

Article

Impacts of Urban Expansion on the Loss and Fragmentation of Cropland in the Major Grain Production Areas of China

Zifeng Yuan ¹, Liang Zhou ^{1,2,3,4,*}, Dongqi Sun ²  and Fengning Hu ^{1,5}

¹ Faculty of Geomatics, Lanzhou Jiaotong University, Lanzhou 730070, China; 12201868@stu.lzjtu.edu.cn (Z.Y.); 0219746@stu.lzjtu.edu.cn (F.H.)

² Institute of Geographic Sciences and Natural Resources Research, Chinese Academy of Sciences, Beijing 100101, China; sundq@igsnrr.ac.cn

³ Key Laboratory of Urban Land Resources Monitoring and Simulation, Ministry of Natural Resources, Shenzhen 518034, China

⁴ National-Local Joint Engineering Research Center of Technologies and Applications for National Geographic State Monitoring, Lanzhou 730070, China

⁵ Gansu Provincial Engineering Laboratory for National Geographic State Monitoring, Lanzhou 730070, China

* Correspondence: zhouliang@lzjtu.edu.cn

Abstract: The continuous expansion of urban land has led to massive encroachment upon cropland. To examine the impacts of urban expansion on the loss and fragmentation of cropland in China's nine major grain production areas (MGPA), we used standard deviation ellipse, land use transfer matrix, land use dynamic degree, and landscape metric to explore the spatio-temporal evolutions, mutual transfer, and landscape patterns of cropland and urban land. The results show the following: (1) From 1995 to 2018, the areas of cropland in MGPA showed a trend of “short-term increase—long-term decrease—short-term increase”, while that of urban land grew continuously; (2) Urban expansion is the main cause of cropland loss. The cropland area converted to urban land accounts for a large proportion (49.26%) of the total transfer of cropland to other land types, especially in the densely populated, rapidly urbanizing and industrializing Taihu Lake Plain, Jianghuai Region, and Pearl River Delta; (3) In most MGPA, urban expansion has led to fragmentation of cropland, especially in the Pearl River Delta, as indicated by the significant change of patch density. However, in the Sanjiang Plain and Songnen Plain, a less pronounced or even reduced cropland fragmentation was observed due to the significant conversion of other land types to cropland under specific land policies. From these results, we suggest that the government should regulate the encroachment of urban land on cropland and the transfer of natural land to it, and encourage the rural land consolidation to increase the cropland.

Keywords: urban expansion; cropland loss; fragmentation; landscape metric; grain production areas



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1. Introduction

The world has experienced dramatic urbanization in recent decades [1]. According to statistics, the global urbanization rate was 50% in 2009 and is expected to rise to 68% by 2050, and the urban population will grow by more than 2/3, with about 90% occurring in the urban centers of Asia and Africa [2]. According to current trends, the urban population of developing countries is expected to double and the build-up area to triple between 2000 and 2030 [3]. Urban expansion, as the most dramatic form of land use/land cover change, is a visual manifestation of urbanization [4]. While urban expansion creates a built environment for house urban populations and their activities [5], it also has a negative impact on habitat quality [6], ecosystem services [7], regional climate [8], biodiversity [9], and hydrology [10]. Most of the relevant studies focus on exploring the drivers of urban expansion, analyzing the impacts of urban expansion on regional ecology and environmental, and digging the coupling relationship between urban expansion and socio-economic development [11].

Moreover, urban expansion was analyzed at multiple scales include city, region, urban agglomeration [12], province, nation, and global levels. In addition, the study areas are mostly in the developed regions with intense urban expansion and the used data is mainly derived from remote sensing monitoring and interpretation data [13].

Cropland loss is one of the most significant negative impacts of urban expansion in developing countries [14], due to rapid urban expansion that eats up available land in peri-urban and rural areas, forcing farmers living on the urban fringe with large populations to migrate to new places in search of farming space, resulting in a decrease in cropland area [15]. China is the largest developing country and has experienced rapid urban growth over the past 40 years, with increasing population density and economic development levels [16]; however, rapid urban expansion has also resulted in the encroachment of large amounts of prime cropland [17]. In response, the Chinese government has formulated a series of policies and regulations to protect cropland, such as “requisition–compensation balance of cropland”, “return cropland to forest and grassland”, and “dynamic balance of total cropland” [18,19]. However, the loss of cropland is unavoidable, with the proportion of cropland loss due to urban expansion in China reaching 45.96% in 1997–2000 and rising to 55.44% in 2000–2010 [20]. This poses a severe challenge to China, which has a large population and little land, with less than 40% of the world average cropland per capita [3], directly endangering its food security. Therefore, a scientific understanding of the impact of urban expansion on cropland loss under the severe land use situation is of great practical significance and a guide to the reasonable coordination of the contradiction between urban expansion and cropland protection.

Research on the impacts of urban expansion on the spatial pattern of cropland has been a hot topic in sustainable development and livelihoods [21], current research topics can be summarized as follows: (1) The statistical analysis of the amount of change of cropland during urban expansion. Most studies have found that a significant loss of cropland occurs during a rapid urban expansion [22]. Moreover, the loss of cropland during urban expansion demonstrates obvious geographical variations as reported by studies conducted on different regions [23]. Furthermore, from a long-term perspective of cropland loss during urban expansion, some studies also observed the Kuznets curve-like relationship between urbanization ratio and the amount of cropland [24]. (2) The effects of urban expansion on cropland. Urban expansion generally harms cropland, which is reflected in the fact that urban expansion constantly compromises the quantity and quality of cropland, leading to ultimate losses of large amounts of high-quality cropland [25]. However, some research also found urbanization to have a positive effect on cropland under certain population sizes. In addition, from a regional perspective, urban expansion also means the emigration of the rural population to some extent, which in essence, saved the cropland originally designated for construction by lowering the emigrating rural population’s demand for living space per capita [26]. (3) The drivers of cropland changes due to urban expansion. The current research mainly explored how the underlying forces and restrictions of urban expansion influenced cropland change via logistic regression models, spatial regression models, or machine learning methods, while at the same time considering socio-economic and natural-environmental factors, such as regional policy, industry structure, climate, and topography. For example, Liu et al. [27] used artificial neural networks to analyze the dominant factors of cropland change and found that the rapid development of secondary and tertiary industries was the dominant cause of serious cropland loss. Chen et al. [28] used a logistic regression model to spatially identify the factors influencing cropland change and found that location conditions, population growth, and farmer income were the main factors influencing the transfer of cropland.

