

# 1 **Geographic transformation of China's internal population migrations**

## 2 **from 1995 to 2015: Insights from the migration centerline**

3

4 **Abstract:** Internal population migration in China is one of the most dramatic in the  
5 world. To understand the geographic dynamics of the Chinese population migration, we  
6 present a revised method called the migration centerline based on the definition of the  
7 geographic mean center of the population. Using data from the population censuses and  
8 one-percent sample surveys from 1995 to 2015, this study aims to reveal the spatial  
9 dynamics and contributors to population movements in China. The main results are as  
10 follows. (1) The directions of the population migration centerlines consistently point  
11 southeast, while the in- and out-migration centers for the five-year and non-*hukou*  
12 population migrations move north, especially from 2000 to 2010. After 2010, the west-  
13 oriented movements of the in-migration centers become pronounced, and migration  
14 distances generally decline. Five-year population migration towards the north increases  
15 from 2010 to 2015, whereas the non-*hukou* populations increased in the south in 2015.  
16 (2) The main contributors to in-migration centers are the coastal provinces, whereas  
17 out-migration centers are mostly inland provinces. (3) The geographic transformation  
18 of population migration centerlines is connected to changes in China's economic and  
19 population centers, moving south, leading to stable southeast-oriented migrations. In  
20 addition, the locations of migration centerlines are consistently further south compared  
21 with those of population centers. The migration centerline provides an intuitive and  
22 straightforward means for examining the geographic transformation of China's internal  
23 population migration and can be applied to various types of human mobilities based on  
24 different definitions or multiple spatial scales.

25 **Keywords:** population migration, internal migration, population distribution,  
26 geographic transformation, migration centerline, China

## 28 1. Introduction

29 Population migration has been witnessed as an essential driver of population  
30 redistribution and human settlement patterns (Czaika & de Haas, 2014, Rees et al.,  
31 2017). In addition to being defined as the social or economic process, population  
32 migration is also a typically geographical process characterized by the change of  
33 people's residential locations(Newbold, 2021). To understand the geographical patterns  
34 of population migration, it is necessary to correctly present its spatial and temporal  
35 dynamics.

36 Thank the available data of in-migrants in the destinations or the out-migrants in  
37 the origins, indices such as in-migration rate, out-migration rate, net migration rate,  
38 total migration rate, and migration efficiency are frequently used to reflect the spatial  
39 differences of migration situations (Liu et al., 2011). In addition to the spatial  
40 distributions of migrants, the spatial interaction from the origin to the destination is an  
41 essential geographical concern for population migration. Unfortunately, the published  
42 data on bilateral migration flows were relatively sparse (Abel & Sander, 2014). One of  
43 the advancing studies on population migration was estimating and analyzing the origin-  
44 to-destination matrix of migration flux. Apart from the gravity models, the new models,  
45 including the radiation model, intervening opportunities models, and the models linking  
46 migrant flows to stock data, were applied to generate the data of bilateral migration  
47 flows(Simini et al., 2012; Abel & Cohen, 2019; Azose & Raftery, 2019). Origin-  
48 destination migration flux, migration velocity, and migration effectiveness are standard  
49 measures for the bilateral relationships between pairs of regions (Smart, 1974; Fielding,  
50 1992; Rogers & Raymer, 1998; Bell et al., 2002).

51 All of the above indicators quantify migration and allow comparisons between  
52 regions based on the respective values but do not reveal geographic changes from a  
53 global or overall perspective. Global indicators can intuitively depict the changing trend  
54 of population migration patterns over time, rather than just focusing on hot destinations,  
55 distinct origins, and top migration flows of population migration. Existing global  
56 indicators, including the spatial Gini coefficient, the variable coefficient, and the

57 parameters of the gravity model, the spatial interaction model, and the intervening  
58 opportunities model, are able to quantify temporal variations of migration (de Jong et  
59 al., 1984; Shen, 1999; Barbosa et al., 2018). However, these global indices failed to  
60 capture the geographical details, including the location and migration directions.  
61 Besides, the existing global indices failed to figure out the main contributors to  
62 geographical changes. Therefore, reasonable global measures on population migration  
63 are becoming more critical as the data to monitor the trend of population movement,  
64 evaluate population streams and formulate the relevant policies.

65 In order to address the lack of geographic examination of trends of population  
66 migrations over time, this study aims to present a global measure called the migration  
67 centerline, which covers multiple geographic information. Moreover, this study selects  
68 China, whose internal migration during the past decades was one of the eye-catching  
69 human movements on the earth, to apply the method of the migration centerline. Since  
70 China's opening up and reform in 1978, the internal population migration has been  
71 among the most dramatic human movements in the world (Fan, 2008). Many existing  
72 studies have discussed the majority of China's migration streams occurring from the  
73 west to the east due to the labor surplus in the inland region and ample employment in  
74 the coastal region(Chan et al., 1999; Liu et al., 2011; Shen, 2013; Cao et al., 2018).  
75 However, most studies on population migrations during a single period have presented  
76 a similar pattern and said little about changes over time. The recent data on  
77 interprovincial population migration flow from 2010 to 2015 shows a similar  
78 phenomenon (Qi et al., 2017). The migration centerline can be helpful to detect the  
79 geographic transformation of internal population migration in China.

80 Section 2 offers a review of Chinese internal migration. Section 3 presents the  
81 methodology, including an interpretation of the migration centerline and the data  
82 sources used in this study. Section 4 provides the research results of the geographic  
83 transformation of the population migrations in China. Sections 5 and 6 present the  
84 discussion and conclusion, respectively. This study focuses on data from 1995, which  
85 marks the start of China's rapid urbanization, to 2015, when the most recent China one-  
86 percent National Population Sample Survey was conducted. The study area includes 31

87 provincial units in Mainland China, comprising 22 provinces, four municipalities, and  
88 five autonomous regions. For simplicity, we use “provinces” to describe the 31  
89 provincial units in the remainder of this article.

## 90 **2. Internal population migration in China**

91 Unlike most countries, population migration in China is characterized by the  
92 *hukou* system, which is the nation’s household registration institution (Mallee, 1995;  
93 Chan & Zhang, 1999; Cai, 2011). *Hukou* is a kind of permit that allows the migrants to  
94 enjoy the social welfare as the local citizens. In other words, a migrant who lacks the  
95 *hukou* in the destination cannot be an honest citizen like those residents who possess  
96 the *hukou*. Most migrant workers are called the “floating population” because they do  
97 not possess a *hukou*-registered certificate for their destinations and cannot enjoy the  
98 complete public services available to local inhabitants (Goodkind & West, 2002; Zhu,  
99 2007).

100 Before the opening up and reform in 1978, population migration in China is  
101 relatively inactive due to the strict *hukou* transfer limitations. The relaxation of *hukou*-  
102 based movement restrictions in the late 1990s enlarged the internal population  
103 migration streams (Bell et al., 2015). According to the national seventh population  
104 census bulletin, at the end of 2020, the floating population consists of 376 million  
105 people, comprising 26.62% of the total population and a considerable part of the  
106 Chinese population. In addition to their scale, the geographical landscape of population  
107 migration is also notable. Surplus rural laborers leave their hometowns for cities,  
108 boosting China’s urbanization and population redistribution processes (Chan, 2012a).  
109 Counties in western, northeastern, and central regions are the main origins of sending  
110 migrants, whereas megacities in the eastern region are the popular destinations of  
111 migrants (Liu et al., 2011). In addition, social issues, including increasing public service  
112 pressures in urban areas, left-behind children or seniors in rural areas, and population  
113 shrinkage in some cities, have garnered considerable attention (Chang et al., 2011;  
114 Wang et al., 2015).

115 Numerous studies have tracked geographic changes in population migrations in

116 China. Based on data from the population censuses and mid-census one percent surveys,  
117 the spatial distributions of migrants at provincial-, prefectural-, and county-level scales  
118 are typically employed to describe China's internal migrations. Most studies focus on  
119 in-migration patterns rather than out-migration patterns because in-migrant data from  
120 statistic tabulations are accessible (He & Pooler, 2002; Fan, 2005; Li et al., 2014; Shen,  
121 2013; Wu et al., 2018). Existing studies are also conducted from origin–destination  
122 interactions due to access to population migration matrices at the provincial level. Non-  
123 *hukou* migration is the most common type of migration, which focuses on the  
124 movement of the floating population from a *hukou*-registered location to a residential  
125 location. By contrast, *hukou* migration involves residents who change their *hukou*-  
126 registered location, presenting a different spatial pattern than non-*hukou* migration.  
127 Similar to the definition of internal migration in other countries, lifetime and five-year  
128 migrations (Bell et al., 2015; Smith et al., 2016; Qi et al., 2017; Cao et al., 2018), in  
129 which origins are birthplaces and residential locations five years previously,  
130 respectively, are also employed to illustrate the spatial dynamics of interprovincial  
131 movements in China. Using the open percent surveys of individual-level data, scholars  
132 have focused on migration patterns with demographic information, such as skilled and  
133 unskilled population migration (Chan et al., 1999; Liu & Shen, 2017; Zhou et al., 2018).  
134 Determinants such as social-economic factors and the frictions of distance are regarded  
135 as primary driving forces under the theoretical frameworks of push-pull models, gravity  
136 models, and so on (Zhang & Song, 2003; Chan, 2012a; Liang et al., 2014; Liu et al.,  
137 2015). Recently, specific factors, such as institutions, lifestyles, and amenities, have  
138 been particularly focused on (Shen, 2013; Yang et al., 2017). However, most studies  
139 said little about geographical changes of internal population migrations over time. In  
140 addition, most existing studies only identified the main in-migration destinations and  
141 out-migration origins. However, they did not focus on the main regions promoting  
142 changes in the spatial patterns of population migrations in China. The evidence from  
143 the many countries or districts has shown unstable internal migration patterns over time  
144 (Champion et al., 2017). More nuanced spatial patterns of population migration in  
145 China have evolved due to a reconstruction in economic geography and urbanization

146 development (Chan, 2012b).

