

# The Changing Character of Chinese Urbanization: 2000 - 2021

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## Article

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# The Changing Character of Chinese Urbanization: 2000 - 2021

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18 **Abstract**

19 The scale and pace of urbanization in China over the past few decades is one of the most significant  
20 transformations of any human society in history. However, studying urbanization in China  
21 encounters an empirical difficulty common to many urban systems: Are there spatial units  
22 corresponding to cities as spaces of socioeconomic interaction? To address this question and  
23 analyze the transformation of Chinese cities and China's urban system over the last few decades,  
24 we analyze a rich set of data comprising of 297 Chinese Prefecture-level Cities (PLCs) from 2000  
25 to 2021. Our analysis fills a number of important gaps by carefully considering the difference in  
26 scaling effects result from using total versus registered population, and full PLCs definitions  
27 compared to their restriction to Urban Districts (UDs). Our results show that PLCs as well as their  
28 UDUs exhibit scaling effects when measured with resident population. PLCs have become better  
29 urban units of analysis, characterizing functional cities in similar ways to other urban systems,  
30 especially after 2015. Their scaling exponents for GDP are also somewhat closer to theory than  
31 those obtained in UDUs. The substantial redistribution of the population, with a growing  
32 concentration in larger and coastal cities and urban districts resulting in the scaling behavior. The  
33 future of Chinese urbanization is that these trends will intensify, leading to continued stronger  
34 growth of larger cities and relative population decline of many small and more rural places.

## 35 **Introduction**

36 China's economy has grown spectacularly during the past four decades, with GDP per capita  
37 increasing  $\approx 7\%$  per year during 1960-2022 and doubling every 10 years. This economic growth  
38 coincided with dramatic urbanization. The proportion of China's population living in urban  
39 environments increased from just 16% in 1960 to 64% in 2022, with over 800 million people  
40 residing in urban areas<sup>1</sup>. China's urbanization has been described as the greatest human  
41 resettlement experience in history<sup>2-4</sup>. A remarkable feature of this is that significant policy  
42 interventions avoided common ills of fast city growth, such as concentrated poverty,  
43 unemployment, and inadequate physical infrastructure<sup>4-6</sup>. Looking ahead, China's urbanization is  
44 expected to reach 80% by 2050<sup>7</sup>, in line with many high-income nations today, such as the United  
45 States<sup>12</sup>. Whether China will become wealthier and more fully developed depends on what it will  
46 do with this additional 15-20% of urbanization over the next decades.

47 Associating economic growth and urbanization in China is not merely a case of noting a strong  
48 temporal correlation (Extended Data Fig. 1). Social science now understands that urbanization is  
49 one of the major drivers of structural transformation underlying human and economic  
50 development<sup>8,9</sup>. By concentrating populations and supporting their interactions, urban  
51 environments foster growing specialization and interdependence, leading to increases in  
52 production and consumption. This mechanism creates employment and rising incomes, and  
53 promotes many other forms of invention and innovation<sup>10,11</sup>. These agglomeration effects speed  
54 up the movement of goods, people, and information<sup>12</sup> not only locally in each city but across  
55 national systems of cities (urban systems) and internationally. The essence of urbanism is thus not  
56 the built environment per se but the expansion of social and economic interactions embedded in a  
57 supportive infrastructural space<sup>13</sup>. Observing the telltale signs of urbanization, namely nonlinear  
58 scaling (or agglomeration) effects provides insight into the intertwined relationship between urban  
59 development and socioeconomic progress<sup>11,14,15</sup>.

60 However, in China as elsewhere the administrative boundaries of cities often fail to capture the  
61 true essence of social and economic interactions<sup>16</sup>. Robust definitions of urban areas should be  
62 theoretically grounded, adhering to principles that elucidate the nature and functionality of cities.  
63 Existing research on agglomeration effects predominantly centers on functional cities, commonly  
64 referred to as metropolitan areas, which encompass both residential and economic realms within  
65 the same boundary for a majority of their inhabitants<sup>17-19</sup>.

66 In Chinese national statistics, data for cities refers primarily to Prefecture-level Cities (PLCs) and  
67 their decomposition into a variety of subcomponents. These subdivisions are categorized as rural  
68 or urban based on their economic and demographic characteristics (see Methods). Districts are  
69 typically subdivisions of larger cities, such as municipalities or PLCs. Counties can include both  
70 urban and rural areas. They are generally more diverse in terms of land use, encompassing towns,  
71 villages, and farmland.

72 The concept of PLCs was first introduced in 1983<sup>20</sup>, marking the beginning of their use as the  
73 primary spatial units for reporting socio-economic data related to urban areas and urbanization

74 trends in China. Since the early 1980s, as urbanization accelerated—characterized by migration  
75 from rural to urban areas—PLCs have experienced significant transformations. The number of  
76 PLCs expanded from only 145 in 1983 to nearly 293 by 2021. These PLCs cover 49% of the  
77 national land area yet support 94% of the population and generate 97% of China's GDP<sup>21</sup>. In this  
78 study, the term “PLCs” also encompasses four municipalities including Beijing, Shanghai, Tianjin,  
79 and Chongqing, which are cities with the administrative authority of a province, thus functioning  
80 both as cities and as provinces.

81 The Chinese government has placed a growing value on urbanization and urban development over  
82 time and has made efforts to formulate policies to support stable urban transformations. After 2014,  
83 significant reforms were introduced to guide urbanization, focusing on revising the Hukou system  
84 and implementing the “National New-type Urbanization Plan (NNUP, 2014-2020)”. The Hukou  
85 system is a household registration system that classifies individuals based on their legal residency  
86 status, distinguishing between agricultural and non-agricultural populations. These reforms aimed  
87 to eliminate the distinction between agricultural and non-agricultural Hukou holders, creating a  
88 unified resident permit system. This change was designed to help integrate 100 million rural  
89 inhabitants into urban areas by 2020<sup>22</sup>, a key target of the NNUP<sup>23</sup>. The NNUP also included  
90 ambitious action to remove settlement restrictions completely in cities with fewer than 3 million  
91 people and to relax controls in larger cities with populations between 3 and 5 million<sup>23</sup>. Building  
92 on these efforts, the “14th Five-Year NNUP for 2021-2025” continues to advocate for removing  
93 settlement barriers in smaller cities and easing urbanization quotas in larger ones. These initiatives  
94 represent a shift towards a more human-centered urban planning approach, allowing for more  
95 natural population sorting.

96 In this study, we use the analytical framework of urban scaling to study urban development in  
97 China over the past two decades. To keep the data consistent, we investigate the scaling effect of  
98 PLCs and their subcomponents during the 1994-2021 period. Urban scaling predicts the  
99 relationships between the areal extent, economic output, and population size of cities within an  
100 urban system, if the corresponding units of analysis behave like physical spaces of social  
101 interactions. We are thus able to assess the geographic extent of urban effects, and the nature of  
102 social and economic interactions occurring within PLCs in China. In this way, we can evaluate  
103 whether China’s urban system, despite its historical, political, cultural, and administrative  
104 specificities, is fundamentally similar to urban systems elsewhere in the Global North and the  
105 Global South. Chinese policymakers assign important roles to urbanization and urban development  
106 in the ongoing efforts to transform China into a “moderately prosperous country”<sup>16,24</sup>. Are these  
107 policy adjustments working in utilizing urbanization as an engine of national development? What  
108 structural transformations are occurring and can be foreseen, as the Chinese urban system  
109 continues to grow and become more integrated?