At present, research on the impacts of urban expansion on cropland is still mainly focused on the ecologically fragile arid and semi-arid areas and the developed eastern coastal regions [29,30]. Furthermore, the scale of the analysis focuses on countries, provinces, and regions, whilst few studies have considered this issue from the perspective of China’s major grain production areas (MGPA, called commodity grain bases in Chinese) [31,32], however,

these areas are the core areas of China's grain production and the key to ensuring its food security. In the country, rapid urbanization has led to increasingly prominent conflicts between the people and land, moreover, the resource constraints and loss of cropland in MGPA have become more dramatic [21]. In this context, it is of great significance to explore the consequences of urban expansion on cropland in MGPA [4,33]. Nevertheless, these areas represent major concentrations of high-quality cropland, which is key to food security. Therefore, it is worthy to research cropland changes in MGPA to explore whether these areas can continue to play their part in ensuring food security. Based on the above objectives, this paper uses standard deviation ellipses to characterize the spatial evolution of cropland and urban land, explores the structural characteristics of land use change and the degree of change in the study area through land use transfer matrix and land use dynamic degree, and finally uses landscape metrics to investigate whether urban expansion has a fragmentation effect on cropland. By the above methods, we explored the evolution of cropland and urban land, occupation of cropland by urban land and impacts of urban land on the fragmentation of cropland, with the intent of understanding the spatiotemporal evolution, effects, and ongoing exchange between cropland and urbanization; furthermore, providing a reference base to guide the rational formulation of cropland protection and regional development policies.

2. Data and Methods

2.1. Study Area

This paper selects MGPA in China as the study area, divided into three grain-based categories (Figure 1). The first category is composed of the original high-yielding areas in the south, including the Taihu Lake Plain, Jiangnan Plain, Poyang Lake Plain, Dongting Lake Plain, Chengdu Plain, and Pearl River Delta, all of which are located in the subtropical zone characterized by superior natural conditions, an extended growing season, and rich farming history. These areas provide grain accounting for more than 60% of all grain production areas in China. The second category is the newly developed area in the Jianghuai Region, located in the southern part of the Huang-Huai-Hai Plain. The area is covered by flat and fertile soil in the transitional area between the warm temperate zone and the subtropics. Although its yield per unit is not high, the produced grain accounts for 20% of the total grain across China. The third category is the northeastern areas, including the Songnen Plain and Sanjiang Plain. These two high-latitude and mechanized grain production areas have a low grain yield per unit area but produce a large total amount, which can provide 20% of commodity grain to China every year. These MGPA are the core regions of China's grain production, and the degree of protection of their cropland resources depends on whether China can ensure food security and effectively guarantee people's well-being, which is of great importance to social stability and economic development.

2.2. Data

The land-use data used in this paper are derived from China's National Land Use and Cover Change dataset [34], which spans 1995–2018 with a spatial resolution of 100 m. The primary classification for the data includes six categories: cropland, forest, grassland, wetland, urban land, and unused land, noting that the secondary classification has 25 types. Since there is no clear vector data that defines the boundaries of MGPA, this paper refers to the distribution map of MGPA consistent with the entries from Baidu's Encyclopedia. Vectors are then added to obtain the final boundaries of MGPA.

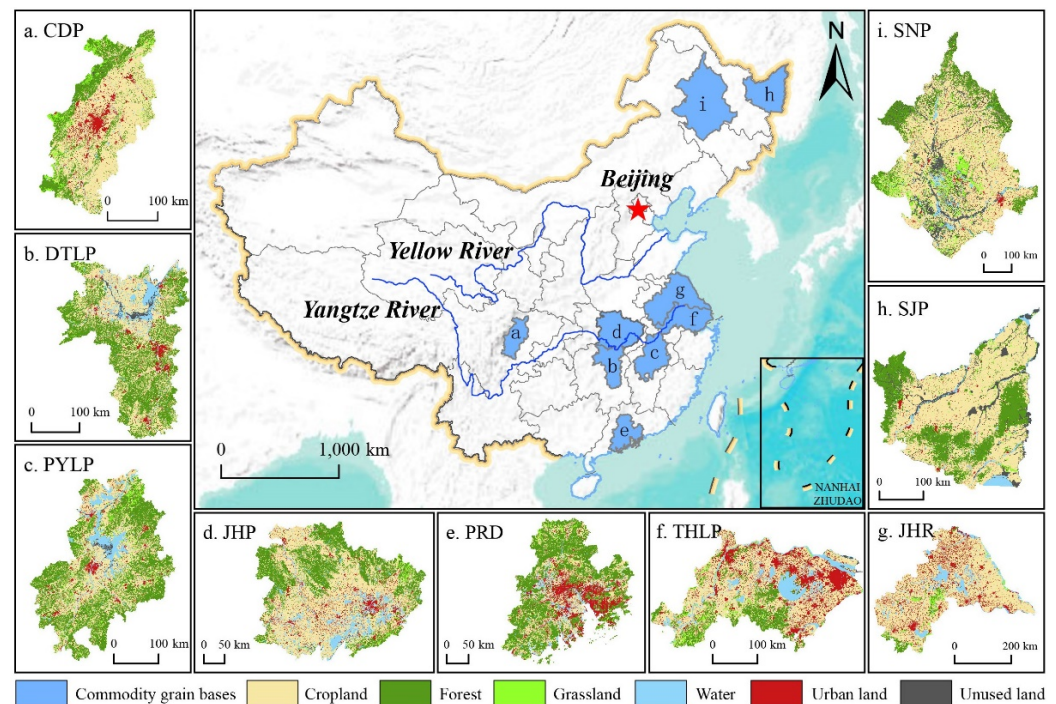


Figure 1. Study area (a–i) denote Chengdu Plain, Dongting Lake Plain, Poyang Lake Plain, Jiangnan Plain, Pearl River Delta, Taihu Lake Plain, Jianghuai Region, Sanjiang Plain, Songnen Plain).