147 In 2014 the Chinese government implemented the National New-type  
148 Urbanization Plan, which aimed to promote people-oriented urbanization and stimulate  
149 migrants to integrate into their habitual residence (Taylor, 2015; Bai et al., 2014; Long  
150 & Liu, 2016). The points system of the *hukou* registry, which is evaluated by education,  
151 skills, working years, and payment years of social insurance, especially in megacities,  
152 has allowed more people to settle in megacities (Wang & Liu, 2018). In addition, the  
153 government highlighted the in-situ and nearby urbanization processes of migrants to  
154 narrow regional development differences, especially in central and western China.  
155 Remarkably, the changing spatial pattern of population migration was driven by the  
156 social-economic dynamics and affected by the regulatory policies. Beyond the impacts  
157 on the spatial population patterns, a better understanding of the geography of China's  
158 internal migrations can aid efforts to address social inequality and optimizing policies,  
159 such as the New-type Urbanization plan (Shi & Liu, 2019). Is the trend of migration  
160 towards the east consistently strong and stable? Is there any new trend of the  
161 geographical changes of population migration? Who are the main contributors to the  
162 geographical transformation of population migration? In order to address these  
163 questions, a more systems-based view over an extended period of time must be created  
164 to answer these questions.

### 165 **3. Methodology**

#### 166 **3.1 Classic measurement of population mean center**

167 The population center is a geographic point that describes the center point for a  
168 given region. It can be represented using various mathematical measures, including the  
169 mean center, media center, and geometric median. The mean center, or population  
170 centroid, can be calculated easily and is widely used to reflect the spatial dynamics of  
171 population redistribution (Kumler & Goodchild, 1992). For example, according to the  
172 computation of the US Census Bureau, the mean center of the US population moved  
173 west from 1790 to 2010, thereby indicating a relative increase in the population share  
174 of western United States. The classic equation for the population mean center is as

175 follows:

$$176 \quad XP = \frac{\sum_{i=1}^n (P_i x_i)}{\sum_{i=1}^n P_i} \quad (1)$$

$$177 \quad YP = \frac{\sum_{i=1}^n (P_i y_i)}{\sum_{i=1}^n P_i} \quad (2)$$

178 The terms  $XP$  and  $YP$  denote the longitude and latitude of the population mean center,  
179 respectively,  $x_i$  and  $y_i$  are the longitude and latitude of the center of province  $i$ ,  
180 respectively.  $P_i$  represents the population of province  $i$ , and  $n$  is the number of provinces.  
181 The population mean center is determined using the population size and geographic  
182 location of each province. The calculation results are affected by the granularity of the  
183 population data or the statistical units of the population data, which is known as the  
184 modifiable area unit problem effect in spatial statistics studies. If people are distributed  
185 uniformly in a region, then the population mean center is equal to the geometric center  
186 of the region. However, population distribution is generally unbalanced, and the  
187 population mean center consistently strays from the geometric center.

### 188 3.2 Measurement of the migration centerline

189 Similar to the population mean center, if  $P_i$  indicates the total number of in-  
190 migrants ( $I_i$ ) or the total number of out-migrants ( $O_i$ ) in province  $i$ , then the in-migration  
191 center ( $XI, YI$ ) or out-migration center ( $XO, YO$ ) can be defined. Furthermore, suppose  
192 the total number of in-migrants or out-migrants occupies the same proportion of the  
193 total population in each unit. In that case, the in-migration or out-migration center is  
194 the same as the population mean center. However, due to regional development  
195 differences, some regions serve as the main out-migration origins, whereas others are  
196 popular in-migration destinations. As a result, the in-migration center is typically  
197 different from the out-migration center. Such a difference shows the geographic  
198 variation between sending-out origins and arriving-in destinations.

199 In this article, we introduce a novel concept called the migration centerline. The  
 200 migration centerline is defined as a line that starts at the out-migration mean center and  
 201 ends at the in-migration mean center. Similar to the population mean center, in-  
 202 migration center, and out-migration center, the migration centerline is employed to  
 203 reflect general geographic patterns. However, unlike the population mean centers, the  
 204 migration centerline extends from a point to a vector, which presents geographic  
 205 location details and the attributes of length and direction. The length of the migration  
 206 centerline indicates the general migration distance, and its direction shows the main  
 207 migration direction in the migration system.

208 The vector formula of the migration centerline is as follows:

$$\begin{aligned}
 \overrightarrow{OD} &= (XI - XO, YI - YO) \\
 &= \left( \frac{\sum_{i=1}^n (I_i x_i)}{\sum_{i=1}^n I_i} - \frac{\sum_{i=1}^n (O_i x_i)}{\sum_{i=1}^n O_i}, \frac{\sum_{i=1}^n (I_i y_i)}{\sum_{i=1}^n I_i} - \frac{\sum_{i=1}^n (O_i y_i)}{\sum_{i=1}^n O_i} \right) \quad (3)
 \end{aligned}$$

211 The term  $\overrightarrow{OD}$  denotes the vector of the migration centerline, with a direction from the  
 212 out-migration mean center to the in-migration mean center.  $XI$ ,  $XO$ ,  $YI$ , and  $YO$  are the  
 213 longitude of the in-migration mean center, the longitude of the out-migration mean  
 214 center, the latitude of the in-migration mean center, and the latitude of the out-migration  
 215 mean center, respectively.  $I_i$  and  $O_i$  indicate the total number of in-migrants and out-  
 216 migrants in province  $i$ , respectively, and  $x_i$  and  $y_i$  are the longitude and latitude of  
 217 province  $i$ , respectively. Accordingly, the length of the migration centerline, which is a  
 218 type of vector module, can be calculated as follows:

$$|\overrightarrow{OD}| = \sqrt{\left( \frac{\sum_{i=1}^n (I_i x_i)}{\sum_{i=1}^n I_i} - \frac{\sum_{i=1}^n (O_i x_i)}{\sum_{i=1}^n O_i} \right)^2 + \left( \frac{\sum_{i=1}^n (I_i y_i)}{\sum_{i=1}^n I_i} - \frac{\sum_{i=1}^n (O_i y_i)}{\sum_{i=1}^n O_i} \right)^2} \quad (4)$$

220 In addition to the starting out-migration mean center and the ending in-migration  
 221 mean center, any point on the migration centerline can be proven to be equal to the  
 222 mean center of a proportional division of points in all the origin-to-destination  
 223 migration lines, as presented in [Appendix A](#). The findings of this derivation shown in  
 224 [Appendix A](#) illustrate three quantitative relationships between the migration centerline  
 225 and each migration flow from the perspective of a plane vector. First, in terms of flux,



226 the number of migrants is used to indicate the population weight of the migration line.  
 227 Second, the direction of the migration centerline is determined by the locations of the  
 228 in-migration and out-migration mean centers. Third, the length of the migration  
 229 centerline reflects the general migration distance of all migration lines.