## 110 **Results**

111 In China, PLCs are administrative spatial units tiling the entire national territory, but do not  
112 constitute a definition of an urban area. In each PLC, there is typically a major city playing the  
113 role of a regional capital and central place, but there can also be other cities and towns, and non-

114 urban regions included in its definition. Moreover, each PLC consists of a number of explicitly  
115 different geographic subdivisions with distinct urban and nonurban characteristics. Each PLC is  
116 the center of government for smaller entities, including urban districts, county-level cities, and  
117 (simple) counties. Within each county-level city and county, there are further subdivisions,  
118 typically consisting of their own urban centers and rural areas. This administrative structure  
119 reflects a hierarchy of governance where the PLC oversees urban districts, counties, and county-  
120 level cities, each of which manages its mix of urban and rural regions (see Methods).

121 National statistical data in China is organized along these administrative regions, allowing us to  
122 investigate their properties. However, these definitions do not easily allow us to construct  
123 functional urban definitions, based on socioeconomic interactions and mobility flows such as  
124 metropolitan areas in the U.S. Previous studies focused on each PLC restricted to its constituent  
125 urban districts as an approximate functional urban definition that indeed exhibits archetypal  
126 scaling behavior<sup>25</sup> when registered population (Hokou) is used as the measure of scale. However,  
127 the Hokou population is likely not a good estimate of the true resident and working population,  
128 especially in larger cities.

129 Here, we use more recent data allows us to resolve these issues. We explore not only issues of  
130 urban expansion and the urban character of the PLCs as a whole, now including counties and  
131 county-level cities, but also the effect of using actual population counts in scaling analysis, versus  
132 its restriction to registered (Hukou) population. In the present study, we refer to the whole PLC as  
133 a prefectural-level city and the restriction to its set of urban districts as UD. The latter approximates  
134 what is often referred to as urban cores.

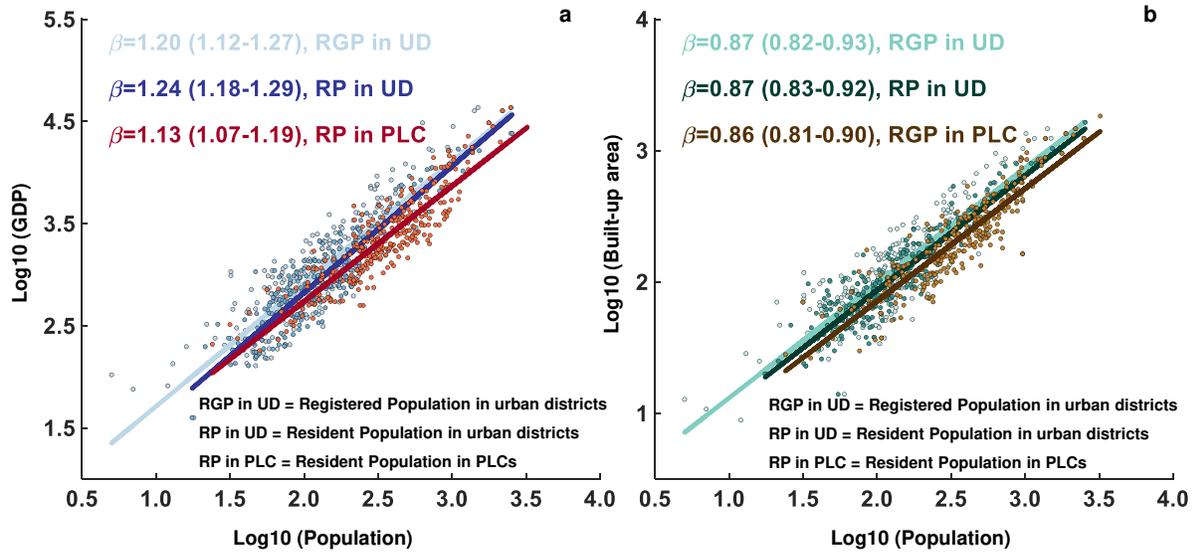
### 135 **Urban Scaling of GDP and Built-up Area in China**

136 We investigate empirically the scaling of GDP, BUA, and other economic quantities in 297  
137 China's PLCs from 2000 to 2021. This analysis updates previous studies in three ways. First, it  
138 includes more recent data up to 2021. Second, we expand the urban definition, to consider the full  
139 Chinese PLCs, and not just the same units set of UDs, as in ref<sup>25</sup>. Finally, we consider not only  
140 registered populations (Hukou) but also resident (complete) census populations, which was a  
141 strong limitation discussed in earlier efforts<sup>25</sup>. Expanding on these three issues makes the present  
142 study a substantially more complete and robust study of urban scaling in China.

143 We find that Chinese PLCs exhibit the theoretically expected scaling behavior in 2021, the most  
144 recent year for which data is available at the time of this writing. In line with theoretical predictions,  
145 the scaling exponent for GDP in PLCs is  $\beta = 1.13$  (95% CI [1.07, 1.19]), while that for the BUA  
146 is  $\beta = 0.86$  (95% CI [0.81, 0.90]). Consistent with previous results<sup>25-27</sup>, we also find that the PLCs  
147 restricted to their UDs also exhibit scaling effects when measured with both registered (with local  
148 *Hukou* status) and resident population. The estimated superlinear scaling exponent for UDs is  
149 higher than what is observed for the full PLCs (Fig. 1) and has a narrower 95% confidence.  
150 Specifically, for GDP, the scaling coefficients in UDs range from  $1.20 \pm 0.07$  (measured by  
151 registered population) to  $1.24 \pm 0.05$  (measured by resident population). However, the estimated

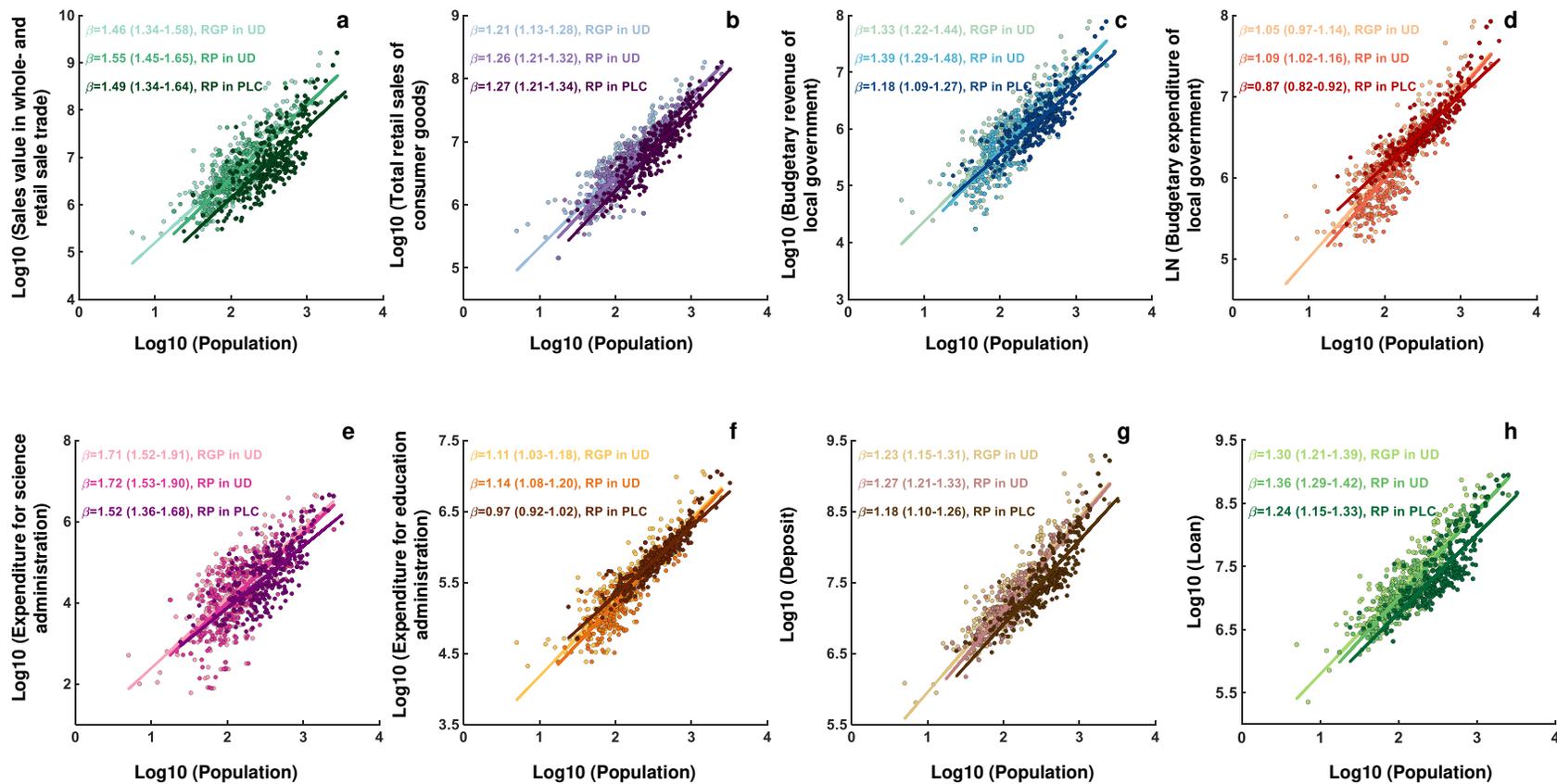
152 sublinear exponents of BUA are essentially the same whether we use the whole PLC ( $0.86\pm 0.05$ )  
153 or its restriction to urban districts by resident ( $0.87\pm 0.04$ ) or registered population ( $0.87\pm 0.05$ ).  
154 These results suggest that in larger Chinese PLCs the expected economic activity is more  
155 concentrated in its UDs (SI Table S3-S5), as we discuss below.

