2.203	187.268	24.80%
	Improved Model	0.000	0.000	0.061	0.928	1.000	0.924	32.335	

374 4.3. Factors influencing the discrepancy in RIPSSR across cities

375 The standardized path coefficient estimates for 13 cities are depicted in Fig. 4.
376 We found that (1) “facilities and services” have a large overall effect on RIPSSR, with
377 an occurrence frequency of 92.3% (12/13), and “accessibility of SSR facilities” is a
378 key factor, which is the only factor that simultaneously affects 13 cities’ RIPSSR; (2)
379 “environmental knowledge” and “environmental attitudes” are important impact
380 factors determining residents to participate in SSR, with occurrence frequencies of
381 84.6% (11/13) and 69.2% (9/13), respectively; (3) intention to participate in SSR of
382 residents of all 13 cities is not affected by “laws and regulations”; and (4) factors
383 influencing RIPSSR and their degree of influence are different across 13 cities, which
384 results in disparities at the local level. It should be noted that the frequency of
385 occurrence here is the number of occurrences of one factor affecting the RIPSSR in
386 13 cities of Jiangsu. The importance ranking of the influencing factors for RIPSSR in
387 the 13 cities is provided in Table S9(a, b).

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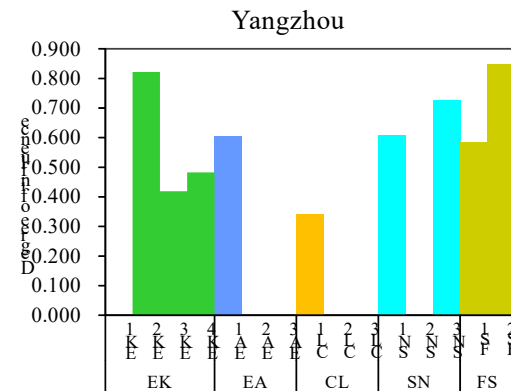
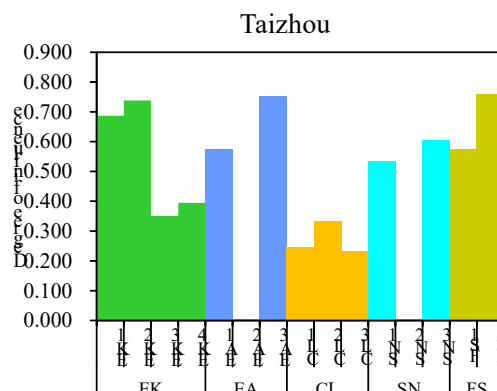
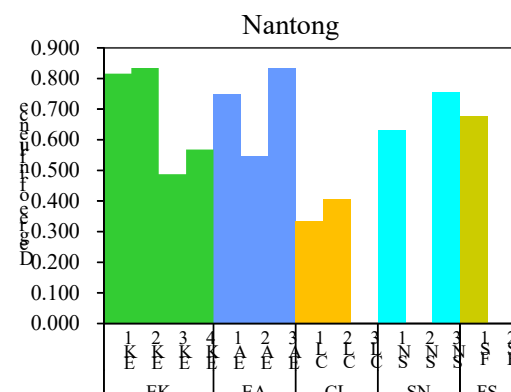
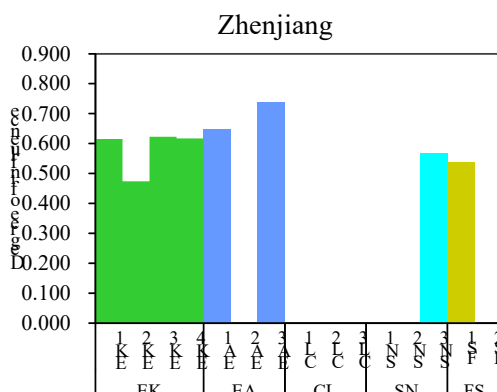
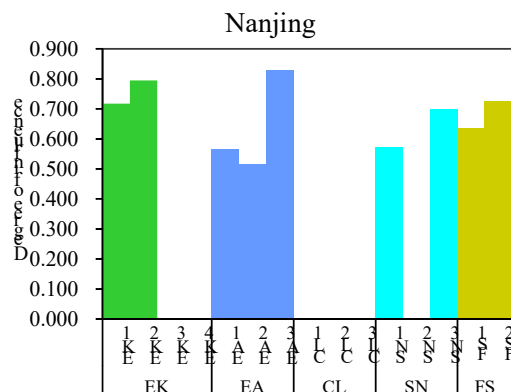
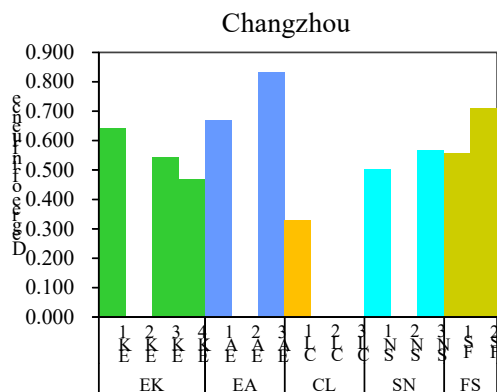
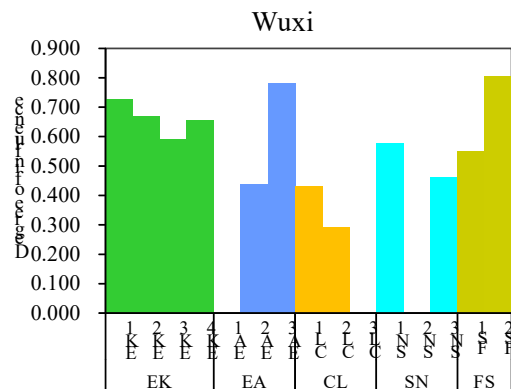
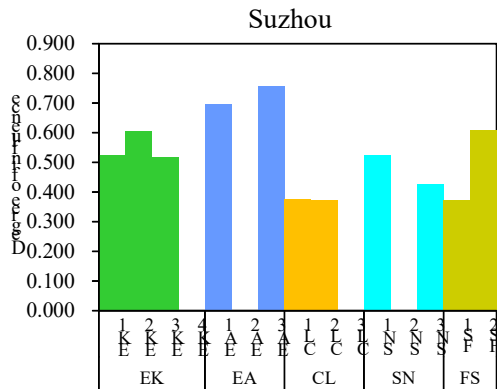
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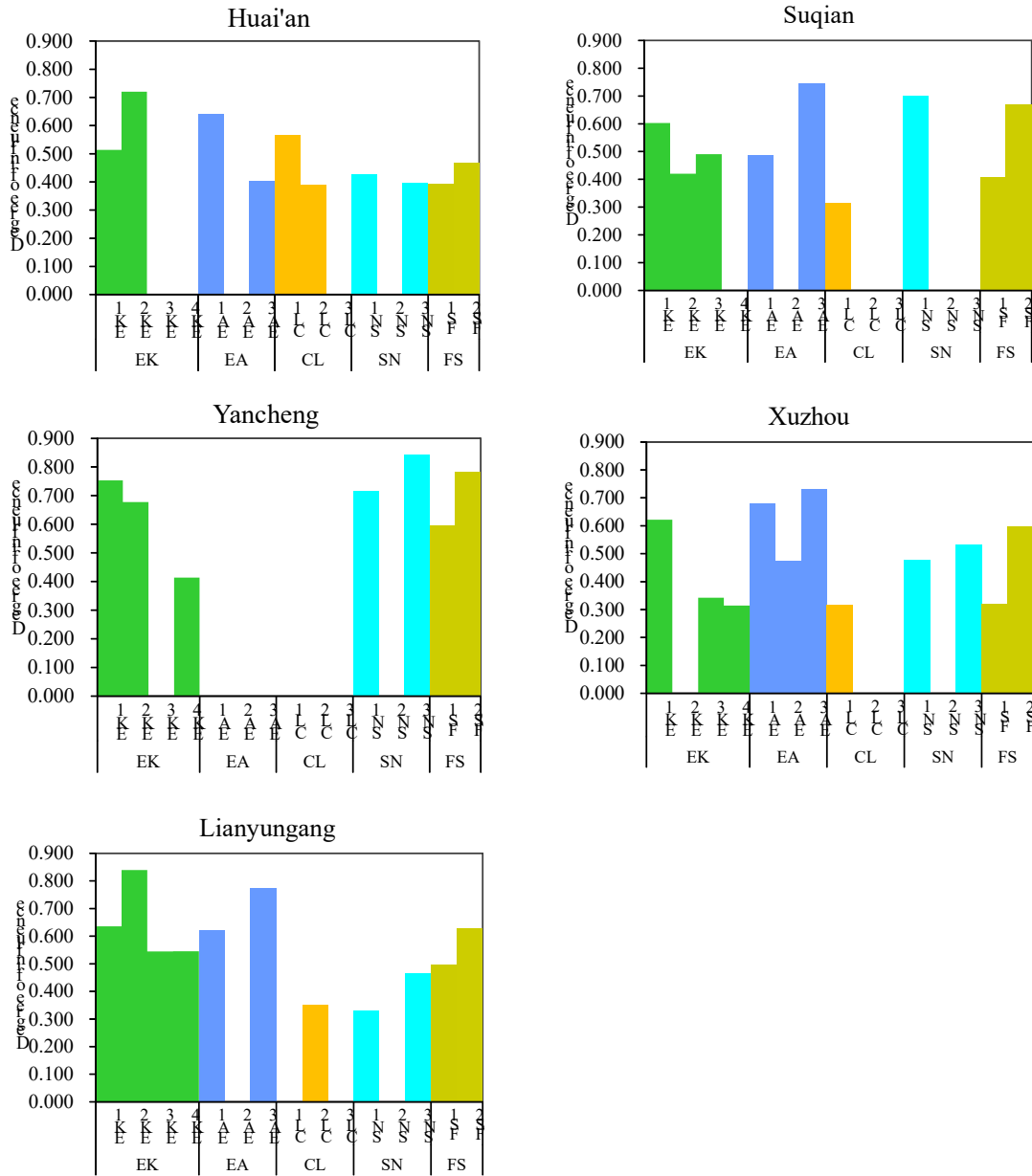
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474 **Fig. 4. The degree of influence of key local factors on RIPSSR**