2.3. Methods

2.3.1. Standard Deviation Ellipse

The standard deviation ellipse method can accurately reveal the spatial distribution pattern and evolutionary characteristics of the study object [35]. Its main parameters include the elliptical center of gravity, azimuthal angle, and elliptical long-short axis. The elliptical center of gravity can characterize the center of gravity of geographic elements and their migration trajectory. The azimuthal angle characterizes the main trend direction of their distribution on two-dimensional space. The elliptical long-short axis responds to the form of geographic element distribution. The calculation formulas of the three parameters are as follows:

$$\bar{X} = \sum_{i=1}^n w_i x_i / \sum_{i=1}^n w_i, \bar{Y} = \sum_{i=1}^n w_i y_i / \sum_{i=1}^n w_i \quad (1)$$

$$\tan \alpha = \frac{\left(\sum_{i=1}^n w_i^2 x'^2 - \sum_{i=1}^n w_i^2 y'^2 \right) + \sqrt{\left(\sum_{i=1}^n w_i^2 x'^2 - \sum_{i=1}^n w_i^2 y'^2 \right)^2 + 4 \sum_{i=1}^n w_i^2 x' y'}}{2 \sum_{i=1}^n w_i^2 x' y'} \quad (2)$$

$$\delta_x = \sqrt{\sum_{i=1}^n (w_i x' \cos \alpha - w_i y' \sin \alpha)^2 / \sum_{i=1}^n w_i^2} \quad (3)$$

$$\delta_y = \sqrt{\sum_{i=1}^n (w_i x' \sin \alpha + w_i y' \cos \alpha)^2 / \sum_{i=1}^n w_i^2} \quad (4)$$

where $\bar{X}$ and $\bar{Y}$ are the horizontal and vertical coordinates of the standard deviation for the elliptical center of gravity, respectively; (x_i, y_i) is the spatial location of the geographical element i ; w_i is its corresponding weight; α is the orientation angle, δ_x and δ_y are the standard deviations along the x and y axes, respectively; x' and y' denotes the difference between the coordinates of the center of gravity and those of geographical element.

2.3.2. Land Use Transfer Matrix

The land use transfer matrix can reflect the structural characteristics of land use and the transformational degree and direction among the types, thereby revealing the spatial and temporal evolution process of the land-use pattern. Its mathematical expression is:

$$S_{ij} = \begin{bmatrix} S_{11} & \cdots & S_{1n} \\ \vdots & \ddots & \vdots \\ S_{n1} & \cdots & S_{nn} \end{bmatrix} \quad (5)$$

where S_{ij} is the area of class i transformed into class j ; n is the number of the land-use types; i and j represent the land-use types before and after the transfer, respectively.

2.3.3. Land Use Dynamic Degree

Land use dynamic degree refers to the quantitative change among certain land-use types over a given time interval. This metric is designed to assess the degree of land-use change attributed to the regional land-use transfer component. A positive (negative) value indicates a net increase (decrease) of such land area. The absolute value of land use dynamic degree indicates the degree of change for the particular land-use type change. It follows that the larger the absolute value, the more drastic the change of a particular land-use type.

$$K = \frac{U_b - U_a}{U_a} \times \frac{1}{T} \times 100\% \quad (6)$$

Here, K is the dynamic degree of a certain land-use type during the study period; U_a is the quantity of a certain land-use type at the beginning of the study period, U_b is that which is observed at the end of the study period; T is the length of the study period, and when the period of T is set to year, K is the annual rate of change of a certain land-use type in the study area.

2.3.4. Landscape Metrics

Landscape metrics are commonly used to portray the regional landscape pattern, and the analytical scales are divided into patch level, type level, and landscape level. In this paper, the metrics of patch density (PD), edge density (ED), aggregation index (AI), and Area-weighted Mean Euclidean Nearest-Neighbor Distance (ENN_AM) are evaluated to characterize the connectivity, heterogeneity, and fragmentation of the study area (Table 1).

Table 1. Explanation of landscape metrics.

Landscape Metric	Scale	Formulas and Parameter Meanings
PD	Class	$PD = NP / A$ NP is the total number of patches in the landscape, A is the total landscape area.
ED	Class	$ED = E / A$ E is the total length of the edge in landscape involving patch class i , A is the total landscape area.
AI	Class	$AI = \left[\frac{g_{ij}}{\max(g_{ij})} \right] \times 100$ g_{ij} is the number of like adjacencies between pixels of patch class i , based on the single-count method, $\max(g_{ij})$ is the maximum number of g_{ij} .
ENN_AM	Class	$ENN_AM = \frac{\sum_{j=1}^n h_{ij} a_{ij}}{\sum_{j=1}^n a_{ij}}$ h_{ij} is the distance (m) from patch ij to nearest neighboring patch of the same type, based on patch edge-to-edge distance, computed from cell center to cell center.

3. Results

3.1. Evolution of Cropland and Urban Land

3.1.1. Temporal Evolution of Cropland and Urban Land

MGPAs are the core areas of grain production in China. Their overall land-use types from 1995 to 2018 are dominated by cropland and forest, with an average area share of 50.03% and 26.96%, respectively. In comparison, the urban land occupies an average area share of 6.19% (Figure 2a). Cropland shows a recent fluctuating trend of “short-term increase—long-term decrease—short-term increase” where the area first increased by 4712.33 km² from 1995 to 2000, then decreased by 6365.70 km² during 2000–2015, before it finally increased again by 3954.56 km² in the nearly four years spanning, 2015–2018 (Figure 2b). In terms of the rate of change, we observed the smallest absolute dynamic degree occurred from 2010 to 2015, indicating that cropland changed most gently during this period, while the largest change occurred from 2015 to 2018, which implies a dramatic degree of change in cropland during this period (Table 2). Urban land, on the other hand, is dominated by rapid expansion, growing from 42,831.27 km² in 1995 to 68,858.29 km² in 2018, with its area share increasing from 4.96% to 7.96%, representing a 161% increase. The average annual growth of urban land from 1995 to 2000 was 306.53 km², while the average annual growth from 2015 to 2018 was 2790.49 km², 9.1 times more rapid than in 1995–2000. The land use dynamic degree for urban land increased steeply during 2000–2015 and 2015–2018, indicating accelerated growth in urban land (Table 2).