156 We also extend our scaling analysis to a range of other economic variables available in Chinese  
157 statistics<sup>25</sup>. This allows us to assess whether using the PLC or the more spatially restrictive UD  
158 makes a difference for other economic variables also capturing socio-economic interactions in  
159 urban settings. These are *sales value in whole- and retail sale trade, total retail sales of consumer*  
160 *goods, budgetary revenue of local government, budgetary expenditure of local government,*  
161 *expenditure of science administration, expenditure for education administration, deposit, and*  
162 *loan*. The general expectation is that these variables should reflect concentrated socio-economic  
163 interactions and thus should exhibit superlinear scaling. Similar to GDP, the analysis of these  
164 characteristics supports the presence of non-linear scaling behavior in the full PLCs after 2015 (SI  
165 Fig. S5), but also indicates that these effects are characterized by larger exponents when the urban  
166 definition is restricted to UDs (Fig. 2).



167

168 **Figure 1. Scaling relations and exponents for Chinese prefecture-level cities and their urban**  
 169 **districts in 2021.** The superliner scaling behavior ( $\beta$ , 95% CI) for GDP vs. size by registered  
 170 population in urban districts (light blue, RGP in UD), resident population in urban districts (dark  
 171 blue, RP in UD), and resident population in prefecture-level cities (red, RP in PLCs) (a). The  
 172 sublinear scaling behavior ( $\beta$ , 95% CI) for the built-up area vs. size by registered population in  
 173 urban districts (light green, RGP in UD), resident population in urban districts (dark green, RP in  
 174 UD), and resident population in prefecture-level cities (brown, RP in PLC) (b).



175

176 **Figure 2. Scaling of different city attributes relative to population size for Chinese prefecture-level cities and their urban districts**  
 177 **in 2021.** The registered population in urban districts = RGP in UD, the resident population in urban districts = RP in UD, and the resident  
 178 population in prefecture-level cities = RP in PLC.

## 179 **Changes in scaling from expanding urban units and their population**

180 To quantify the impact of different spatial units of analysis (PLCs versus UDs) and population  
181 counts (registered versus resident) on scaling exponents for Chinese cities, we compare their  
182 impact in the logarithmic scaling relation, Eq. (2). Because this is a linear relation, at a fixed time,  
183 the scaling exponent estimator is simply the (discrete) derivative of the logarithmic y-variable  
184 (GDP, BUA) to the logarithmic x-variable (population) (Eq. 3):

$$185 \quad \beta_i = \frac{\Delta \ln Y_i}{\Delta \ln N_i}. \quad (3)$$

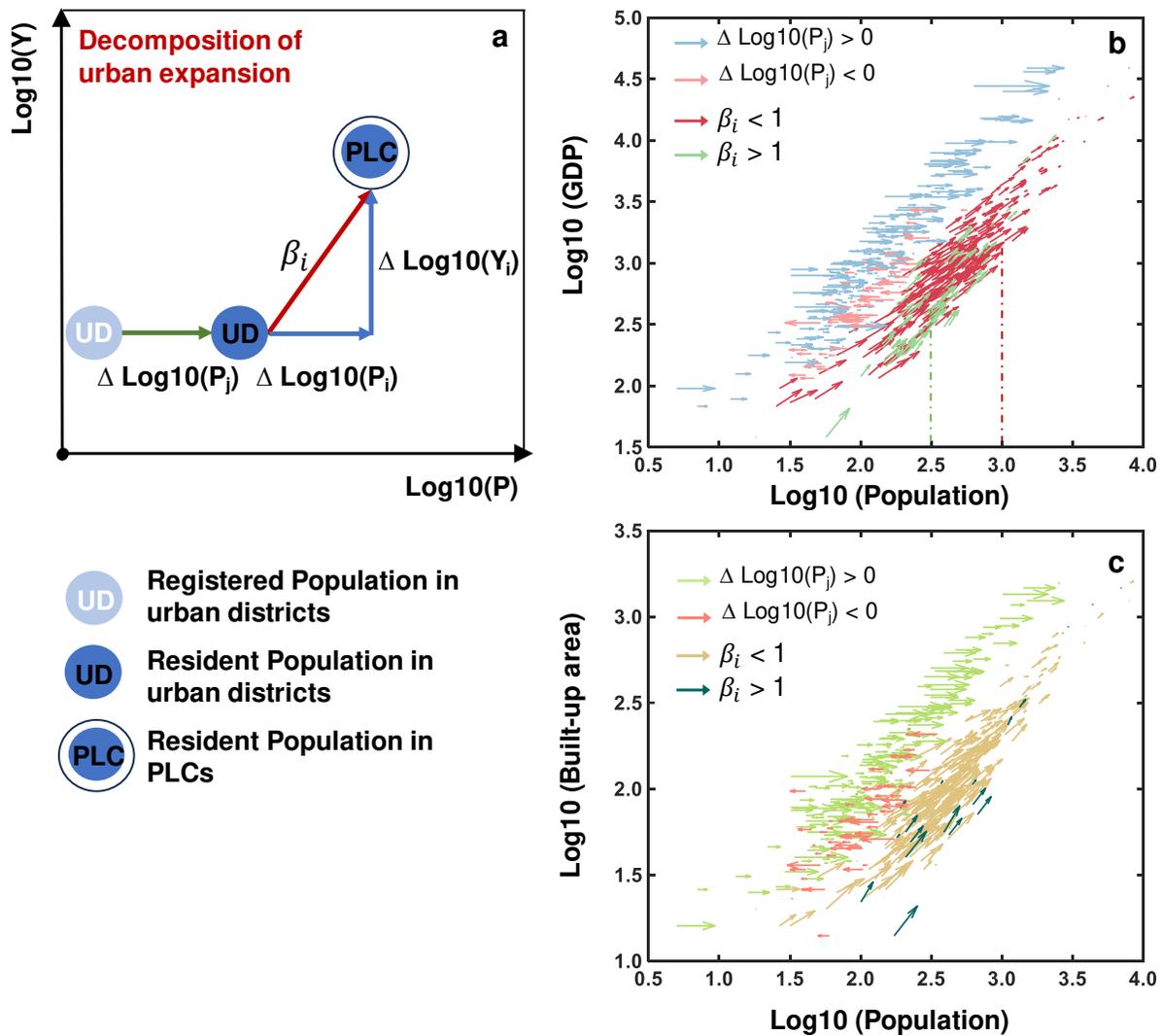
186 At a given moment, time and after averaging over the deviations  $\xi_i$ , this gives the overall scaling  
187 exponents shown in Figs. 1-2. The point of considering this quantity for each city, i.e. before  
188 averaging, is that we can then measure the impacts of changing units of analysis and population  
189 counts across different types of cities, such as across their size.