475 Note: The latent variables of EK, EA, FS, SN and CL are environmental knowledge, environmental attitudes, facilities and services, social norms, and
 476 cost losses, respectively. The observable variables of EK1, EK2, EK3 and EK4 are publicity and education, knowledge and information, environmental literacy,
 477 and SSR methods, respectively. The observable variables of EA1, EA2 and EA3 are attitudes toward participation, social recognition and social responsibility,
 478 respectively. The observable variables of FS1 and FS2 are accessibility of SSR facilities and services for SSR, respectively. SN1, SN2 and SN3 are rewards,
 479 laws and recognition, and neighborhood effects, respectively. CL1, CL2 and CL3 are economic benefits, time cost and occupied storage space, respectively.

480 **5. Discussions and policy recommendations**

481 The policy recommendations given in this study are valuable for other provinces
482 and/or cities nationwide since Jiangsu represents a microcosm of China. Based on the
483 results from the analysis of 13 established SEMs, four policy recommendations were
484 proposed: 1) creating favorable external conditions regarding facilities and services, 2)
485 promoting extensive publicity and educational activities through various channels, 3)
486 improving the effectiveness of laws and regulations, and 4) implementing flexible,
487 tailored, and localized management strategies. Each policy recommendation is
488 described in detail below.

489 First, it is essential to plan and provide additional services and improve the
490 accessibility of SSR facilities. According to the results of this study, “facilities and
491 services” have a large overall effect on the RIPSSR, and “accessibility of SSR
492 facilities” was the only factor that affected the RIPSSR in all 13 cities simultaneously
493 (Fig. 4 and Table S7). Although China started SSR pilot programs in 2000, one of the
494 reasons these programs failed is that back-end separation of waste, transportation, and
495 recycling facilities and services was incomplete and inefficient, which seriously
496 dampened residents’ enthusiasm (Meng et al., 2019). Even now, services provided by
497 the accessibility of waste management systems in most Chinese cities are lacking.
498 Facility accessibility and service refinement should be integrated, which requires
499 detailed planning and construction of SSRs, as well as corresponding support facilities
500 in all cities in Jiangsu and in China. Recycling facilities are inextricably linked to
501 residential agglomerations. In 2018, China's urbanization rate broke through 60.0%
502 (CNBS, 2020). Rebuilding all facilities in the old communities in a short time is
503 unrealistic, generally, which is connected with the size of facilities and the availability