### 230 3.3 Contributions to migration centerline changes

231 Changes in the mean center or migration centerline show the spatial dynamics of  
 232 population distribution or migration and are beneficial for understanding the geographic  
 233 transformation process. To determine the locations responsible for changes in the  
 234 migration centerline, we introduce the contribution degree measure for in-migration  
 235 and out-migration centers. The contribution degree measure includes an east-west  
 236 component and a north-south component. Using the east-west change in the in-  
 237 migration center as an example, the following equation presents a decomposition  
 238 procedure for calculating contribution degree measures:

$$\begin{aligned}
 240 \quad XI_t - XI_0 &= \frac{\sum_{i=1}^n (I_{it} x_i)}{\sum_{i=1}^n I_{it}} - \frac{\sum_{i=1}^n (I_{i0} x_i)}{\sum_{i=1}^n I_{i0}} \\
 241 &= \left( \frac{I_{1t}}{\sum_{i=1}^n I_{it}} - \frac{I_{10}}{\sum_{i=1}^n I_{i0}} \right) x_1 + \left( \frac{I_{2t}}{\sum_{i=1}^n I_{it}} - \frac{I_{20}}{\sum_{i=1}^n I_{i0}} \right) x_2 + \dots \\
 242 &\quad + \left( \frac{I_{nt}}{\sum_{i=1}^n I_{it}} - \frac{I_{n0}}{\sum_{i=1}^n I_{i0}} \right) x_n \\
 243 &= \sum_{i=1}^n \Delta S_i x_i = \Delta S_1 x_1 + \Delta S_2 x_2 + \dots + \Delta S_n x_n \\
 239 &= \sum_{i=1}^n C_i = C_1 + C_2 + \dots + C_n \quad (5)
 \end{aligned}$$

244 In the above equation,  $XI_t$  and  $XI_0$  denote the longitudes of in-migration centers at  
 245 terminal time  $t$  and initial time  $0$ ,  $I_{it}$  and  $I_{i0}$  represent the number of in-migrants in  
 246 province  $i$  at terminal time  $t$  and initial time  $0$ ,  $x_i$  is the longitude of province  $i$ ,  $n$  is the  
 247 number of provinces,  $\Delta S_i$  is the in-migrant's share of province  $i$  occupied by the total  
 248 number of migrants and  $C_i$  is the contribution degree of province  $i$  to the longitude  
 249 change which equals  $\Delta S_i x_i$ . The resulting measure provides the contribution degree

250 based on geographical location and the share of migrants in each province. The north-  
251 south change in the mean center can be deduced similarly by replacing  $x_i$  with  $y_i$ . By  
252 replacing the in-migration center with the out-migration center, it shows a measure for  
253 the contribution degree of each province to the out-migration center changes.

### 254 **3.4 Population migration definitions in China**

255 The censuses and mid-census one percent sample surveys provide a  
256 comprehensive set of successive population migration data for China. Similar to other  
257 nations, China has consistently used a five-year interval to measure to define population  
258 migration. Given that the census or one-percent sample survey is conducted every five  
259 years in China, the five-year migration data can reflect population migration dynamics  
260 consecutively. The five-year interval is based on questions on individuals' residential  
261 location five years before the census or survey date. Aggregations of individual's  
262 residential locations at the census or survey data and their residential location five years  
263 prior form the basis of cross-tabulations for the number of migrations between all sets  
264 of origin and destination provinces in each period. Unlike most countries, China has a  
265 particular additional definition for population migration, that is, non-*hukou* migration,  
266 owing to its *hukou* registration system. In non-*hukou* migration, the destination remains  
267 the residential location at the time of the census or survey, but the origin is the *hukou*-  
268 registered location during the same time. Although non-*hukou* migration presents an  
269 origin-destination matrix, it is akin to a migrant stock tabulation, showing the number  
270 of migrants at a specific point in time without recording the migration events. In this  
271 study, we explore the transformation of migration centerlines for five-year and non-  
272 *hukou* migrations. We aim to detect the temporal migration dynamics and specific  
273 migration issues in China.

### 274 **3.5 Data sources**

275 The tabulations of the population censuses and one-percent sample surveys  
276 provide only the interprovincial population migration matrix. Considering provincial-  
277 level administrative adjustments before 1997, our study focuses on five-year migrations

278 during 1995–2000, 2000–2005, 2005–2010, and 2010–2015 and non-*hukou* migrations  
279 in 2000, 2005, 2010, and 2015. The interprovincial population migration matrices are  
280 acquired from the tabulations of the 2000 census, the 2005 one-percent sample survey,  
281 the 2010 census, and the 2015 one-percent sample survey. The details of the migration  
282 data sources are listed in [Appendix B](#). All the geographic data are from the Resource  
283 and Environment Data cloud platform of the Chinese Academy of Sciences. We use the  
284 provincial capital to represent the geolocation of each province. Moreover, we build an  
285 origin-destination spatial database for the population migration system.

## 286 **4. Results**

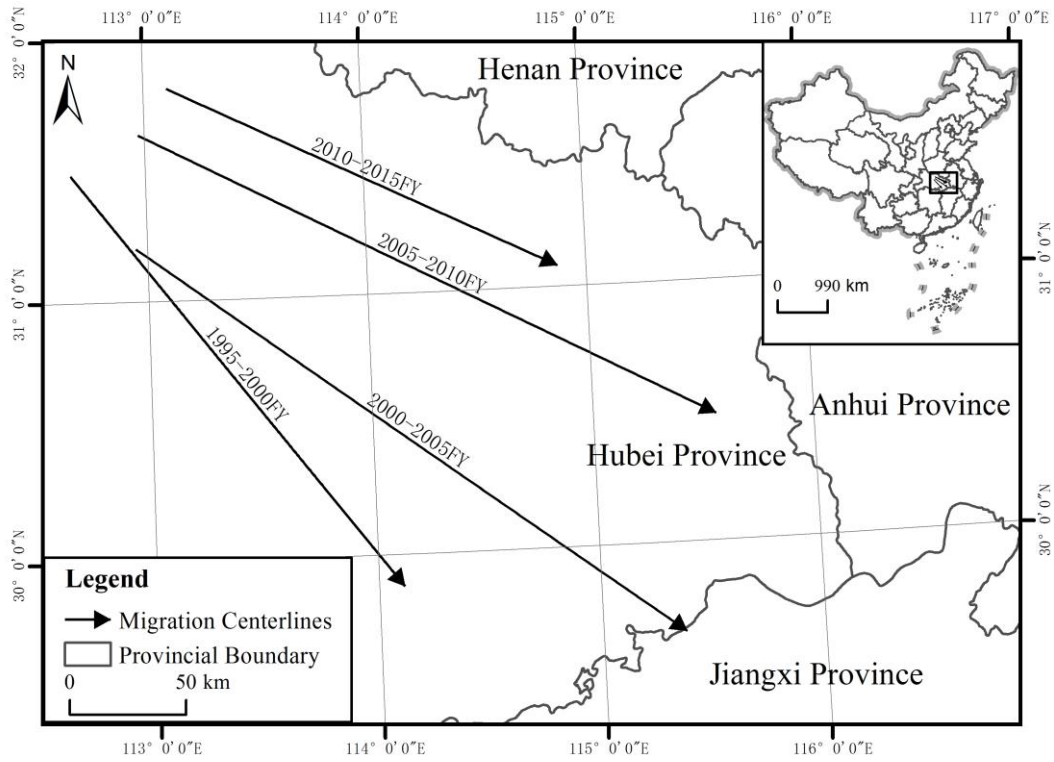
### 287 **4.1 Changes in China’s population migration centerline dynamics from 1995 to** 288 **2015**

289 [Fig. 1](#) shows China’s internal population migration centerlines based on the  
290 definition of five-year population migration. The related parameters for each line are  
291 listed in [Table 1](#). From 1995 to 2015, the population migration centerlines in different  
292 five-year periods were consistently located in Hubei, a province in central China. In  
293 addition, the directions of the population migration centerlines are all from the  
294 northwest to the southeast, which indicated a stable movement trend from the inland  
295 region to the southeast coastal region. However, the population migration centerlines  
296 from 1995 to 2015 demonstrate three forms of instability. First, the origins of the  
297 population migration centerlines or out-migrant geographic centers shift over time.  
298 Specifically, the origins moved southeast from the 1995–2000 period to the 2000–2005  
299 period and began moving north after 2005. In general, the change in origins is driven  
300 by the increasing out-migration activity in northern China. Second, the destinations of  
301 the population migration centerlines or in-migrant geographic centers continued to  
302 evolve. The movements of the destinations were east oriented, north oriented, and  
303 northwest oriented in an orderly manner from 1995 to 2015. Distinct from the origins  
304 of the population migration centerlines, the destinations moved north and west after  
305 2010, reflecting the populations’ increasing attraction to the inland region from 2010 to  
306 2015. Third, the length of the population migration centerlines changed owing to

307 variations in the origins and destinations. Lengths increased before 2005 from  
308 increasing inequalities in economic development between sending-out origins and  
309 arriving-in destinations and then began to decline.

310 [Fig. 2](#) presents population migration centerlines based on the definition of non-  
311 *hukou* population migration. The parameters for these migration centerlines are listed  
312 in [Table 1](#). Similar to the centerlines for the five-year population migrations, those from  
313 2000 to 2010 were all situated in Hubei Province, and their direction remained from the  
314 northwest to the southeast. However, the non-*hukou* population migration centerlines'  
315 movements exhibited two different patterns over time in comparison to the five-year  
316 migration flows. First, the non-*hukou* lines exhibit a shift south between 2010 and 2015  
317 after a continuous shift north in previous years, whereas the five-year population  
318 migration centerlines displayed only northward shifts throughout the entire data period,  
319 including between the 2005–2010 and 2010–2015 periods. Second, the five-year  
320 population migration centerlines the destinations moved north and west between 2005-  
321 10 and 2010-15 periods. This movement reflected a reduction in the attraction to the  
322 coastal region for migrants and a rise in in-migration activity in the inland region. For  
323 non-*hukou* population migration centerlines between 2010 and 2015, the westward  
324 movement of destinations is far less pronounced, which showed most of the non-*hukou*  
325 migrants remained in the coastal area although population attraction in inland areas was  
326 increasing after 2010.