190 Starting with the most restrictive units (UDs and registered populations), the expansion to the PLC  
191 increases both the total urban attribute (GDP, BUA) and the total population. The former also  
192 changes (typically increases) as we change from registered to resident population (see Fig. 3a).  
193 Thus, estimates of the scaling exponent will become larger in the PLCs versus UDs if there is a  
194 larger change in  $\ln Y$  than in  $\ln N$ . Conversely, if the population increases more than the attribute,  
195 the exponent estimate will become smaller. Because for GDP we observe a reduction of exponents  
196 from the UDs to the PLCs, we know that this expansion of the definition corresponds to a larger  
197 increase in population than income.

198 Figure 3 b-c shows the effects of these transformations for all cities. The change from registered  
199 (Hukou) to resident population has the pure effect of moving each point horizontally in a scaling  
200 plot (light blue and red arrows). Most cities show moves to the right (e.g., Beijing and Shanghai)  
201 signaling that their total population is larger than their registered population. A few smaller cities  
202 move to the left (e.g., Hegang, Siping, and Erdos), showing the reverse effect signaling  
203 outmigration of real population relative to those registered. We also observe, as discussed in  
204 previous work<sup>25</sup>, that larger cities move substantially more to the right than smaller ones.

205 The effect of changing the urban definition from UDs to PLCs is to produce a larger GDP and  
206 BUA. Combined with the corresponding increases in population, this makes each point move  
207 diagonally in Figs. 3 b-c. This effect is much more pronounced in smaller PLCs, where more of  
208 the population, productivity, and infrastructure are outside the (less dominant) urban area.  
209 However, cities like Beijing, Shanghai, and Tianjin move less than many others because their PLC  
210 definitions do not include non-urban districts (Table S2). Upon analyzing the expansion from UDs  
211 to PLCs in the year 2020, the most recent year of the population census with comprehensive data,  
212 we find that out of the total 297 PLCs, only 63 (green arrows, Fig. 4b) displayed a higher increase  
213 in GDP than population ( $\beta_i \geq 1$ ). These 63 cities align with the shrinking cities identified in  
214 previous studies<sup>28-30</sup>, meaning that in these cases the increase in agglomeration effects in non-UDs  
215 is due to increases in productivity even as populations decrease.

216 Overall, the combined effects of changes in urban units of analysis and population have very little  
 217 effect on the scaling behavior of BUA. While the population increases in larger PLCs would tend  
 218 to reduce the average exponent there is a small but consistent effect in smaller PLCs to have  
 219 substantial infrastructure outside urban districts. The same cannot be said about GDP, with the  
 220 consequence that the correction of population counts in larger cities does reduce the exponent to a  
 221 value relative to UDs and a little below theory. This, and the behavior of these exponents in time,  
 222 which we discuss next, suggest that the entire population of the PLCs may be an overestimate of  
 223 that associated with its GDP, which is much more concentrated in UDs than infrastructure. Since  
 224 GDP is measured based on employment in local enterprises rather than residential population, this  
 225 leads to higher productivity and GDP in densely populated UDs compared to rural areas. As a  
 226 result, most  $\beta_i \leq 1$ , and the overall scale value for the PLC is smaller than that of the UDs.

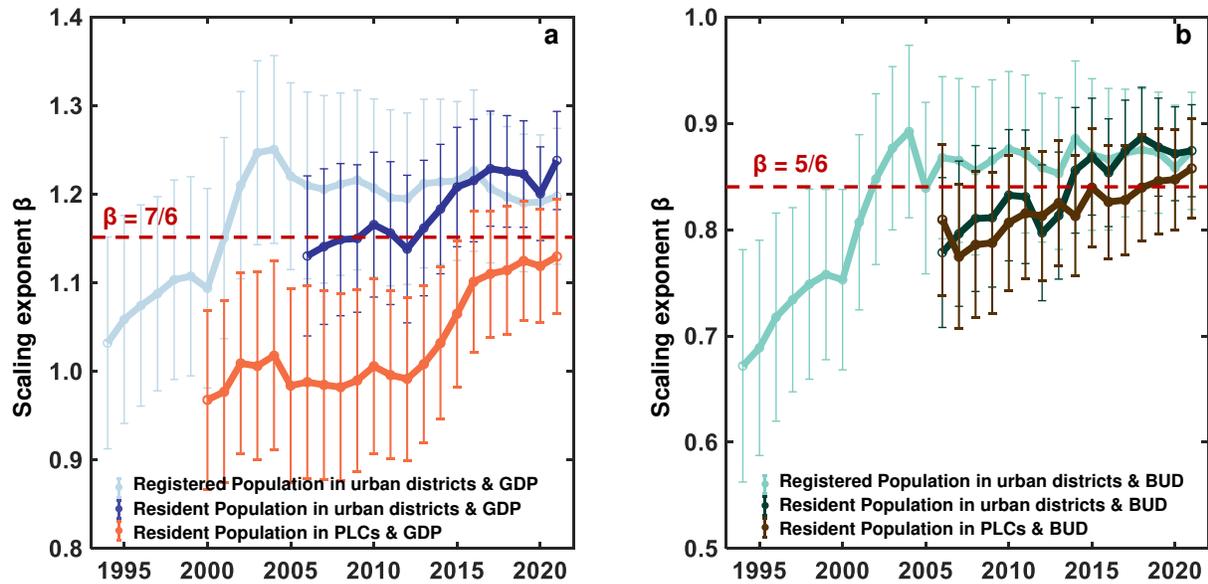


227  
 228 **Figure 3. The decomposition of expansion from urban districts to prefecture-level cities in**  
 229 **2020.** Theoretically, a prefecture-level city's (PLC) expansion trajectory can be divided into two

230 phases. The first phase, indicated by the green arrow, involves the transformation of the registered  
231 population into the resident population in UDs. During this phase, both GDP and built-up area  
232 (BUA) remain unchanged, reflecting a purely demographic shift with parallel movement. The  
233 second phase, represented by the blue arrow, marks the expansion from UDs to the PLCs. In this  
234 stage, population changes are accompanied by fluctuations in GDP and BUA, highlighting the  
235 economic and spatial impacts of urban expansion. The scaling exponent estimator, denoted by  $\beta_i$ ,  
236 is the derivative of GDP and BUA concerning population changes (the red arrow) (a). Change in  
237 each city's GDP and population. Light blue arrows depict the population increase from registered  
238 population to resident population in urban districts. Pink arrows depict the population decrease  
239 from the registered population to the resident population in urban districts. Red arrows represent  
240 instances where the changes in GDP are less than the changes in population from urban districts  
241 to the whole PLCs. Green arrows depict instances where the changes in GDP are greater than the  
242 changes in population from urban districts to the whole PLCs (b). Similar to (b), the trajectory of  
243 each city's BUA development and population size (c).