504 of funding. Therefore, the strategy presented here should involve retrofitting and
505 upgrading old infrastructures in the old communities. It is conservatively estimated
506 that there is still room for 20.0% of China's urbanization rate in the future (PRC,
507 2021). Then, in the process of urbanization, the accessibility of SSR facilities (e.g.,
508 appropriate distances, recycling sites and categories) should be carefully considered.
509 SSR services should be diversified to include door-to-door collection, flexible times
510 for accessing SSR services, and convenient SSR and community collection sites.
511 Additionally, SSR services should also be integrated with telecommunications and the
512 internet (e.g., Chinese Alipay, Chinese powerful nation, WeChat, MicroBlo, Tencent
513 QQ, and Credit Cards). Moreover, the construction of recovery sites for renewable
514 resources and the development of a standardized resource recovery system should be
515 accelerated to make recycling facilities and/or services more accessible.

516 Second, according to the analysis results, “environmental knowledge” and
517 “environmental attitudes” are important factors influencing the objective function of
518 RIPSSR. If these observable variables (publicity and education, knowledge and
519 information, environmental literacy, SSR methods, attitudes toward participation,
520 social recognition, and social responsibility) are applied to management and
521 governance, they will result in a common focus on strategies for managing citizens’
522 basic education, knowledge, publicity, which can occur only through gradual and
523 long-term positive developments. Education can effectively bridge the gap between
524 having the right attitude and doing the right thing (Liu et al., 2019). It is necessary to
525 increase environmental education to establish environmental responsibility, which is
526 an essential component of school curricula. Attitudes and behaviors are influenced by
527 education and are formed in the long term. It should be included in preprimary- and
528 primary-level curricula while capacity building initiatives in terms of knowledge and

529 skill transfer in solid waste management, and it should be focused on university
530 courses. Xiao et al. (2007) reported that having more knowledge provides the biggest
531 incentive to participate in recycling. The goal is to guarantee that children understand
532 how to separate waste correctly while also ensuring that the benefits of doing so instill
533 a sense of moral obligation. School education and social publicity education are
534 generally the main sources of environmental knowledge. Existing studies (Grazhdani,
535 2016; Xiao et al., 2017) have revealed that there is a strong positive correlation
536 between publicity efforts and residents' participation in SSR. If residents are exposed
537 to such publicity more frequently through more channels, their awareness of the need
538 for environmental protection and attitudes toward participation will become more
539 entrenched as they increase their SSR participation. Therefore, governments and other
540 administrative groups should increase SSR publicity and education through public
541 channels such as media, advertisements, televised announcements, applications,
542 billboards, mobile client services, and mobile internet. Plans must be made to
543 organize SSR training in workplaces, schools, and communities to enhance residents'
544 environmental awareness and willingness to participate in SSR, improve their SSR
545 knowledge, and encourage them to build a green and low-carbon civilization and live
546 sustainable "zero-waste" lifestyles. This finding also suggests that SSR policies
547 should be subtle, with priority being given to residential daily life, as daily life has a
548 larger effect on willingness to participate. Additionally, this finding suggests that
549 various strategic SSR management initiatives should be improved and promoted
550 simultaneously.

551 Third, the effectiveness of laws and regulations should be improved. Although
552 we tried to change the "laws and regulations (SN2)" path during the model
553 improvement process (Section 4.2 and Fig. S3), the results show that "SN2" does not