327 Similar to the five-year population migration centerlines, the length of the non-  
328 *hukou* population migration centerlines decreased towards the end of the data period  
329 after initial increases between 2000 and 2005. The decline in length between 2005 and  
330 2010, and 2010 and 2015, was a reflection of non-*hukou* migrants staying closer to their  
331 *hukou*-registered hometowns.



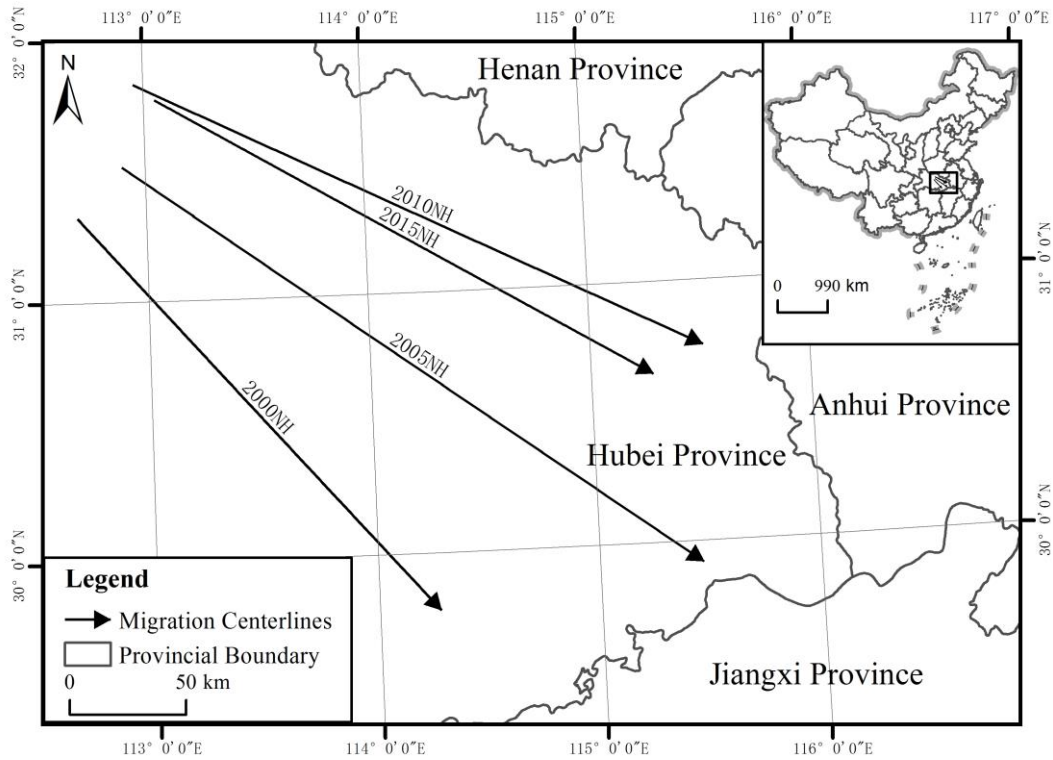
332

333 Fig. 1. Map of China's five-year population migration centerlines from 1995 to 2015

334 Note: FY represents five-year population migration.

335

336



337

338 Fig. 2. Map of China's non-*hukou* population migration centerlines from 1995 to 2015

339 Note: NH represents non-*hukou* population migration.

340 **Table 1**

341 Parameters of China's internal population migration centerlines from 1995 to 2015

Migration Types	Centerline Origin	Centerline Destination	Centerline Length	Centerline Direction
Five-year migration				
1995–2000 FY	(112°39', 31°29')	(114°07', 29°53')	227.51 km	Southeast
2000–2005 FY	(112°57', 31°12')	(115°22', 29°39')	288.55 km	Southeast
2005–2010 FY	(112°58', 31°38')	(115°33', 30°29')	275.99 km	Southeast
2010–2015 FY	(113°06', 31°49')	(114°52', 31°05')	184.65 km	Southeast
Non- <i>hukou</i> migration				
2000 NH	(112°41', 31°20')	(114°16', 29°47')	229.88 km	Southeast
2005 NH	(112°54', 31°31')	(115°28', 29°55')	302.45 km	Southeast
2010 NH	(112°57', 31°50')	(115°31', 30°45')	269.46 km	Southeast
2015 NH	(113°03', 31°46')	(115°17', 30°39')	244.92 km	Southeast

342 Note: FY and NH represent five-year and non-*hukou* population migrations, respectively.

343 **4.2 Contributions to changes in China's population migration centerlines from**  
 344 **1995 to 2015**

345 The provincial contributions to changes in the five-year and non-*hukou* population

346 migration centerlines over the entire data period are mapped in Fig. 3 to Fig. 10. Fig. 3  
347 and Fig. 4 show the contributions to the in-migration center for the five-year population  
348 migration flows by changes in the east–west and north–south components. In Fig. 5 and  
349 Fig. 6, changes in the out-migration centers for the five-year population migration flows  
350 are shown (first by the east-west components and then for the north-south components).  
351 In Fig. 7 and Fig. 8, the changes in the in-migration centers for the non-*hukou* migrant  
352 populations are provided, while in Fig. 9 and Fig. 10, the changes in the out-migration  
353 centers for the non-*hukou* migrant populations are displayed.

354 The in-migration center changes in the five-year population migrations from the  
355 1995–2000 period to the 2000–2005 period, displayed in Fig. 1, show a general  
356 eastwards direction. As shown in Fig. 3 and Fig. 4, the coastal provinces such as  
357 Zhejiang, Jiangsu, Shanghai, and Fujian are notable contributors with large east-west  
358 component measures, especially in earlier periods. The notable exception is Guangdong,  
359 with large westward components in each of the periods. The north-oriented movement  
360 of the five-year population migrations during the early parts of the data period was  
361 primarily affected by increasing in-migrant percentages in Beijing, Zhejiang, Tianjin,  
362 Shanghai, and Jiangsu, as shown in Fig. 4. In the later part of the data period, Shanghai  
363 and Zhejiang joined Guangdong with large southern component values. After 2010, the  
364 coastal provinces, including Guangdong, Zhejiang, Shanghai, and Liaoning, were the  
365 main contributors that moved the in-migration centers to the west, while the inland  
366 provinces such as Shaanxi, Henan, Chongqing, Sichuan, Hubei, Anhui, Hunan, Jiangxi  
367 Guizhou, and Yunnan played an offsetting role because of the increasing shares of in-  
368 migrants in these provinces.

369 The out-migration centers from the five-year population migration flow, moved  
370 north during the period of 2000–2015, displayed in Fig. 1. As shown in Fig. 6, the  
371 provinces located in northern China, including Hebei, Henan, Shandong, and Shanxi,  
372 were the major contributors for the north-oriented movement of the out-migration  
373 centers from the 1995–2000 period to the 2005–2010 period. From the 2005–2010  
374 period to the 2010–2015 period, dominant provinces, including Guangdong, Hebei,

375 Shanxi, Zhejiang, Beijing, and Shanghai, were distributed in northern China and  
376 southern China. Although the northward movement trends of population migration  
377 centers were similar during each period, as shown by the migration centerlines, the  
378 main contributors to the general direction had varied.

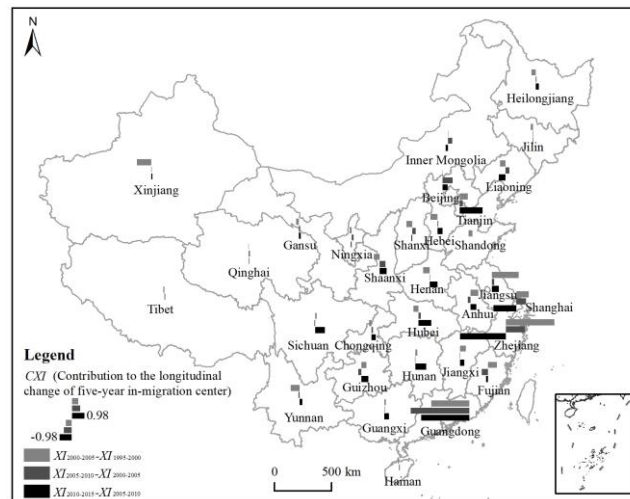
379 The in-migration center changes in the non-*hukou* population migrations, shown  
380 in Fig. 7, the east-oriented movement from 2000 to 2005 were mainly driven by coastal  
381 provinces, such as Zhejiang, Jiangsu, Shanghai, Beijing, Tianjin, and Fujian. The north-  
382 oriented movement from 2005 to 2010, shown in Fig. 8, was also prevalingly  
383 dominated by coastal provinces, including Beijing, Tianjin, Zhejiang, and Shanghai.  
384 From 2010 to 2015, the trajectory of the in-migration centers changed toward the  
385 southwest. Zhejiang, Shanghai, Fujian, Inner Mongolia, and Liaoning contributed to  
386 the western and southern movements.