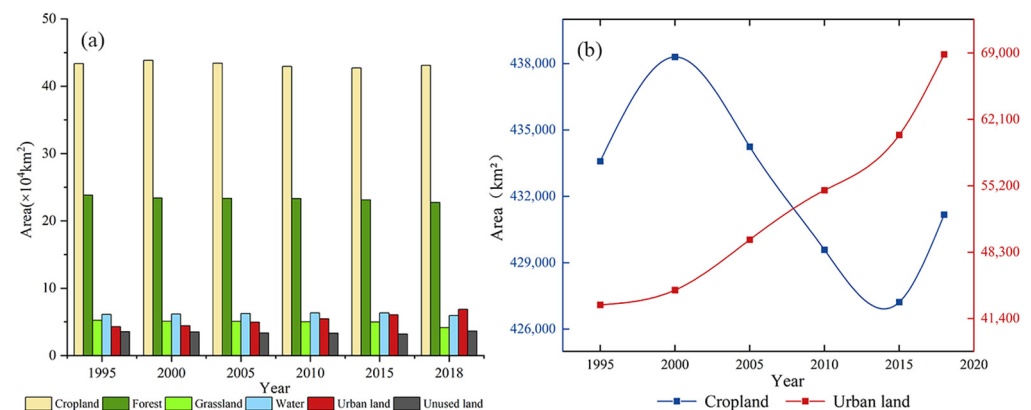


Figure 2. (a) Area of land-use types at the entire level; (b) Area of cropland and urban land, 1995–2018.

Table 2. Land use dynamic degree at the individual level.

Study Area	Per Area/%		Time Period	All Areas/%	
	Cropland	Urban Land		Cropland	Urban Land
CDP	−0.26	4.50	1995–2000	0.22	0.72
DTLP	−0.17	5.07			
PYLP	−0.14	3.55			
JHP	−0.31	2.74	2000–2005	−0.18	2.36
PRD	−0.60	3.75			
THLP	−0.75	4.60			
JHR	−0.29	1.57	2005–2010	−0.21	2.08
SJP	0.93	0.93			
SNP	0.44	0.93			
Overall	−0.02	2.64	2015–2018	0.31	4.61

Changes in cropland and urban land significantly varied across MGPAs. Most areas show a continuous decline in cropland and an increasing trend in urban land, while the Sanjiang Plain and Songnen Plain show a simultaneous growth trend for both cropland and urban land (Figure 3). Specifically, the cropland in the Songnen Plain increased

from 102,447.89 km² to 112,826.43 km², and its urban land increased from 6339.37 km² to 7697.81 km², representing growth rates of 10.13% and 21.42%, respectively; cropland in the Sanjiang Plain increased from 42,887.78 km² to 52,026.87 km², and urban land increased from 1579.68 km² to 1917.14 km², representing growth rates of 21.31% and 21.36%, respectively. In terms of the land use dynamic degree at the individual level, the largest absolute land use dynamic degree of cropland occurred in the Sanjiang Plain, indicating that cropland in this area has experienced the most dramatic changes relative to the other eight grain production areas during 1995–2018, while the smallest changes occurred in the Poyang Lake Plain, indicating that it has changed the least in MGPA (Table 2). The largest absolute value of land use dynamic degree for urban land occurred in Dongting Lake Plain, indicating the most dramatic urban land changes. In contrast, the smallest change occurred in the Songnen Plain and Sanjiang Plain, implying relatively minimal urban land changes during 1995–2018. The early appearance of the intersection of urban land and cropland areas in the Pearl River Delta, Taihu Plain, Chengdu Plain, and Jiangnan Plain is consistent with the rapid urbanization in these areas.

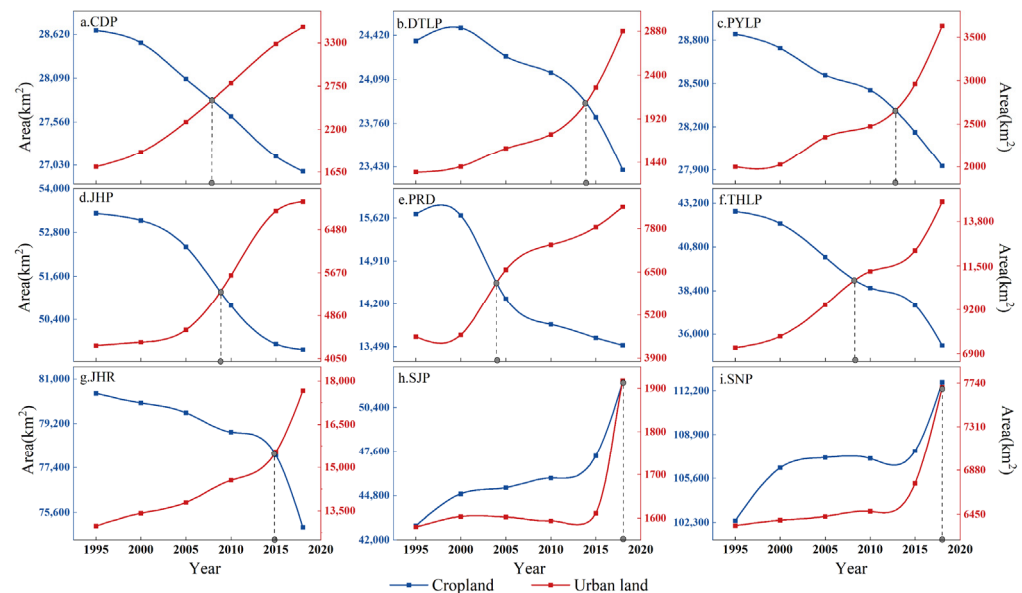


Figure 3. Land-use type change at the individual level, 1995–2018.