554 affect the RIPSSR in any of the 13 cities (Fig. 4). This suggests that current “SN2” are
555 not important for RIPSSR. The reason for this finding is that current “SN2” are void.
556 Although certain cities in Jiangsu (e.g., Suzhou, Nanjing, Wuxi) have enforced SSR,
557 even imposing fines, the entities where such enforcement occurs are generators of
558 group institution waste, such as shopping malls, supermarkets and owner-operated
559 shops. In fact, individual residents are not the subject of punishment. It is possible that
560 individual residents play multiple roles. That is, not only do they share responsibility
561 for the waste generated by a group institution. They also independently generate
562 household solid waste and street waste. However, such individual residents are rare.
563 As a result, current mandatory SSR policies are ineffective for RIPSSR. Jiangsu’s
564 urban population density is 2,221 person/km², more specifically, 4,160 person/km² in
565 Nantong and 5,420 person/km² in Huai’an (JNBS, 2020). If the authorities are
566 reserved in enforcing SSR laws, total costs (e.g., camera surveillance, personnel
567 supervision) will be high. SSR developers should also pay attention to the cost of
568 inputs and the introduction of mandatory “SN2”. At the same time, hurriedly
569 improving “SN2” may seem unrealistic since strict “SN2” has been in place for more
570 than 20 years in Jiangsu and elsewhere in China. For instance, waste separation was
571 introduced in Article 28 of the regulations issued by the Departments of the State
572 Council of Urban Appearance and Environmental Sanitation in 1996. Waste
573 separation was emphasized in Article 24 of the Law of the People's Republic of China
574 on the Prevention and Control of Environmental Pollution by Solid Waste. Chinese
575 governance is top-down. All provinces and cities must follow national “SN2”.
576 However, “SN2” in China was invariably first introduced and then followed on some
577 occasions in an attempt to motivate compliance (Xiao et al., 2017). We should
578 intensely recognize that effective implementation and supervision are essential;

579 otherwise, “SN2” is simply provisional and optional. Several demonstration
580 communities initially adopted waste separation campaigns. However, those
581 campaigns were followed by a policy of all waste being mixed together, which
582 dampened residents’ enthusiasm. Because residents’ enthusiasm has been dampened,
583 it will take longer to restore their trust. MSW is a nonpoint source pollution that
584 “tracks” the whereabouts of humans and becomes scattered into every corner of the
585 city. In other words, whether waste is sorted correctly and disposed of in a trash bin is
586 closely related to residents’ participation intentions and behavior. At present, it is very
587 important to improve environmental education and increase residents' sense of
588 environmental responsibility, as mentioned above. Additionally, the priorities for
589 future urban MSW management should differ from current legislative-centered
590 measures. Provincial and city governments are required to strengthen the top-level
591 design of urban SSR and formulate “SN2” with bite (Meng et al., 2019). As
592 mentioned in the Introduction, several developed countries and regions, such as
593 Germany, Japan, and Hong Kong, have succeeded in implementing SSR. An
594 important tool is the firm establishment of “SN2”, which supports SSR, as its
595 implementation and enforcement are effective in promoting SSR and reducing
596 environmental contamination. Furthermore, more precise “SN2” systems should be
597 enacted. For example, specific SSR management links such as source separation,
598 collection, transportation, treatment and recycling can be implemented.

599 Fourth, flexible, tailored, and localized management strategies for residents
600 should be implemented. The results in Section 4.1 show that SSR is highly feasible,
601 both in Jiangsu as a province overall and in the 13 cities; additionally, RIPSSR in
602 southern Jiangsu is higher than that in northern Jiangsu, and proportions of residents
603 who “strongly agree” that they would participate in SSR in Nantong, Suzhou and

604 Nanjing are as high as 75.5%, 67.8%, and 67.1%, respectively. This could be
605 attributable to the influence of publicity, knowledge, and education about
606 environmental protection. There are 134 Chinese universities in southern Jiangsu,
607 while northern Jiangsu has 33 universities (CNBS, 2020). Neighborhood effects are
608 important: Nantong and Suzhou are Shanghai’s “backyard” (Fig. 1), and Shanghai is
609 China’s leading city in terms of SSR (Xiao et al., 2020). The compulsory
610 classification provision since 2019 has been successful in Shanghai (Wang et al.,
611 2021), its focus is on promoting the source separation of kitchen waste (Zhang et a.,
612 2012). Current, these successes and pilot areas are being expanded. Additionally, the
613 efforts of the government to facilitate SSR should also be credited. For instance,
614 Suzhou is a model city for ecological and environmental protection in China, and
615 Nanjing has been an SSR pilot city since 2000 (Fig. S1). Waste policy making should
616 reward residents who are very willing to participate in SSR programs. Moreover, the
617 results in Section 4.3 show that factors influencing RIPSSR and their degree of
618 influence are different across 13 cities of Jiangsu. Thus, we should implement flexible,
619 tailored, and localized SSR management strategies for local residents. It should be
620 emphasized that successful countries and regions set prevention as their priority,
621 followed by the 3 “Rs” (reducing, reusing, recycling), with disposal at the bottom of
622 the inverted priority pyramid.