387 For the out-migration centers in the non-*hukou* population migrations shown in  
388 Fig. 10, the north-oriented movement from 2000 to 2005 was led by inland provinces,  
389 such as Chongqing, Henan, Anhui, Guizhou, Heilongjiang, Hubei, and Yunnan. From  
390 2005 to 2010, the trajectory kept moving to the north, also contributed mainly by inland  
391 provinces, including Hebei, Henan, Shandong, Gansu, Shanxi, and Yunnan. From 2010  
392 to 2015, the out-migration centers transferred southeast. Inland provinces, including  
393 Sichuan, Anhui, Chongqing, Hubei, Henan, and Jiangxi, played a crucial role in pulling  
394 the out-migration centers to the south. In addition, coastal and inland provinces,  
395 including Guangdong, Guangxi, Shanxi, Yunnan, Zhejiang, and Shanghai, were the  
396 main contributors to the eastern movement (shown in Fig. 9).

397 In summary, for the five-year and non-*hukou* population migrations, the main  
398 contributors to in-migration center changes were located mainly in coastal provinces.  
399 In contrast, the out-migration center changes were primarily affected by inland  
400 provinces. Further, the attraction of in-migration to some coastal provinces decreased  
401 over the data period, whereas in-migration attraction to several inland provinces  
402 increased. Guangdong, as one of the most popular destinations for migrants, faced  
403 decreasing share of in-migrants. Fujian, Zhejiang, and Shanghai were early sources of

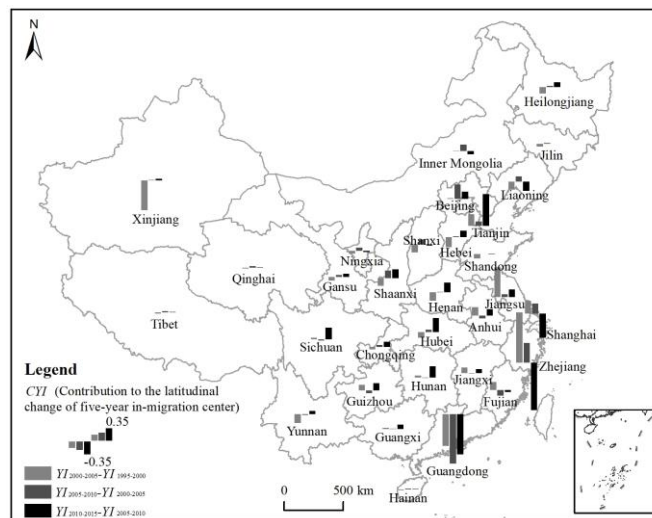


404 the increase in the shares of in-migrants in the east. However, these provinces began to  
 405 lose their shares of in-migrants, especially after 2010. Tianjin and Jiangsu were the only  
 406 two provinces in the coastal region that experienced an increase in the shares of in-  
 407 migrants during the 2010–2015 period. Meanwhile, the out-migration shares in most  
 408 coastal provinces increased, especially after 2010, pulling the out-migration centers east  
 409 and north. The directions of in-migration or out-migration center change altered in some  
 410 inland provinces, especially after 2010. Such geographic transformations resulted  
 411 partly from the increased migration flows from the coastal region to the inland region  
 412 after 2010.



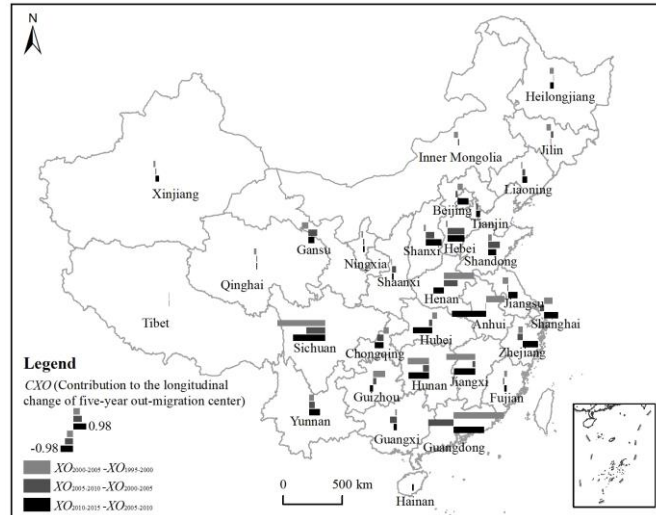
413

414 Fig. 3. Contributions to the longitudinal change of five-year in-migration centers from 1995 to 2015



415

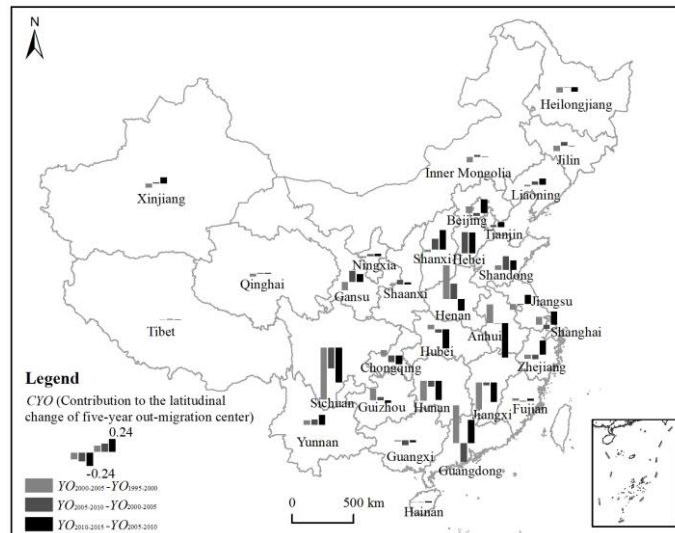
416 Fig. 4. Contributions to the latitudinal change of five-year in-migration centers from 1995 to 2015



417

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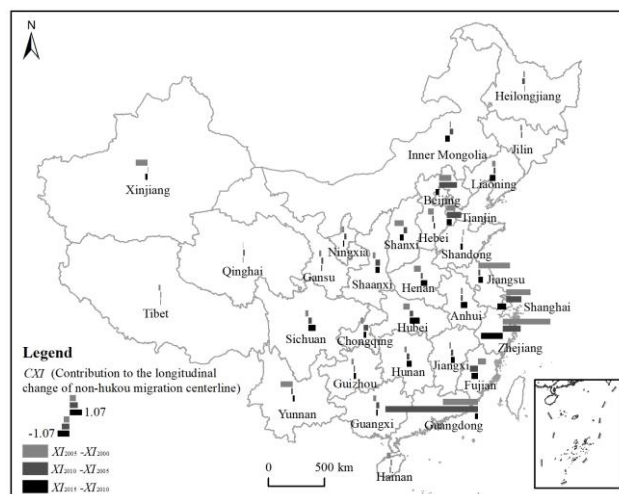
Fig. 5. Contributions to the longitudinal change of five-year out-migration centers from 1995 to 2015



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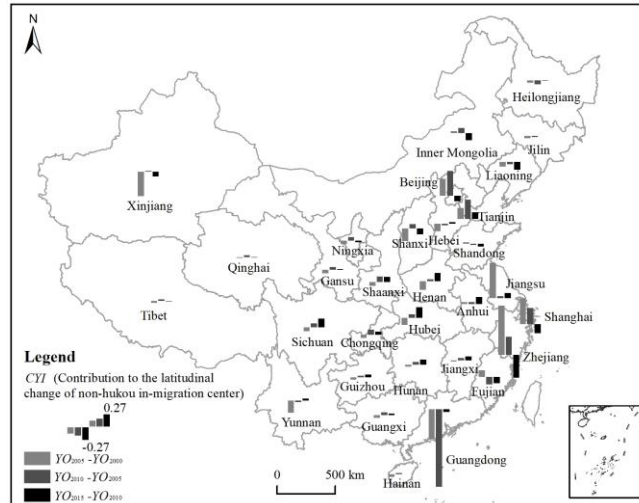
Fig. 6. Contributions to the latitudinal change of five-year out-migration centers from 1995 to 2015