#### 244 **Changes in agglomeration effects of Chinese cities over time**

245 We now provide a complementary discussion of the effects observed in Fig. 3, by analyzing the  
246 temporal dynamics of scaling exponents over a 27-year time span between 1994-2021 for each  
247 unit of analysis (Fig. 4). For UDs, as noted before<sup>25</sup>, expected urban scaling exponents appear in  
248 the data around 2002. It remains unclear if prior to this time, data for Chinese cities was  
249 misestimated in available national statistics, or if they had different properties. Using resident  
250 counts instead of registered population changes the exponent estimates only slightly, but this  
251 change is not statistically significant within 95% confidence intervals. Observed exponents for  
252 UDs are slightly higher than theory predicts both for GDP and BUA, but consistent with theory  
253 within statistical uncertainty, which is higher than in other nations such as the U.S.<sup>12</sup>. The main  
254 novelty in our analysis is the scaling behavior of full PLCs. These units show the expected scaling  
255 exponent for BUA, though slightly smaller than for UDs, and more consistent with theory ( $\beta=5/6$ ).  
256 However, we now see that the scaling exponent estimated for GDP for full PLCs is consistently  
257 smaller than for UDs, and has become superlinear only after around 2015. In the most recent data,  
258 it agrees more closely with urban scaling theory ( $\beta=7/6$ ).



259

260 **Figure 4. Temporal evolution of the scaling exponents with a 95% confidence interval for**  
 261 **GDP (a) and built-up area (BUA) (b) for Chinese prefecture-level cities and their urban**  
 262 **districts.** The two dotted lines depict the simplest expectation for the theoretical exponents at  $7/6$   
 263 and  $5/6$ , respectively<sup>12</sup>.

264 It is interesting to analyze further this recent change in scaling exponents, and whether it signals  
 265 that PLCs are becoming better functional urban definitions than their restriction to UDs. This could  
 266 mean, for example, that GDP in UDs is partly the product of a larger PLC population, living outside  
 267 UDs. To examine this question, we analyze the dynamics of our key urban metrics and of  
 268 population in UDs versus non-UDs in each PLC, by city size and geographic location. To do this,  
 269 we divide PLCs into three categories: Those with a population less than 3 million are considered  
 270 small cities. Those with a population greater than 6 million are categorized as large cities, and  
 271 those with a population in between are classified as medium-sized cities.

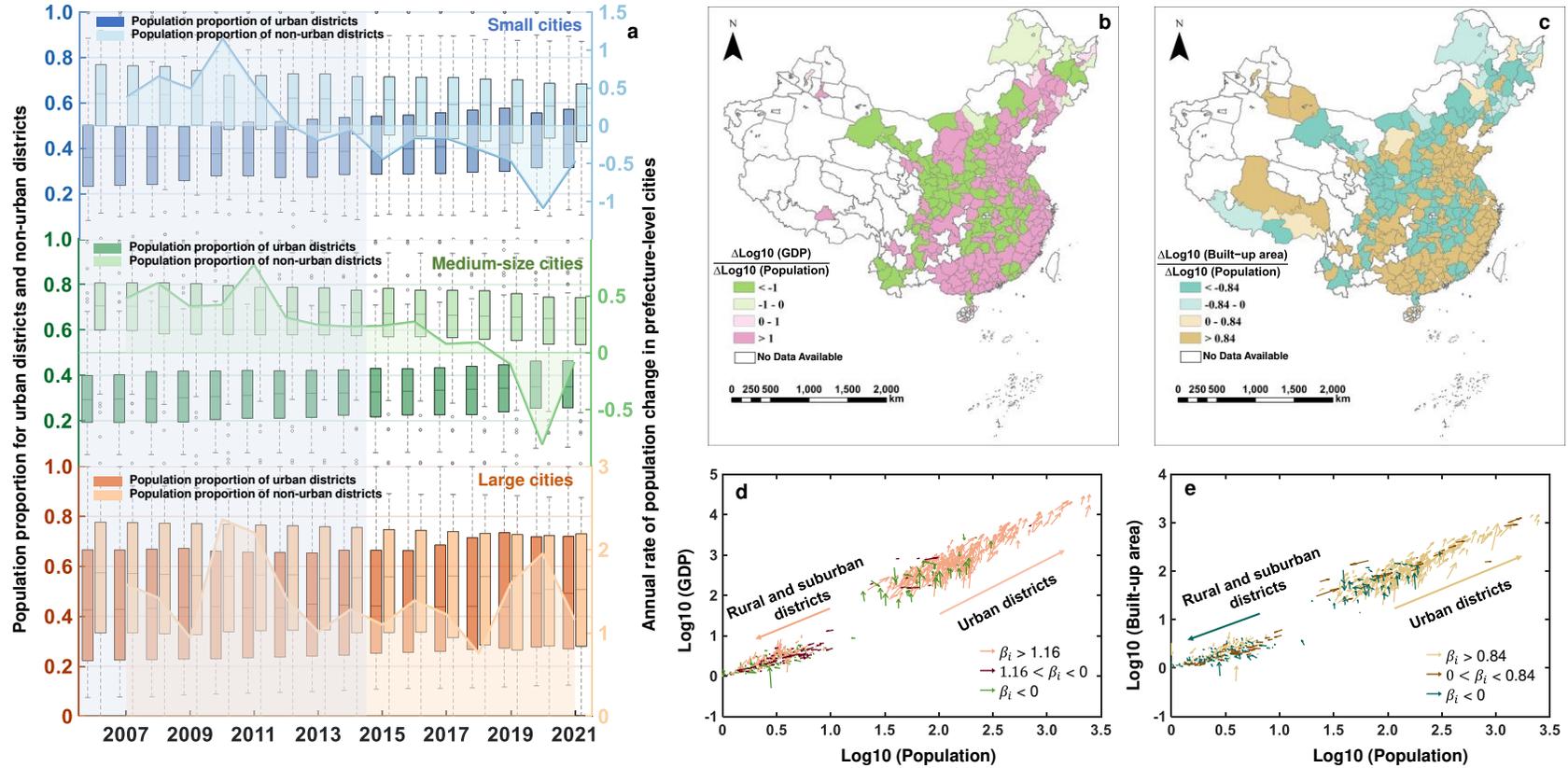
272 Analyzing the temporal dynamics of all cities between 2006-21, we find a substantial redistribution  
 273 of the population with a growing concentration in larger and coastal cities (Fig. 5a-c and SI Fig.  
 274 S4). Smaller cities experienced a population decline over this period due to outmigration. They  
 275 also become more “urbanized”, as there is a noticeable *increase* in the population share of urban  
 276 districts versus the rest of their PLC after 2015. Larger PLCs have continued to see population  
 277 growth but a milder increased concentration also in their UDs. Medium-sized cities share  
 278 characteristic trends of both smaller and larger cities. They have seen population decreases since  
 279 2017, but at milder rates than smaller cities. The concentration of their population in UDs is  
 280 observable, but also less pronounced. In all cases, the share of GDP and BUA in UDs increased  
 281 over this period relative to non-UDs (SI Fig. S2).

282 In addition, we examine changes in scaling exponents between the 12th Five-Year Plan (2011-  
 283 2015) and the 13th Five-Year Plan (2016-2020). Changes in  $\beta_i$  across time for PLCs, UDs, and  
 284 rural and suburban districts were evaluated (Fig. 5b-e) following a similar approach as described

285 in Fig. 3. Only 60% of PLCs experienced population growth, while 53% displayed a higher  
286 increase in GDP growth compared to population ( $\beta_i \geq 1$ ) (Fig. 5b and SI Fig. S3a). Increases in  
287 population in 53% of PLCs were associated with typically large expansion of BUA, signaling  
288 investments in infrastructure, with  $\beta_i$  values exceeding the theoretical expectation, and in some  
289 cases, surpassing 1 (Fig. 5c and SI Fig. S3b).