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624 **6. Conclusions**

625 The analysis of residents’ attitudes toward SSR can facilitate MSW management.
626 This study collected 2,963 valid questionnaires in 13 cities of Jiangsu, representing a
627 microcosm of China, and utilized SEM to discuss localized influencing factors of

628 successful SSR planning and management. The main conclusions are as follows: (1)
629 although a large number of residents showed positive attitudes toward SSR projects in
630 Jiangsu, RIPSSR in southern Jiangsu was higher than that in northern Jiangsu; (2) the
631 factors influencing RIPSSR and their degrees of influence differ across 13 cities,
632 which presents localized disparities; (3) it presented that “accessibility of SSR
633 facilities” is a key factor, “environmental knowledge” and “environmental attitudes”
634 are important factors in all the 13 cities; (4) RIPSSR is not affected by “laws and
635 regulations” in any of the 13 cities, this reason is that current laws and regulations are
636 void. The government should create favorable external conditions related to facilities
637 and services, promote extensive publicity and educational activities through various
638 channels, and improve the effectiveness of laws and regulations. Future SSR
639 management strategies should be flexible, comprehensive, and tailored to urban
640 individuals.

641 This study makes both academic and practical contributions. From an academic
642 aspect, this study analyzed urban residents’ participation intentions and influencing
643 factors and their degree of influence as well as decision-making mechanisms in SSR
644 by using Web surveys and field surveys and model building. The use of such
645 methodology provides an effective combination for traditional questionnaire interview
646 methods and booming big data approaches. From a practical perspective, this study
647 revealed that residents’ participation intentions are high, which indicated that SSR is
648 highly feasible. This study also identified and ranked localized influencing factors in
649 SSR and proposed corresponding policy recommendations.

650 Additionally, this study points the way for future research. The results show that
651 “facilities and services” have a large overall effect on RIPSSR in 13 cities of Jiangsu.
652 In the future, we will place additional focus on facilities and services. For instance,

653 what SSR facility and service patterns make it more convenient for residents to
654 participate, and which patterns cost less? The results also show that the RPISSR is not
655 affected by “laws and regulations” in any of the 13 cities, which does not seem to
656 agree with the advanced SSR experiences of developed countries. How laws and
657 regulations can be made more effective should be a focus in the future. Notably, the
658 sociodemographic characteristics of residents are inherent to them, making them
659 inseparable from residents at any time or place. This fact means that more tailored
660 policies should be assessed.

661 However, this study retains certain limitations that must be addressed. The
662 measurement of environmental knowledge is multifaceted, and the selection of
663 possible observation variables and the design of the measurement items in the
664 questionnaire to reflect this complexity may not be adequate. Improvement in these
665 areas could be topics for further investigation. Additionally, the study of individual
666 environmental attitudes based on Likert scale-assessed questionnaire survey data has
667 methodological limitations and involves subjectivity. To resolve these issues, other
668 simulation methods can be applied in future research, such as Complex Adaptive
669 System theory or Multi-Agent System theory.

670

671 **CRedit authorship contribution statement**

672 **Binxian Gu:** Funding acquisition, Investigation; Research planning, Data
673 inspection and analysis; Methodology, Software, Formal analysis, Validation, Writing
674 original draft, Review and editing. **Yanbin Yao:** Investigation, Data inspection and
675 analysis, Formal analysis, Software, Writing original draft. **Huiming Hang:**
676 Investigation, Data inspection and analysis, Formal analysis, Software, Validation.

677 **Yulin Wang:** Funding acquisition, Research planning, Formal analysis, Methodology,
678 Modeling. **Renfu Jia:** Investigation, Data inspection and analysis, Methodology.
679 **Lingxuan Liu:** Research planning, Methodology, Writing, Review and editing. **Hui**
680 **Ling:** Review and editing, Proofreading, Validation. **Xinyi Tang:** Investigation,
681 Drawing, Data inspection and analysis. **Haijie Zhang:** Data inspection, Proofreading,
682 Validation. **Zhiwei Wu:** Investigation, Data inspection and analysis, Writing, Review
683 and editing. **Yongxiang Wu:** Investigation, Drawing, Data inspection and analysis.
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688 **Declaration of Competing Interest**

689 None

690

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