3.1.2. Spatial Evolution of Cropland and Urban Land

The standard deviation ellipses of cropland and urban land in MGPA are presented in Figures 4 and 5, from which we can infer the concentration and directional trends between the two land-use types. These parameters are reflected by the direction of movement of the point indicating the center of gravity and the change in the ellipse area for the concentration. From 1995 to 2018, the spatial evolution characteristics of both cropland and urban land varied across the grain production areas (Table 3). Specifically, the ellipse of cropland in the Taihu Lake Plain, Jianghuai Region, and Songnen Plain shows an expansion trend, while the remaining areas show a contraction trend (Figure 4). The cropland expansion in the Songnen Plain is the most dramatic, with the ellipse area increasing by 27,614 km² (5.2 times that of the Jianghuai Region and 2.5 times that of the Taihu Lake Plain), whose center of gravity coordinates moved mainly in a southeasterly direction. The ellipse of cropland in the Chengdu Plain shows the most significant contraction trend, with its standard deviation ellipse decreasing from 27,167 km² to 25,677 km², with a spatial growth rate of −5.48%, along with its center of gravity shifting slightly in the northeastern direction.

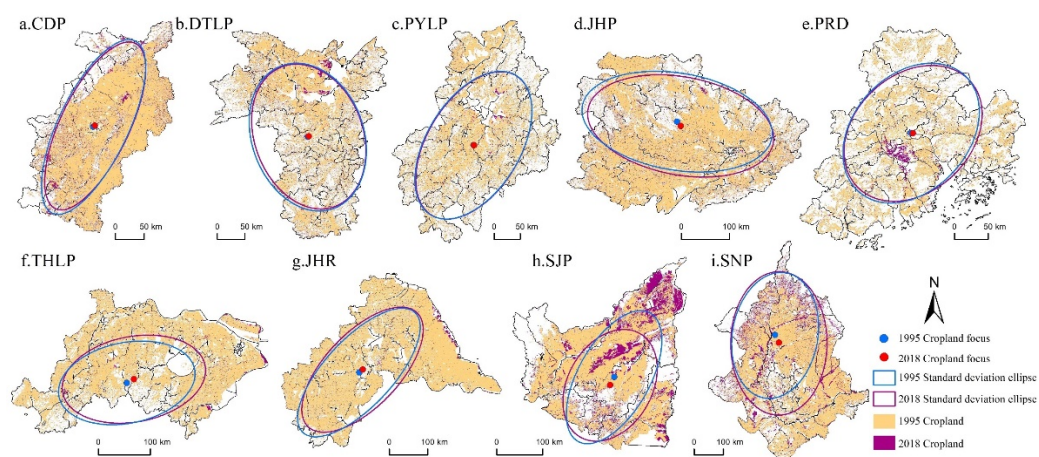


Figure 4. Standard deviation ellipses of cropland, 1995–2018.

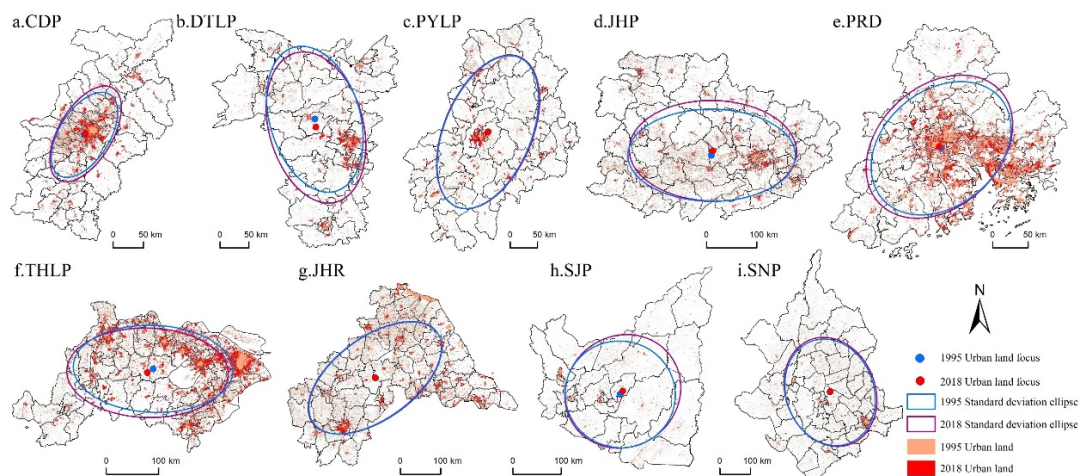


Figure 5. Standard deviation ellipses of urban land, 1995–2018.

Table 3. Variation in the standard deviation ellipse for cropland and urban land.

Study Area	Year	Cropland			Urban Land		
		Scope/km ²	Growth Rate/%	Direction	Scope/km ²	Growth Rate/%	Direction
CDP	1995	27,167	−5.48	North–East	8913	19.52	North–East
	2018	25,677			10,653		
DTLP	1995	38,613	−4.92	North–East	27,857	7.89	South–East
	2018	36,712			30,028		
PYLP	1995	44,289	−0.85	South–East	36,976	2.20	North–East
	2018	43,912			37,791		
JHP	1995	54,139	−0.88	South–East	40,920	8.96	North–East
	2018	53,661			44,588		
PRD	1995	28,819	−0.67	South–East	25,755	11.90	North–West
	2018	28,625			28,820		
THLP	1995	32,485	10.87	North–East	39,805	4.06	South–West
	2018	36,016			41,422		
JHR	1995	59,085	5.28	North–East	60,525	0.14	South–West
	2018	62,203			60,611		
SJP	1995	38,961	4.56	South–West	39,346	11.71	North–East
	2018	37,185			43,954		
SNP	1995	100,597	27.45	South–East	80,381	4.89	North–East
	2018	128,211			84,309		

All standard deviation ellipses for urban land show an expanding spatial trend, with their centers of gravity shifting in various directions (Figure 5; Table 3). The standard deviation ellipse of the Chengdu Plain changed the most during the study period, increasing from 8913 km² in 1995 to 10,653 km² in 2018, with an average annual increase of 76 km² and a spatial expansion rate of 19.52%. Its center of gravity coordinates shifted in a northeasterly direction. In contrast, the area of the standard deviation ellipse in the Jianghuai Region changed the least, with a spatial growth rate of only 0.14%, and its area grew slowly from 60,525 km² to 60,611 km², with its center of gravity moving slightly in a southwesterly direction.