290 Within PLCs, we find a clear shift towards greater population concentration in UDs, which leads  
291 to concurrent growth in GDP and BUA (Fig. 5d-e). In contrast, non-UDs experienced significant  
292 population loss, with only 40 out of the 297 PLCs demonstrating population growth outside UDs.  
293 Among these, only five areas experienced higher GDP than population growth ( $\beta_i \geq 1$ ). These  
294 trends are also evident in the expansion of BUA. With the concentration of population within UDs,  
295 the BUA of these districts expands correspondingly, resulting in a  $\beta_i$  value surpassing the  
296 theoretical threshold ( $\beta_i \geq 5/6$ ). Conversely, in non-UDs, the decrease in population leads to a  
297 relative contraction of BUA relative to UDs.

298 These findings indicate that the general trend in Chinese cities over the last 10 years has been  
299 towards greater concentration of population, economic activity, and BUA in urban cores,  
300 corresponding to UDs. Most non-UDs, especially in smaller cities, have recently experienced  
301 population loss, leading to a pattern of development in the Chinese urban system towards larger  
302 and more coastal cities, and within these towards their more urbanized cores. What is perhaps most  
303 unexpected is that these structural transformations within each PLC have led to fast increases in  
304 GDP per capita in non-UDs (SI Figs S1-3), along with UDs. This has resulted in higher scaling  
305 exponents for PLCs than in earlier periods, increasing towards those observed for UDs and  
306 approaching what is expected from theory (Fig. 4). These empirical observations leave us with  
307 interesting questions as to why this transition has happened so recently and what may have  
308 triggered it.



309

310 **Figure 5. Population dynamics for cities of different sizes and associated scaling behavior change.** The annual proportional changes  
 311 and growth rates of population in large cities (with a population in PLC > 6 million), medium-sized cities (population > 3 million but <  
 312 6 million), and small cities (population < 3 million) from 2006 to 2021, considering both urban and non-urban districts. (a) shows the  
 313 proportions of the population (vertical bars) in urban and non-urban districts, along with the overall population growth rate (solid line),  
 314 which can be negative. (b) Changes of logarithm of GDP vs. population for each PLC during the 13th (2016-2020) and 12th (2011-  
 315 2015) Five-Year Plan periods, and (c) of built-up area vs. population for each PLC. (d) Arrows show the change in log GDP and  
 316 population size between the 13th (2016-2020) and 12th (2011-2015) Five-Year Plan periods in urban districts and rural and suburban  
 317 districts and (e) for log built-up area and population size over the same period.

318 **Discussion**

319 We have characterized the evolution of the Chinese urban system and each of its cities over the  
320 period 1994–2021. Our analysis fills a number of important gaps in the literature by carefully  
321 considering the difference in scaling (agglomeration) effects and geographic distribution of  
322 population and urban properties that result from using total versus registered (Hukou) population,  
323 and full PLCs definitions compared to their restriction to UDs.

324 Concerns about data quality and the lack of official “metropolitan” or “functional urban area”  
325 definitions make it more difficult to analyze Chinese cities, and in particular to compare Chinese  
326 urbanization with that of other urban systems. PLCs and UDs provide an empirical handle on some  
327 of these issues. An earlier study found that the growth of Chinese cities shows expected non-linear  
328 scaling behavior post-2002<sup>25</sup>. However, this analysis primarily relied on the registered population  
329 in UDs. Our results using both full population counts and PLCs show that these larger units also  
330 started exhibiting characteristic non-linear scaling beginning in around 2015. Their scaling  
331 exponents for GDP are also somewhat closer to theory than those obtained by the restriction to  
332 UDs. It should be noted that the contemporary Chinese urban system, one that is originally vary  
333 old and which has recently developed in a political and policy setting vary different than in other  
334 parts of the globe, is striking similar in its scaling behavior to other contemporary urban systems<sup>12</sup>.

335 To understand some of its more peculiar characteristics, one needs to acknowledge and understand  
336 the population movement constraints due to policy within China, and the changes to these  
337 regulations that occurred around 2015. The Hukou system, established in 1951, classifies citizens  
338 into agricultural and non-agricultural categories at birth<sup>31,32</sup>. This classification was initially  
339 intended to discourage the migration of (rural) citizens to cities by denying them residency rights  
340 and social benefits. However, even under such conditions, migration to cities did occur resulting  
341 in many people not living at their registered locations. As a consequence, registered (Hukou)  
342 population counts frequently either overestimate or underestimate the true resident population in  
343 PLCs. For instance, in the capital Beijing, the registered population is about 60% of the resident  
344 population<sup>33</sup> while in Erdos, it exceeds the resident count by 30%<sup>34</sup>.

345 When discussing the disparities between urban and rural areas, it is crucial to note that PLCs in  
346 China generally comprise both densely urbanized centers and adjacent rural regions. UDs are  
347 characterized primarily by non-agricultural Hukou holders and saw earlier rapid development due  
348 to the concentration of resources and opportunities, while the rural and suburban districts, with a  
349 higher proportion of agricultural Hukou holders, lagged behind. China’s urbanization strategy has  
350 been consistently aimed at integrating urban and rural to mitigate these inequalities, but its  
351 approach changed over time.

352 The Chinese government plays a dominant role in setting policy controlling urbanization through  
353 its central planning and social systems<sup>35,36</sup>. For decades after 1951, the Hukou system discouraged  
354 urban population growth, inadvertently deepening urban-rural disparities by restricting rural  
355 residents’ access to urban opportunities and services. As early as 2000, the Chinese government  
356 placed special emphasis on regional balance and adopted a development strategy to “actively and  
357 steadily promote urbanization” by the “coordinated development of large, medium, and small  
358 cities and towns”<sup>37</sup>. From 2000 to 2015, the government implemented national strategies such as

359 the China Western Development Plan, the Revitalization of Northeast China Plan, and the Rise of  
360 Central China Plan, aiming to further balance regional development<sup>37-39</sup>. After that, a range of  
361 policies have been devised to foster urbanization as the more explicit pathway to growth and  
362 national development. Specifically, the Hukou system was relaxed to facilitate the movement of  
363 “peasant workers” to cities, addressing labor shortages and reducing distortions in labor markets<sup>39</sup>.  
364 The national “New-Style Urbanization” Plan (NNUP) in 2014 promoted population  
365 redistribution<sup>22,23</sup> allowing rural Hukou holders to move to UDs and larger cities. This made  
366 possible more natural population sorting and resulting processes of urbanization, which coincide  
367 in time with our observations of population movements away from smaller and less urban districts  
368 while increasing their productivity per capita, and population growth in larger urban areas and  
369 UDs. Our results indicate that these transformations are simultaneously increasing the vitality and  
370 influence of larger PLCs in the Chinese urban system, but also spreading some of the urban  
371 character to “non-urban” districts in many PLCs measured as increasing GDP per capita  
372 converging with UDs, even in the face of population loss.

373 Our expectations for the future of Chinese urbanization based on both theory and the present results  
374 are that these trends will intensify, leading to continued stronger growth of larger cities and relative  
375 population decline of many small and more rural places. There are three main drivers of these  
376 expectations. First, overall demographic decline and aging make living in small rural towns with  
377 limited amenities and services increasingly more difficult, with the consequence that smaller and  
378 less urbanized areas tend to lead population losses. We have shown that this is already observed  
379 in China, as well as in many other nations including Japan, EU nations, and the US. Second, large  
380 Chinese cities with populations of ~20-25 million are relatively small for a nation with 1.4 billion  
381 people, certainly as the nation further urbanizes. Policies to accommodate larger populations in  
382 such cities, which are already expensive, will be crucial so that increases in economic productivity  
383 and innovation can be achieved in China, not only in such cities but nationwide. Finally, achieving  
384 higher levels of urbanization and prosperity (China is only 65% urban), will produce structural  
385 transformations within its cities and across its national urban system, towards larger urban  
386 economies less dominated by manufacturing for export and more dedicated to services and  
387 innovation, targeted to a larger extent at smaller Chinese cities, thus better integrating systemic  
388 national development. Analyzing this structural transition in detail should prove an interesting and  
389 important focus for future research.