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422

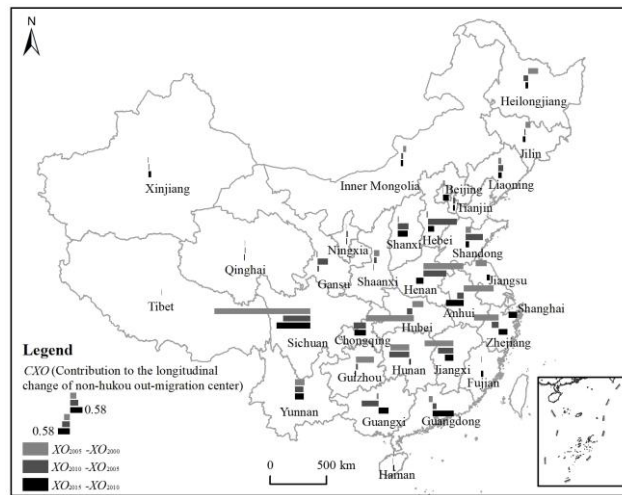
Fig. 7. Contributions to the longitudinal change of non-hukou in-migration centers from 1995 to 2015



423

424

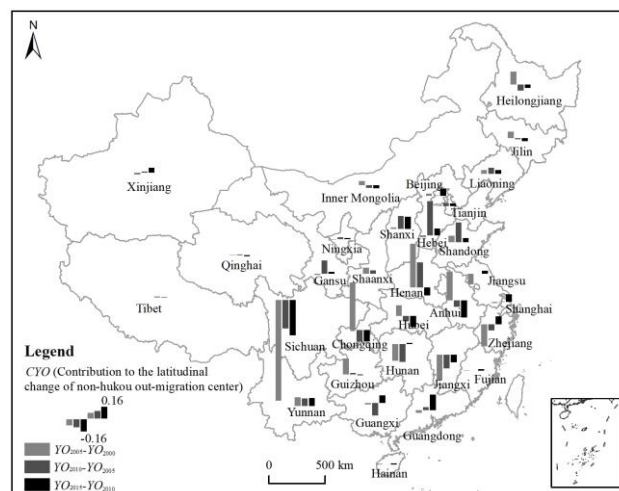
Fig. 8. Contributions to the latitudinal change of non-*hukou* in-migration centers from 1995 to 2015



425

426

Fig. 9. Contributions to the longitudinal change of non-*hukou* out-migration centers from 1995 to 2015



427

428

Fig. 10. Contributions to the latitudinal change of non-*hukou* out-migration centers from 1995 to 2015

### 429 4.3 Comparisons with population centers and economic centers

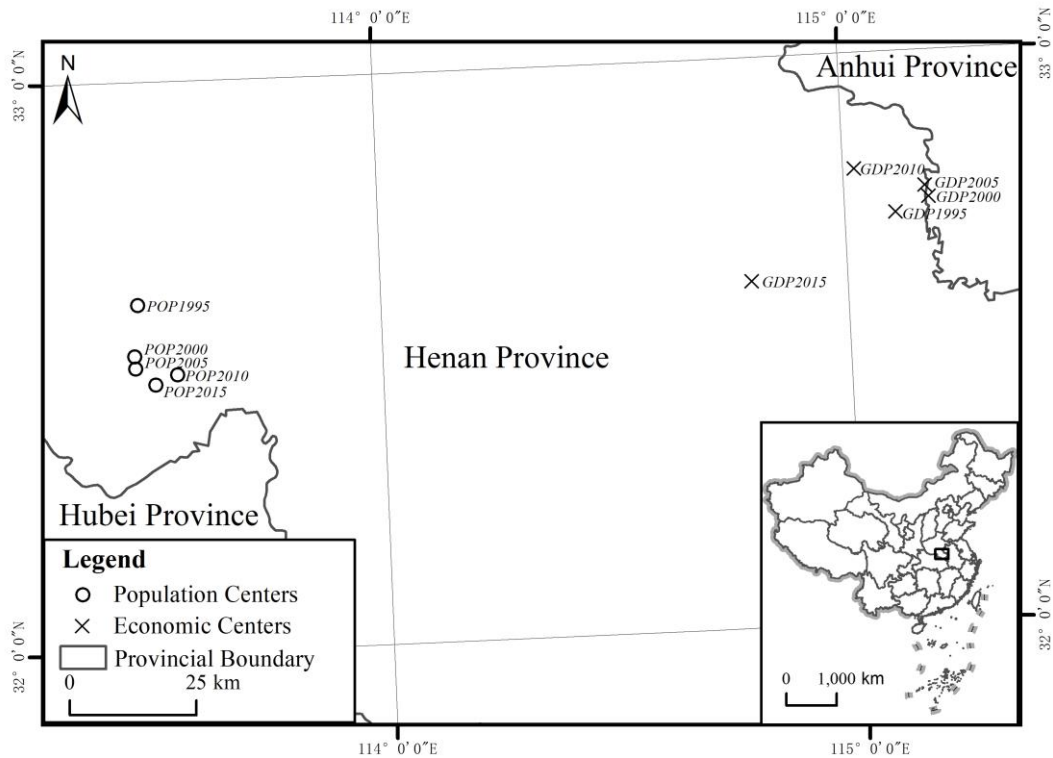
430 According to the push and pull theory of migration (Lee, 1966) factors operate on  
431 populations pushing and pulling potential migrants with intervening opportunities and  
432 obstacles, such as spatial distance, that lead to friction on the level of population  
433 migration (Stillwell et al., 2016). Numerous quantitative models, including the gravity  
434 model, the intervening opportunities model and the radiation model (Simini et al., 2012;  
435 Barbosa et al., 2018) have been widely applied to explain or estimate the spatial  
436 dynamics of population movements. Economic factors and transportation distance were  
437 typically selected as the key determinants of internal population migration. In China  
438 between 1995 and 2015, the length of transportation distances shortened owing to  
439 transportation network improvements, especially the expansion of the high-speed  
440 railway (Cao et al., 2013). However, the pulling effect of a destination increased and  
441 gradually became a dominating factor (Li et al., 2014). The following section examines  
442 the links between the economic centers and population migration centerlines in China.

443 In Table 2 and Fig. 11, the locations of the economic centers for China between  
444 1995 and 2015 are reported and mapped, based upon calculations using provincial GDP  
445 data. Economic centers were located mainly in Henan Province or at the junction  
446 between Henan Province and Anhui Province, reflecting eastern China's considerable  
447 economic advantage over the inland region. Economic centers over the north-south axis  
448 moved mainly north from 1995 to 2010 but transferred south from 2010 to 2015.

449 There are several significant connections between the movements of economic  
450 centers and population migration centerlines. As discussed in the previous section, the  
451 destinations of the five-year and non-*hukou* population migration centerlines moved  
452 northwards, especially from 2000 to 2010. The five-year population migration  
453 centerlines continuously moved north after 2010 and lagged behind the south-oriented  
454 movement of economic centers. The five-year population migration centerline  
455 shortened significantly compared with that from 2000 to 2010 in line with the change  
456 in the economic centers. From 2010 to 2015, the non-*hukou* population migration  
457 centerlines moved south in sync with changes in economic centers.

458 Along the east-west axis, economic centers moved east from 1995 to 2000.  
459 However, they transferred west after 2005, exhibiting similar trajectories to the  
460 destinations of the five-year or non-*hukou* population migration centerlines in the east-  
461 west direction. As the economy grew in central and western China, the economic gap  
462 between the coastal and inland regions narrowed and prompted the population  
463 migration centerlines to transfer to inland destinations.

464 The most direct effect of population migration is on the spatial redistribution of  
465 the population. In [Table 2](#) and [Fig. 11](#), the locations of the population centers of China  
466 between 1995 and 2015 are reported and mapped using the provincial residential  
467 population data. All population centers during the data period were located in Henan  
468 Province. Compared with economic centers, the locations of the population centers  
469 were further west due to the more developed economies in the eastern. Compared with  
470 the in-migration and out-migration centers in the population migration lines, the  
471 locations of the population centers were further north, reflecting the intense population  
472 migration activity in southern China. Although the five-year or non-*hukou* population  
473 migration centerlines moved north during most periods, the centerlines pointed to the  
474 southeast. This direction of the migration centerlines was a product of increased  
475 migrants in the south, which is also connected to the shift of the population center  
476 southwards between 1995 and 2015. Furthermore, the slide of population centers  
477 eastwards from 2005 to 2010 and transfer westwards after 2010 is reflected in the west-  
478 oriented movement of in-migration centers in the population migration centerlines.