3.2. Occupation of Cropland by Urban Land

3.2.1. Occupation of Cropland by Urban Land at the Entire Level

To explore the occupation of cropland by urban land, the land use transfer matrix was used to analyze the specific flows between cropland and urban land. The period of 1995–2018 saw dramatic changes in the partitioning between cropland and urban land in MGPA, with the total outward change in cropland during this study period of 57,503.87 km², which was mainly transformed into urban land (Figure 6). The associated transfer area was 28,328.35 km², accounting for 49.26% of the total change in cropland. The total change in urban land was 9152.66 km², with urban land mainly transformed into cropland, with a transferred area of 7153.99 km², accounting for 78.16% of the total change in urban land. In terms of the individual periods, cropland shifted mainly to urban land in all periods from 1995 to 2018. The conversion of cropland to urban land accounted for the largest proportion (72.70%) of the total outward change in cropland in 2010–2015, and the smallest proportion occurred in 1995–2000 (also significant at 39.35%), indicating that in all time periods urban land has substantially encroached upon cropland.

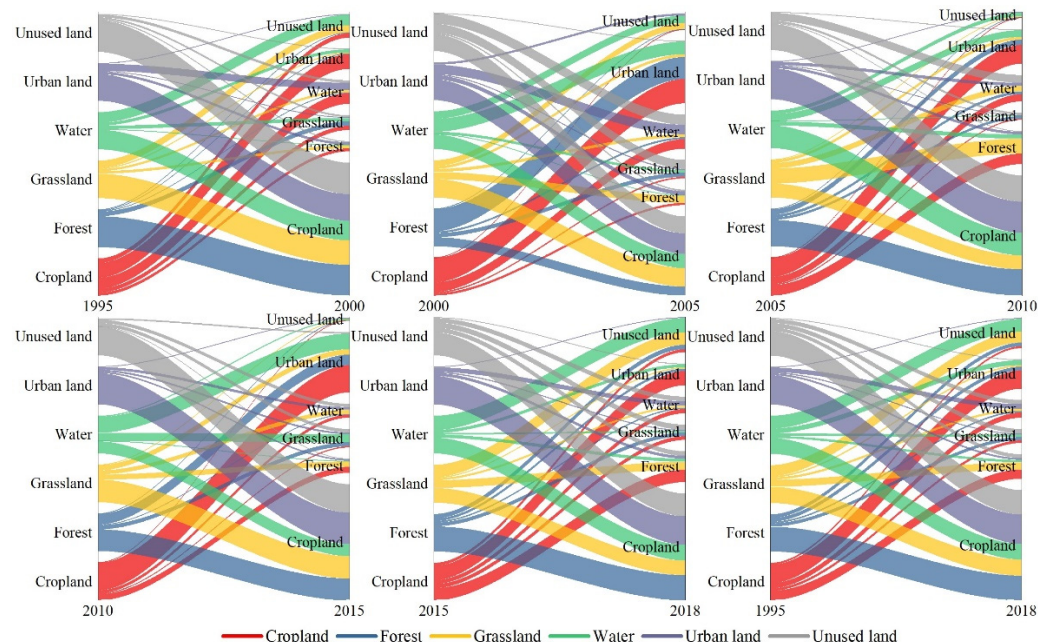


Figure 6. Land-use transfer at the entire level, 1995–2018.

3.2.2. Occupation of Cropland by Urban Land at the Individual Level

Great changes have also taken place between cropland and urban land in individual grain production areas (Figure 7). Among these areas, only the land-use conversion of Sanjiang Plain was dominated by forest to other types from 1995 to 2018, with a total outward change of 6979.32 km², while the rest of the land-use conversion in MGPA was dominated by cropland. Especially notable was the cropland conversion into urban land in the Jianghuai Region and Taihu Lake Plain, which accounted for a total outward change of

cropland of 81.82% and 83.13%, respectively. This indicates that the cropland in these two regions was subjected to the largest encroachment of urban land in 1995–2018. Significant outward changes of cropland also occurred in the Pearl River Delta, Chengdu Plain, and Jiangnan Plain, accounting for 67.29%, 46.88%, and 39.88%, respectively. The same trend was also observed, but to a lesser extent, in the Sanjiang Plain, Dongting Lake Plain, and Songnen Plain, whose transfer ratios were 20.85%, 25.59%, and 28.62%, respectively. Even the Sanjiang Plain, which has the smallest proportion of cropland encroached upon by urban land, reaches nearly a quarter of the total change in cropland. In general, encroachment of cropland by urban land contributes significantly to the loss of urban land within each of MGPA.

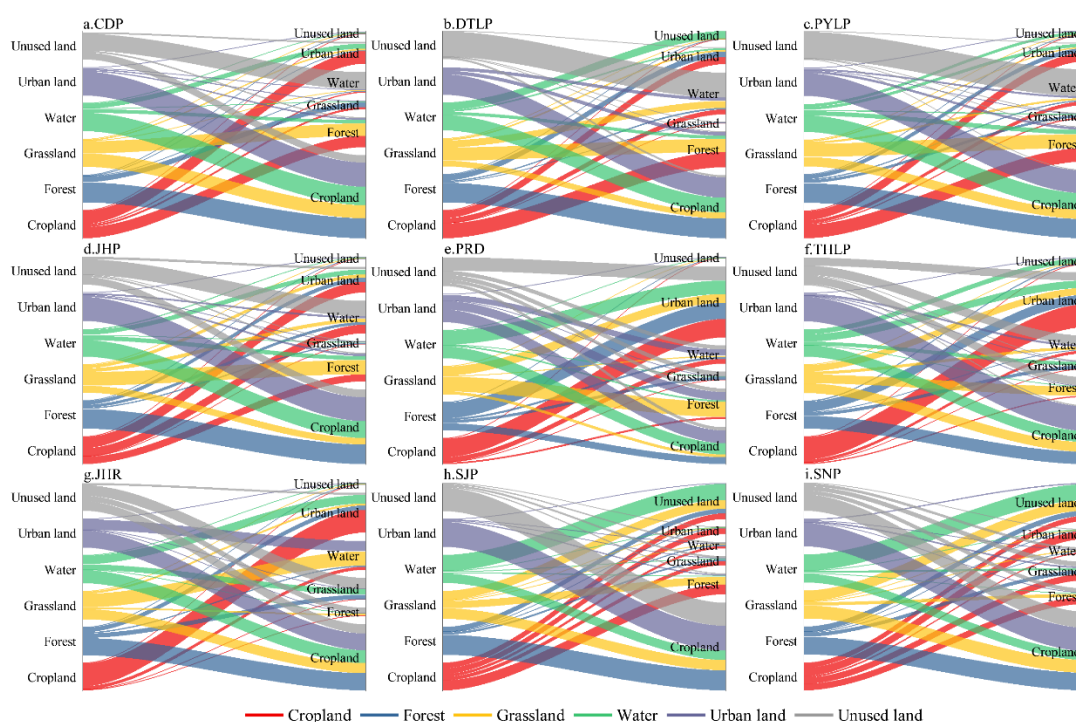


Figure 7. Land-use transfer at the individual level, 1995–2018.