## 390 **Methods**

### 391 **Urban scaling**

392 Urban scaling is a framework for studying how the population size of cities (their scale) generates  
393 agglomeration effects. The framework quantifies the variation in values of average city-wide  
394 attributes with changes in city size (i.e., population). Scaling relations are usually scale-free power  
395 functions of city size, so that any city-wide property (e.g., economic output or urbanized land area),  
396  $Y$ , is written as

$$397 \quad Y_i(N, t) = Y_0(t)N_i(t)^\beta e^{\xi_i(t)}, \quad (1)$$

398 where  $N_i(t)$  denotes city  $i$  population at time  $t$ ,  $Y_0(t)$  is a prefactor common to all cities in an urban  
 399 system,  $\beta$  is a dimensionless scaling exponent (or elasticity, in the language of economics), and  
 400  $\xi_i(t)$  are city-specific deviations from the average trend, which are typically normally distributed  
 401 across cities (with zero mean). Because the prefactor,  $Y_0(t)$ , is common to all cities, its temporal  
 402 variation captures nationwide changes. The scaling exponent,  $\beta$ , is assumed to be time-independent  
 403 and, as such, it is a conserved quantity across time (and development) in any urban system. The  
 404 value of the exponent arises from the structure of socioeconomic interactions embedded in physical  
 405 and infrastructural space<sup>40</sup> typical of urban life. Urban scaling theory builds upon extant research  
 406 traditions which have highlighted the importance of urban population size in the generation of  
 407 agglomeration effects. The quantitative prediction as to what values  $\beta$  should take, under assumed  
 408 types of interactions, is a distinguishing feature of urban scaling theory<sup>11,41</sup>.

409 Two variables encapsulate particularly important properties of cities: their *economic output* and  
 410 their *built-up area*. Economic output (usually measured as *Gross Domestic Product*, GDP) refers  
 411 to the monetary value of all the goods and services produced (or consumed) over a given period  
 412 (usually a year) by an urban economy. “Built-up area” (BUA) is defined as the area of a city’s  
 413 surface occupied by buildings and other physical infrastructure. In this sense, BUA measures the  
 414 total space dedicated to infrastructure, which tends to increase with city size. This is different from  
 415 the overall extent of a city because urban area can include open spaces without infrastructure or  
 416 facilities. Both measures are connected to the function of the city as a space facilitating human  
 417 interactions: GDP reflects economic relations linked to consumption and production, while BUA  
 418 describes the amount of space available for socio-economic.

419 Urban scaling theory derives scaling relations for both GDP and BUA as the result of interrelated  
 420 phenomena, associated with the acceleration of socio-economic interactions to the extent that they  
 421 become more spatially concentrated as cities become larger. This results in a calculation for scaling  
 422 exponents, such that  $\beta = 1 + \delta \simeq 1.16$  for GDP, and  $\beta = 1 - \delta \simeq 0.84$  for BUA, with  $\delta \simeq 1/6$ <sup>14,15</sup>. The  
 423 super-linearity of the scaling of economic output reflects how agglomeration improves the  
 424 productivity of individuals (through a variety of interactions, including learning) while the sub-  
 425 linearity of the scaling of BUA reflects efficiencies in the use of infrastructure and the built  
 426 environment.

427 As written in Eq. (1), the quantity  $Y$  is a stochastic variable, because  $\xi$  is a random effect. The  
 428 properties of  $\xi$  have been studied in many different urban systems, including in China<sup>25</sup>, resulting  
 429 in the observation that they are well described by a Gaussian distribution with zero mean and a  
 430 given variance,  $\sigma$ , which varies with quantity and urban system. These statistical properties justify  
 431 using the simplest regression fitting procedure for  $Y(t)$  versus  $N(t)$ , under logarithmic  
 432 transformations, because the resulting variables for a linear relationship whose parameters can be  
 433 estimated by minimizing ordinary least squares (OLSs):

$$434 \quad \ln Y_i(t) = \ln Y_0(t) + \beta \ln N_i(t) + \xi_i(t) \quad (2)$$

435 where  $i$  index different cities in the urban system. This implies that the exponent  $\beta$  is the slope of  
 436 the linear regression of  $\ln Y(t)$  on  $\ln N_i(t)$  and the prefactor,  $\ln Y_0(t)$ , is its ordinate at the origin

437 ( $N = I$ ). This also means that the scaling relation  $Y(N, t) = Y_0(t) N(t)^\beta$  is the expectation value  
438 of the approximately lognormally distributed stochastic variable,  $Y$ , for a city, given its population  
439 size,  $N$ .

## 440 **Spatial Units**

441 We use data on 293 prefecture-level cities (PLCs) and 4 municipalities (Beijing, Shanghai,  
442 Chongqing, and Tianjin) in China to analyze the urban scaling behavior (Extended Data Fig. 2a).  
443 Municipalities and PLCs are first- and second-level administrative units in China, respectively.  
444 Municipalities, having the same power as provinces, are the highest level of classification for cities  
445 in China. PLCs are defined as urban cores with at least 250,000 people engaging in non-  
446 agricultural industries and a GDP of more than 2.5 billion yuan<sup>16</sup>. The establishment and abolition  
447 of PLCs are generally approved by The State Council of China. In this study, we use the terms  
448 “PLCs” and “city” to denote prefecture-level cities and municipalities. Moreover, the  
449 administrative divisions of PLCs have changed after 1983. To maintain data comparability, we  
450 standardize our analysis using the administrative boundaries from 2021<sup>42</sup>.

451 A prefecture-level city in China’s administrative hierarchy is positioned between a province and a  
452 county, typically comprising several subordinate administrative areas: urban districts, counties,  
453 and county-level cities (Extended Data Fig. 2b). Here’s a brief explanation of each:

454 *Urban Districts:* These are areas where the PLCs government are located and are directly  
455 administered by the PLCs government. They generally encompass the most densely populated and  
456 urbanized areas of the city.

457 *Counties:* These are administrative divisions within the PLCs that can encompass both urban and  
458 rural areas. Each county has its own local government and includes several towns and villages.

459 *County-Level Cities:* These are cities with enough population and economic development to  
460 warrant a degree of self-governance, but they are still administratively and economically linked to  
461 the PLCs. County-level cities handle their local administration but are smaller and less autonomous  
462 than PLCs. They often include both urban centers and surrounding rural or semi-rural areas.

463 The vertical administrative hierarchy of China is uniquely tailored to meet its specific  
464 governmental needs, and greatly differ from those in Western countries. For example, compared  
465 to the U.S., where the primary divisions are states and counties, China introduces an intermediary  
466 layer known as PLCs between provinces and counties. Within these PLCs, urban districts manage  
467 densely populated areas, similar to U.S. city governments but operating as part of a larger city  
468 entity rather than independently. Additionally, Chinese counties and county-level cities have less  
469 autonomy, typically being governed under the oversight of PLCs which align local administration  
470 with broader provincial and prefectural strategies.