479

480 Fig. 11. Map of China's population and economic centers from 1995 to 2015

481 Note: POP and GDP represent the population center and economic center, respectively.

482 **Table 2**

483 Parameters of China's population and economic centers from 1995 to 2015

Year	Population centers	Economic centers
1995	(113°28', 32°36')	(115°06', 32°43')
2000	(113°28', 32°31')	(115°10', 32°44')
2005	(113°28', 32°29')	(115°10', 32°45')
2010	(113°33', 32°29')	(115°01', 32°47')
2015	(113°30', 32°28')	(114°47', 32°36')

484

## 485 5. Discussion

### 486 5.1 Data applicability of the migration centerline

487 By extending geographic centers from one-dimensional to two-dimensional cases,  
 488 we present a novel migration centerline method. Unlike existing indices for describing  
 489 the migration situation or flow of each region ( Liu et al., 2011; Cao et al., 2018), the

490 migration centerline offers an intuitive way to observe the overall geographic patterns  
491 of population migrations. Specifically, changes in the migration centerline are  
492 extremely meaningful because they provide a number of summaries of population  
493 migration dynamics, including variations in migration directions, distances, and out-  
494 and in- migration centers. However, the appropriateness of census data used to calculate  
495 the migration centerline should be considered carefully, especially for examining the  
496 entire population migration process. We suggest two main areas of concern surrounding  
497 the input data that users should be aware of when calculating migration centerlines.

498 The first concern involves whether the definition of population migration covers  
499 all migrants. In the case of China, we employ five-year and non-*hukou* population  
500 migrations because the related data are consecutive and attainable from the tabulations  
501 of the population censuses and one-percent sample surveys. Although data sources that  
502 serve as the basis for the counts of five-year or non-*hukou* have target populations that  
503 cover the whole population, these data do not represent all the migrants in the country.  
504 The five-year migrations cover only the “survivors” at the beginning and end of five  
505 years but ignore the three other types of migrants, including those born during a five-  
506 year period who migrated and survived those born during a five-year period who  
507 migrated but died, and those who were alive at the start of five years and migrated but  
508 died. In addition, the five-year population migrations fail to record events of repeat and  
509 return migrations, which are occasionally called “transitions” in existing studies (Rees  
510 [et al., 2017](#)). For example, repeat migrants move from the place  $i$  to place  $j$  to place  $k$ ,  
511 leading to two migrations ( $i$  to  $j$  and  $j$  to  $k$ ) for one transition ( $i$  to  $k$ ). Meanwhile, return  
512 migrants move from province  $i$  to province  $j$ , then from province  $j$  to province  $i$ , leading  
513 to two migrations but no transition. Non-*hukou* migration considers all age classes but  
514 neglects migrants who obtain a *hukou* at a destination.

515 A second concern on the appropriateness of the input data for calculating the  
516 migration centerline involves the sample. In the case of China, we consider the census  
517 and sample numbers with equal uncertainty. However, the sample numbers are subject  
518 to much larger random errors due to the sampling process. In China’s case, only the

519 data of the non-*hukou* migrants in census years 2000 and 2010 are based on 100% of  
520 the samples, whereas the data of the other migrants are based on the sampling surveys.  
521 [Table 3](#) shows the sampling fractions of the five-year and non-*hukou* migrations in  
522 different years. We did not previously mention the sampling fractions above because the  
523 calculation of the migration centerline needs only the share of migrants rather than the  
524 absolute number of migrants. Nevertheless, the sample matters for the measurement of  
525 the migration centerline. The errors in the sampling process may affect the precision of  
526 the in- and out-migration centers and the contributions to the migration centerline  
527 changes in different provinces. For example, a small number of migrants from province  
528 *i* to province *j* could be identified in the 100% sampling census but may be counted as  
529 0 in the 10% or one-percent sampling surveys owing to the small number of surveying  
530 samples. As a result, the share changes of the in- and out-migrants in province *i* and  
531 province *j* in different years with different sampling fractions could increase or decrease.  
532 As the country with the largest population in the world, a one-percent household sample  
533 in China is still huge. The huge sample may narrow confidence intervals; however, it  
534 cannot avoid errors. Thus, when using the migration centerline, we recommend data  
535 availability and its applicability should be considered.

536 **Table 3**

537 Sampling fractions of five-year and non-*hukou* migrations in different years in China

Migration type	Census or one-percent sampling survey year	Sampling fraction (%)
Five-year migration	2000	9.5
Five-year migration	2005	1.325
Five-year migration	2010	9.55
Five-year migration	2015	1.55
Non- <i>hukou</i> migration	2000	100
Non- <i>hukou</i> migration	2005	1.325
Non- <i>hukou</i> migration	2010	100
Non- <i>hukou</i> migration	2015	1.55



## 539 **5.2 Geographic transformation of China's internal population migrations**

540 With regard to the stability, our findings are in line with those of existing studies  
541 (Li et al., 2014); that the general direction of the population migration is southeast-  
542 oriented. In addition, our study also shows that population migration centerlines are  
543 located consistently south of population centers. This result was driven by relatively  
544 consistently high levels of population migration activity in southern China.

545 With regard to the instability of spatial population dynamics, in this study, rather  
546 than focusing on the quantitative connections between population migrations and the  
547 economy (Zhang & Song, 2003; Chan, 2012a; Liang et al., 2014; Liu et al., 2015), we  
548 explored relationships from a geographic perspective. Moreover, it is easy to figure out  
549 the main drivers of geographical transformation by calculating the contributions. First,  
550 as economic centers changed from south to north from 2000 to 2010, the in-migrant  
551 and out-migrant centers in the migration centerlines moved north in sync. This  
552 phenomenon corresponds with the market-oriented economy development sequence of  
553 the Peral River Delta area in Guangdong; the Yangtze River Delta area in Shanghai,  
554 Jiangsu, and Zhejiang; and the capital area in Beijing, Tianjin, and Hebei. Therefore,  
555 the earlier floating population appeared in the southern provinces. Now the population  
556 migration in north China is also active. Those less developed provinces in north China  
557 also become the distinct net out-migration area and even form some typical shirking  
558 cities. Second, the migration centerline also figured out that a distinct geographic  
559 transformation of population migration emerged after 2010. The movement of in-  
560 migration centers became highly active in the west-east direction and not merely in the  
561 north-south direction. From 2010 to 2015, in-migration centers moved significantly  
562 west, indicating an increasing in-migration attraction to inland provinces. On the one  
563 hand, the withdrawal of foreign investments in manufacturing in coastal areas,  
564 industrial upgrading in coastal areas, and industrial transfer from coastal to inland areas  
565 contributed to the increasing in-migration and return migration in inland provinces. On  
566 the other hand, China launched the “Belt and Road Initiative” in 2013 and promoted  
567 economic growth in the inland area(Liu et al., 2020). Provincial capitals in central and

568 western China, including Xi'an, Zhengzhou, Chongqing, Wuhan, Chengdu, and  
569 Urumqi, became the key economic hubs of the "Silk Road Economic Belt." As a result,  
570 with the increase of employment opportunities in the central and western regions, the  
571 center of population in-migration has shifted westward significantly.

572 From a theoretical point of view, the geographical transformation of population  
573 migration has given us some enlightenment. Recent theories show a non-linear  
574 relationship between development and levels of out-migration(De Haas, 2010; Clemens,  
575 2014). With the development of less developed areas, for example, the central and  
576 western regions of inland China, population migration has increased. In contrast, the  
577 migration rate has changed from an increasing trend in the past to a declining trend.  
578 However, the driving mechanism of such geographical transformation is complex and  
579 diverse. For example, from the late 1960s to the early 1970s, the population of the  
580 United States migrated to the sunbelt areas, resulting in the westward shift of the  
581 population in-migration center and the population center, mainly due to the influence  
582 of new industries, climate, and other factors(Moretti, 2012). As a developing country  
583 and a world factory, China's westward shift of population in-migration center in recent  
584 years was influenced by the shift of manufacturing industry and the economic rise of  
585 its cities in the central and western regions(He et al., 2018). Tracking and examining  
586 the relationship between new factors and the contemporary geographic transformation  
587 of China's population migration is necessary to better understand migration patterns  
588 and their drivers.

589 From the perspective of policy implications, the migration centerline can  
590 intuitively provide policymakers with an overall description of spatial shifts in  
591 migration flows. Since the new-type urbanization strategy, implemented in 2014,  
592 many policies have attached importance to the reform of household registration and the  
593 process of citizenization of floating population in large cities in coastal areas. Under  
594 the trend of population migration direction, the social welfare of the floating population  
595 in the new hot areas of population immigration in the central and western regions should  
596 also be concerned. Moreover, with China's population migration pattern change, the

597 transformation and development of emerging population loss areas should also be  
598 concerned.

### 599 **5.3 Future perspectives**

600 Our study employs the migrant centerline to investigate geographic changes in  
601 population migrations at different times. Moreover, we consider spatial differences  
602 between five-year and non-*hukou* population migrations. For example, the non-*hukou*  
603 migration centerlines show that out-migration and in-migration centers moved south.  
604 In contrast, the five-year population migration centerlines show the two centers moving  
605 north after 2010. Furthermore, the distance between in-migrant and out-migrant centers  
606 in the five-year population migrations narrows distinctly after 2010. In contrast, this  
607 distance in the non-*hukou* population migration only changes a little. Such a difference  
608 is due to the migration duration problem. For the five-year population migration  
609 measure, a movement must have occurred within five years. However, for the non-  
610 *hukou* migration measure, it is unknown when a movement occurred and is likely to be  
611 more than five years for many individuals. In future studies, the migration centerline  
612 could be helpful for comparing various types of movements, such as differences  
613 between skilled and unskilled migrants, gaps between short- and long-distance  
614 migrations, and imparities between daily intercity mobilities and permanent intercity  
615 resettlements. In addition, our methods on the contributions to migration centerline  
616 changes can be helpful to figures out the main contributors to the changes, especially  
617 under different definitions of population migrations.