3.3. Impacts of Urban Land on Cropland Fragmentation

Analysis of the landscape metrics of cropland and urban land in different grain production areas reveals that only the patch density (PD) of cropland in the Sanjiang Plain and Songnen Plain showed a decreasing trend. In contrast, the rest showed an increasing trend, indicating that patches in most grain production areas are fragmented (Figure 8). The level of agglomeration is generally low, while the agglomeration of cropland in the Sanjiang Plain and the Songnen Plain is increasing. In terms of edge density (ED), only the ED of cropland in the Pearl River Delta shows a decreasing trend, while the remainder of the grain production areas shows an increasing trend. The ED of urban land as a whole shows an increasing trend, indicating that the shape of urban land in MGPA is becoming more irregular as the complexity of the shape of cropland in the Pearl River Delta decreases. The CLUMPY metric of cropland in the Sanjiang Plain, Songnen Plain, Pearl River Delta Plain, Poyang Lake Plain, and Dongting Lake Plain show a decreasing trend, while the others show an increasing trend. In terms of the AI metrics, the cropland in the Sanjiang Plain and the Songnen Plain show an increasing trend, while the others are decreasing. This indicates that the degree of aggregation of cropland patches in these two regions has increased slightly. In contrast, fragmentation of cropland patches in the remaining seven grain production areas represents the dominant trend. The cropland in the Taihu Lake Plain and the Pearl River Delta is declining at the fastest rate. The AI metrics of urban land, as a whole, show an obvious increasing trend, indicating a significant increase in the

degree of aggregation of urban land. In terms of ENN_AM, the cropland in the Sanjiang Plain rose sharply from 1995 to 2000, before exhibiting a continuous decline, indicating that the fragmentation of cropland in the Sanjiang Plain was significant before 2000 and that aggregation increased rapidly after 2000. In contrast, the Pearl River Delta has maintained high values, indicating that cropland in this region has been in a consistent, high state of aggregation. The ENN_AM values for urban land have shown a decreasing trend over time, with the largest values in the Sanjiang and Songnen Plains, indicating the highest fragmentation of urban land in these two areas.

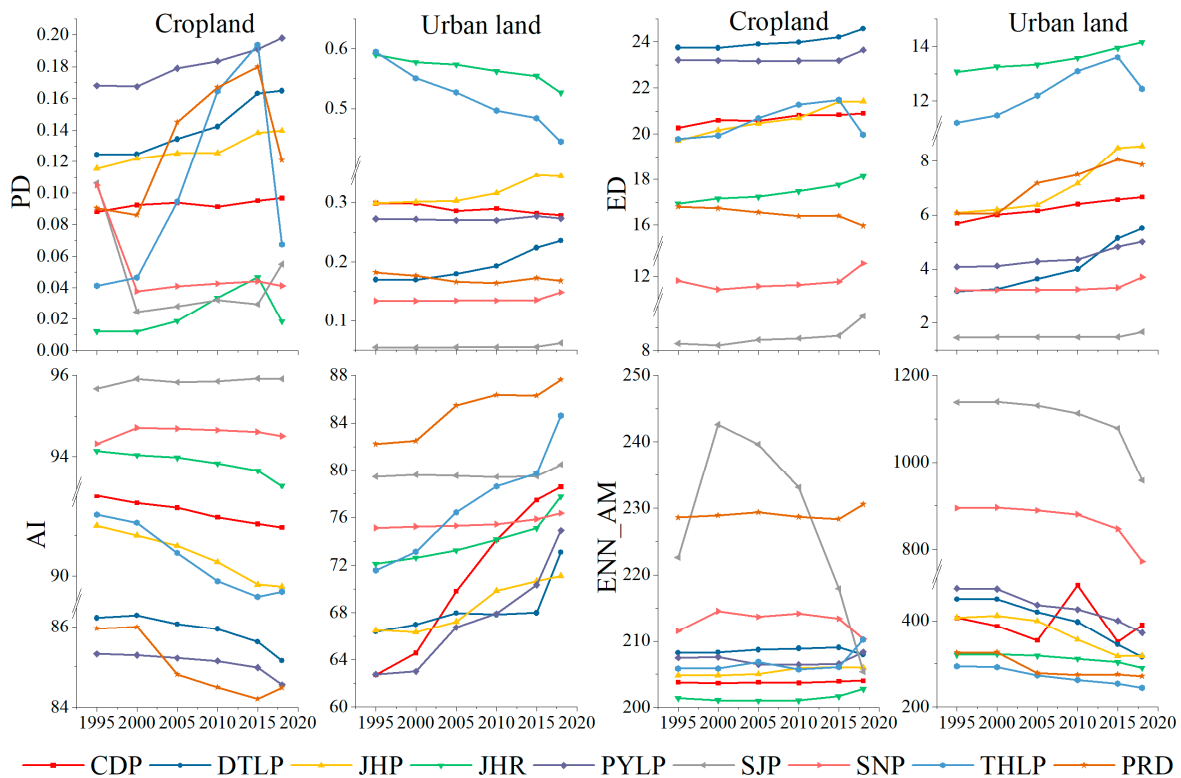


Figure 8. Changes in landscape metrics of cropland and urban land at class level, 1995–2018.