471 **Data sources**

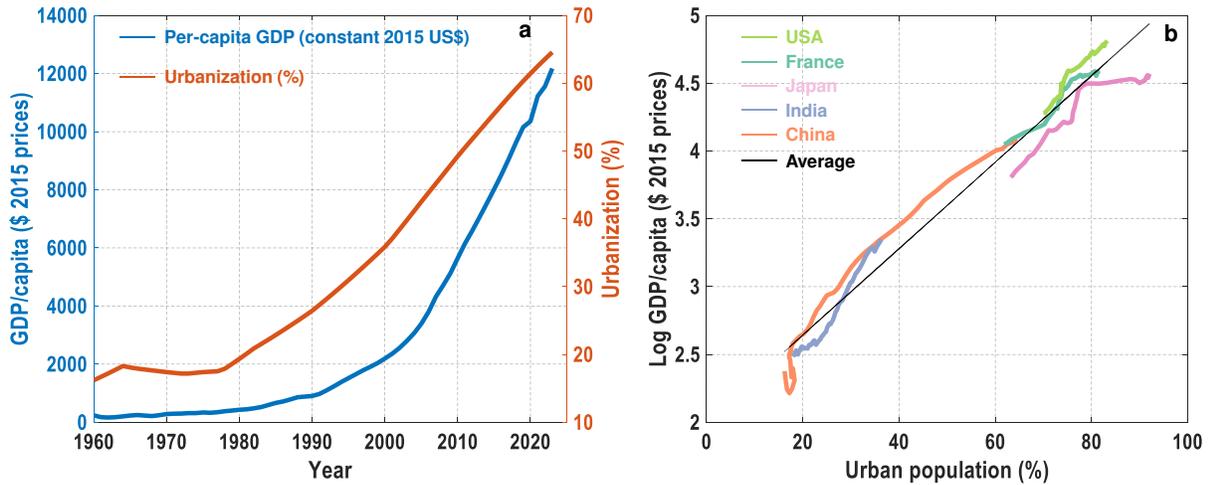
472 We use data for two spatial units of analysis: PLCs and their UDs (SI Table S1-S2). For UDs, we  
473 collected data on registered population, resident population, GDP, built-up area, and other  
474 characteristics, including sales value in whole- and retail sale trade, total retail sales of consumer  
475 goods, budgetary revenue of local government, budgetary expenditure of local government,  
476 expenditure of science administration, expenditure for education administration, deposit, and loan.  
477 For PLCs, we collected data on resident population, GDP, BUA, and other characteristics same  
478 with that of in UDs.

479 These data are obtained from the *China City Statistical Yearbook*<sup>43</sup>, which is an annual publication  
480 presenting the employment, housing, environment, and social service information on urban  
481 development, and is compiled by the National Bureau of Statistics of China, and *China Urban*  
482 *Construction Statistical Yearbook*<sup>44</sup> and *China County Seat Construction Statistical Yearbook*<sup>45</sup>  
483 which reports the municipal public facilities construction and development in urban, rural, and  
484 counties and are annually published by the Ministry of Housing and Urban-Rural Development of  
485 China. The resident population of each PLC and UD is derived from the *Statistical Yearbook* for  
486 each PLC<sup>46</sup>, which is a yearly publication that provides statistical data on economic, industry,  
487 agriculture, culture, and social development of each PLC. The registered population (Hukou) of  
488 each UD is derived from *China City Statistical Yearbook*.

489 The resident population consists of individuals who have lived in PLCs for over six months and  
490 have been away for work or study for less than six months. This population is assessed through a  
491 comprehensive census every ten years, while estimates for other years are derived from sampling  
492 surveys. The registered (Hukou) population refers to the individuals who are officially recorded  
493 by local authorities as residing in a specific area. This population is significant for policy-making,  
494 resource allocation, and urban planning, as it reflects the number of individuals who have legal  
495 residency status in that area.

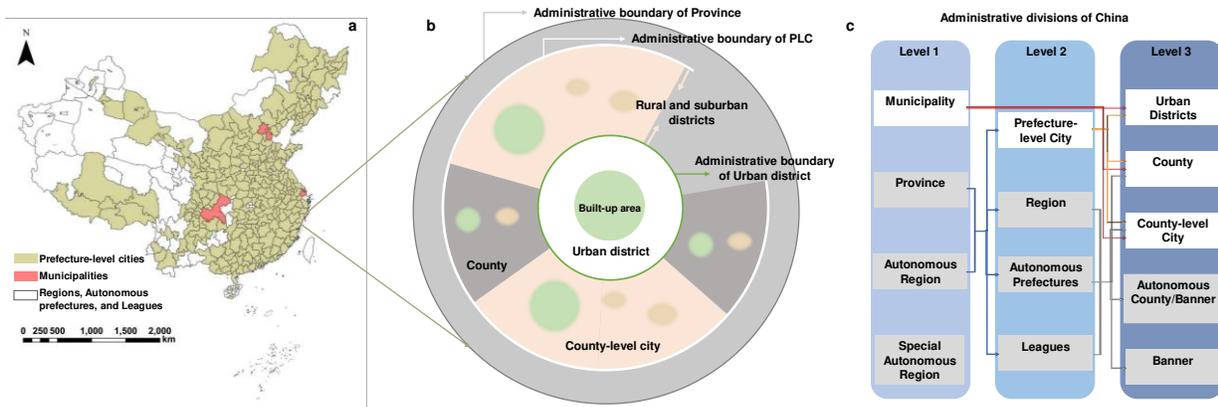
496 GDP and other characteristics of PLCs are derived from the *China City Statistical Yearbook*. The  
497 total BUA of the PLC is calculated by adding the BUA of the UDs, county-level cities, and  
498 counties. The BUA of county-level cities are derived from the *China Urban Construction*  
499 *Statistical Yearbook*. The BUA of counties are derived from the *China County Seat Construction*  
500 *Statistical Yearbook*, which is an annual publication that provides information on the development  
501 of county service facilities in China. The yearbook is intended to help people understand China's  
502 urban and rural development.

503 **Extended Data Figure**



504

505 **Extended Data Figure 1. Real GDP per capita and urbanization rate during 1960-2023.** After  
 506 an initial lag, real income per capita has been growing in tandem (and faster) with urbanization (a). Real  
 507 GDP per capita versus urbanization rate for several nations. On average, a nations GDP per capita increases  
 508 4.0% ( $\pm 0.05$ ) with each percent of urbanization (black line). China’s GDP per capita has risen faster, at an  
 509 average rate of 5.8% ( $\pm 0.35$ ) with each percent of additional urbanization (b). Real GDP per capita and  
 510 urbanization in China are derived from World Bank data<sup>1</sup>.



511

512 **Extended Data Figure 2. The spatial units and their composition.** The administrative  
 513 boundaries of 293 Chinese prefecture-level cities (highlighted in yellow) and 4 municipalities  
 514 (highlighted in red) selected for this study. The white parts on the map are regions, autonomous  
 515 prefectures, and leagues, which are administrative units equivalent to prefecture-level cities, and  
 516 are excluded from our study due to missing data (a). Schematic diagram of administrative divisions  
 517 within a prefecture-level city. Prefecture-level cities are composed of urban districts as well as  
 518 counties and county-level cities outside of the urban districts. Prefecture-level cities and urban  
 519 districts are both national-level administrative units that do not necessarily correspond to

520 metropolitan areas **(b)**. Administrative divisions of China. This diagram only illustrates the  
521 structures relevant to this study **(c)**.

## 522 **Data availability**

523 Data used for this research is available from the following link:  
524 <https://figshare.com/s/1a7b4363108facb668e8>.

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## 531 **Author contributions**

532 J.L., L.M.A.B., W.Q.C., and L.L.S., conceived and designed the research. L.L.S. performed the  
533 statistical analysis and produced the figures. L.L.S., L.M.A.B., and J.L. prepared the first draft. All  
534 authors reviewed and edited the manuscript.  
535

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- 624

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