618 Our study does not investigate the modifiable areal unit problem of the migration  
619 centerline owing to the limitations of the migration data of China. The number of  
620 migrants may be affected by contrived administrative units (Stillwell et al., 2016). For  
621 instance, Beijing is a provincial-level municipality with a small territory but a large  
622 population. In contrast, Tibet is a provincial-level autonomous region with vast lands  
623 and a large population. Consequently, the modifiable areal unit problem has a couple  
624 of notable impacts on the total number of migrants and the counts of migration flows  
625 in any origin-destination table. First, the scale of migration is directly impacted by the

626 modifiable areal unit problem. In our study, we use the exact territorial boundaries, that  
627 is, those of 31 provinces of Mainland China, from a fixed point in time. However, we  
628 do not explore how the migration centerline will vary if we use the migrant data on  
629 smaller geographic units, including prefectural, county, and town-level boundaries.  
630 Unfortunately, the tabulations of the Chinese censuses and one-percent surveys provide  
631 only the total number of in-migrants based on the smaller units and lack information on  
632 out-migrants and inter-unit migration flows. The second notable problem is the zoning  
633 issue. The spatial pattern could be different if we have different concepts or boundaries  
634 of regions. We do not test the level of differences if province boundaries are changed.  
635 Existing studies explored this issue based on the IMAGE project (Stillwell et al., 2014;  
636 Stillwell et al., 2016). The scholars found some variations across zone designs, which  
637 did not considerably alter some migration measures. If the data in small units can be  
638 accessed, then future research could potentially explore the zoning issue of the  
639 migration centerline through zone designs based on the smaller units.

640 There are some obvious limitations to this study. For example, the census itself  
641 has some shortcomings, including the poor timeliness of data, the impact of sampling  
642 ratio, and statistical methods. However, with the application of social survey data and  
643 big data, the migration centerline can be more widely used in population mobility or  
644 migration. Moreover, We just made a simple comparative analysis of the population  
645 and economic center. However, the mechanism of the geographic transformation of  
646 population migrations is highly complex(Chen et al., 2016 ). In addition, other regional  
647 factors, such as the natural environment, social welfare, and property prices, can affect  
648 or be affected by internal population migration in China. For further research in the  
649 future, these are the issues that need to be explored.

## 650 **6. Conclusion**

651 Using our proposed measure of a migration centerline, we explored the geographic  
652 transformation of China's internal population migration from 1995 to 2015 based upon  
653 both five-year and non-*hukou* population migration measures. We then discussed our  
654 findings based on the calculated migration centerlines in relation to economic and

655 population factors. We identified the prominent provinces that were contributing to the  
656 different dynamics in the transformation of migration centers. Our main findings are as  
657 follows.

658 (1) The geographic patterns of China's internal population migrations changed  
659 between 1995 and 2015. As economic centers moved north, the in-migration and out-  
660 migration centers of five-year and non-*hukou* population migrations also transferred  
661 north between 2000 to 2010. However, from 2010 to 2015, the west-oriented movement  
662 of in-migration centers changed direction, in sync with the economic growth in the  
663 inland region. The general migration distance, measured by the length of the migration  
664 centerline, declined after 2010 as migrants tended to move to destinations closer to their  
665 hometowns.

666 (2) The most significant contributors to in-migration center changes were coastal  
667 provinces, whereas the most significant contributors to out-migration center changes  
668 were mostly inland provinces. The attraction of coastal provinces for in-migration  
669 decreased during the study period, whereas in-migration attraction to several inland  
670 provinces increased, especially after 2010. Although the similarities in the movement  
671 trends of population migration centers based on the five-year and non-*hukou* data, the  
672 main contributors to the locations of their mean migration centerlines varied.

673 (3) We identified a couple of constants in population migration in China between  
674 1995 and 2015. First, the direction of population migration centerlines pointed  
675 consistently southeast, reflecting the more significant attraction to the southeast coastal  
676 region. Second, the locations of in-migration and out-migration centers were  
677 consistently further south than those of population centers, indicating that population  
678 migration was highly active in the south. The population centers continuously moved  
679 south, partly due to the stable southeast-oriented migration direction over the period.

680 The migration centerline allows for a simple illustration of the geographic  
681 transformation of population migration. This novel method can be extended to reflect  
682 the spatiotemporal changes of various movements, including international population  
683 migrations, refugee trajectories, and daily commutes. Thus, the migration centerline can  
684 aid the understanding of changes in human footprints around the world. In future studies,

685 we would like to explore the modifiable areal unit problem of the migration centerline  
686 and improve the method to examine the causes and effects of changes in the migration  
687 centerline based on related developmental factors.

## 688 **Appendix A. Proportional location on migration centerline**

689 We can define a proportional location on a migration center line by considering  $k$ ,  
690 a value between zero and one, where  $k = 0$  refers to the origin of the migration centerline,  
691 and  $k = 1$  is the destination of the migration centerline. If we are interested in, for  
692 example, the median location of the migration centerline, we derive it as:

$$693 \quad XK = \frac{\sum_{i=1}^n \sum_{j=1}^n [F_{ij} k(x_i + x_j)]}{\sum_{i=1}^n \sum_{j=1}^n F_{ij}} \quad (6)$$

694 Where  $x_i$  and  $x_j$  are the east–west latitude location of the centroids for province  $i$  and  $j$ ,  
695 and  $F_{ij}$  is the size of the migration flows between province  $i$  and  $j$ . We can express a  
696 similar proportional location for the north-south longitude location using  $y_i$  and  $y_j$  in the  
697 equation above.

698 The calculation of the point  $XK$  can be simplified to

$$\begin{aligned} 700 \quad XK &= \frac{\sum_{i=1}^n \sum_{j=1}^n [F_{ij} k(x_i + x_j)]}{\sum_{i=1}^n \sum_{j=1}^n F_{ij}} \\ 701 \quad &= \frac{(\sum_{i=1}^n F_{i1} + \sum_{j=1}^n F_{1j})kx_1 + (\sum_{i=2}^n F_{i2} + \sum_{j=1}^n F_{2j})kx_2 + \dots + (\sum_{i=1}^n F_{in} + \sum_{j=1}^n F_{nj})kx_n}{\sum_{i=1}^n \sum_{j=1}^n F_{ij}} \\ 702 \quad &= \frac{(I_1 + O_1)kx_1 + (I_2 + O_2)kx_2 + \dots + (I_n + O_n)kx_n}{\sum_{i=1}^n \sum_{j=1}^n F_{ij}} \\ 703 \quad &= \frac{k(\sum_{i=1}^n I_i x_i + \sum_{j=1}^n O_j x_j)}{\sum_{i=1}^n I_i} = \frac{k(\sum_{i=1}^n I_i x_i + \sum_{j=1}^n O_j x_j)}{\sum_{j=1}^n O_j} \\ 704 \quad &= k \left( \frac{\sum_{i=1}^n I_i x_i}{\sum_{i=1}^n I_i} + \frac{\sum_{j=1}^n O_j x_j}{\sum_{j=1}^n O_j} \right) \\ 699 \quad &= k(XI + XO) \quad (7) \end{aligned}$$

705 where  $XI$  and  $XO$  are the mean centers of in-migrants and out-migrants, respectively  
706 based on the inflow and totals  $I$  and  $J$  for each province

## 707 **Appendix B. Data sources**

708 The population migration data in our study are obtained from the publicly  
709 published tabulations of the National Bureau of Statistics.

710 The 2000 fifth census data are acquired from  
711 <http://www.stats.gov.cn/tjsj/pcsj/rkpc/5rp/index.htm> and the tabulation of the 2000  
712 population census of the People's Republic of China (*in Chinese*: 中国 2000 年人口  
713 普查资料).

714 The 2005 1% population survey data are obtained from  
715 <http://www.stats.gov.cn/tjsj/ndsj/renkou/2005/renkou.htm> and the tabulation of the  
716 2005 1% population survey of the People's Republic of China (*in Chinese*: 2005 年全  
717 国 1%人口抽样资料).

718 The 2010 sixth census data are available in  
719 <http://www.stats.gov.cn/english/Statisticaldata/CensusData/rkpc2010/indexch.htm> and  
720 from the tabulation of the 2010 population census of the People's Republic of China (*in*  
721 *Chinese*: 中国 2010 年人口普查资料).

722 The 2015 1% population survey data are obtained from the tabulation of the 2015  
723 1% population survey of the People's Republic of China (*in Chinese*: 2015 年全国 1%  
724 人口抽样资料).

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