4. Discussion

This paper explores the occupation of cropland and its fragmentation effects by urban expansion in MGPA in terms of its spatiotemporal evolution characteristics, interconversion relationships with urban lands, and landscape patterns. The results show that the degree of interconversion between cropland and urban land, from 1995 to 2018, is dramatic in the study area at entire and individual levels, indicating that cropland is encroached upon by urban land at large extents. Specifically, rapid urban expansion has led to a significant decline in cropland area within some grain production areas, including the Pearl River Delta, the Taihu Lake Plain, the Jianghuai region, with the conversion of cropland to urban land accounting for 67.29%, 83.13%, and 81.82% of the total outward transfer area of cropland, respectively. The occupation has also led to varying degrees of fragmentation of cropland, most dramatically in the Pearl River Delta. These results answer our research question that some of MGPA in China, especially in regions where high urbanization has occurred (the Pearl River Delta, the Taihu Lake Plain, the Jianghuai region) have lost their original function as MGPA and can hardly provide a stable food supply and thus food security anymore.

The Pearl River Delta, the Taihu Lake Plain, and the Jianghuai region were formerly important grain production areas nationwide, but now their status is gradually declining or even disappearing. The main reasons for this can be divided into two points. First, rapid

urbanization has led to the continuous expansion of urban land and the massive occupation of cropland, resulting in a sharp decrease in the area of cropland. Although significant attention has been given by the central government of China on cropland protection and a series of policies and regulations such as “cropland protection”, “rural land consolidation and economical and intensive land use”, “requisition–compensation balance of cropland”, and “land acquisition” have been formulated [36–39], these policies usually yielded to local government’s pursuit of economic growth. Even these policies have been implemented effectively in some areas, the amount of cropland also hardly increase, given the gaps in the land price and revenue between cropland and urban land. Specially, the increase of cropland mostly occurred in rural areas via occupying natural lands and consolidating existing rural settlements from a spatial points, which have become a compension of cropland occupation by urban expansion in suburb areas to maintain the total amount of cropland. In addition, unreasonable planning and artificial abandonment by some local governments have also caused a large amount of cropland to be left idle and wasted. Second, agricultural industry restructuring, referring to the adjustment of the ratio of land between the agricultural industry, forestry, animal husbandry and fishery, etc, leads to the reduction of food sown area. The formation and changes are subject to a variety of factors, mainly: (1) natural conditions; (2) historical production habits and living habits of the residents; (3) the state of productivity; and (4) social demand for agricultural products. The internal adjustment of agricultural structures in the Pearl River Delta, Taihu Lake Plain and Jianghuai region, and the conversion of some cropland to flowers and vegetables, has led to a continuous reduction of food sown area. In order to curb the continuous expansion of urban land, and ensure food security in China, it is important to promote an intensive transformation of land-use patterns. The macro-control of land policies should resolutely suppress unreasonable demand for urban land and achieve the requirements for sustainable development goals, thus alleviating the dichotomy between urban expansion and cropland protection [40].

Except for the Sanjiang Plain and Songnen Plain in the north, most grain production areas show an obvious decreasing trend in the amount of cropland in addition to enhanced fragmentation, since the cropland replacement policy has led to new patches of cropland in some marginal areas, increasing their overall fragmentation of cropland. It is worth noting that the Sanjiang Plain and the Songnen Plain in the northeast do not show a significant fragmentation trend, but rather a slight agglomeration (in terms of aggregation index), which is due to the strict implementation of the policy of cropland reallocation. This policy has increased the amount of cropland, but at the expense of the ecosystem service value of other encroached natural ecological lands, and the yield of newly reclaimed cropland may not reach the original level. Although the overall food security is maintained, it is unsustainable from the environmental dimension and its ecological impact cannot be ignored.

There are still limitations in this paper, which are worthy of further study. First, this paper considers the impacts of urban expansion on cropland only in terms of quantity and fragmentation, which is not comprehensive enough. Second, due to the lack of clear vector boundaries of the MGPA, this paper manually vectorizes the images in Baidu’s Encyclopedia and obtains the study area boundaries composed by clustering counties, this operation will make the boundary range deviate from the actual range, but it does not affect the subsequent result analysis. Future investigations can use multi-source geospatial data, such as nighttime lights, topography, population, etc., to consider the impacts of urban expansion on cropland in a comprehensive manner in terms of socio-economic, natural conditions and policy implications. In addition, we can simulate the land use changes of the MGPA in the future through multiple scenarios to explore the impacts of urban expansion on cropland to different degrees under different scenarios, to find the optimal scenario that can balance economic development and cropland protection, and to provide effective reference for rational regional planning.

5. Conclusions

In the context of rapid urbanization, the diversification between cropland and urban land is intensifying, and food security is facing great challenges. In light of this, sustaining MGPA remains a top priority for ensuring food security in China. Based on the land-use data of six periods from 1995 to 2018, this study explored the spatial and temporal evolution of cropland and urban landscapes in MGPA. The findings are as follows.

(1) During 1995–2018, both cropland and urban land areas of MGPA in China changed dramatically but in very different ways. The overall cropland area in the study area increased by 1.09% between 1995 and 2000, decreased by 2.53% from 2000 to 2015, and increased by 0.93% from 2015 to 2018, showing an overall trend of “short-term increase—long-term decrease—short-term increase”, while the change in the area of urban land shows continuous growth, increasing by 60.77% over the study period. The amount of cropland in the study area declined most rapidly from 2000 to 2015, with an overall decrease of 2.53%. Among the areas, the Chengdu Plain saw a decrease in cropland of 1713.46 km² and an increase in urban land of 1780.02 km², making it the most dramatic area for change throughout the period.

(2) Urban expansion is the main cause of cropland loss, and the mutual transfer of cropland and urban land occupies the largest component of the outward transfer for these land-use types. The area of cropland converted to urban land accounts for 49.26% of the total change in cropland. Across the grain production areas, all areas are dominated by the transfer of cropland. The most significant changes occurred in the Taihu Lake Plain and Jianghuai Region, where the cropland area converted to urban land accounts for up to 83.13% and 81.82% of the total cropland change, the Pearl River Delta also reached 67.29%.

(3) In most grain production areas, urban expansion has led to fragmentation of cropland, among which the fragmentation of cropland in the Pearl River Delta is the most significant. The cropland in all MGPA except the Sanjiang Plain and Songnen Plain was agglomerated, indicating that the substantial conversion of other land types to cropland due to some cropland policies has alleviated the impact of urban expansion to some extent, leading to a less pronounced or even decreasing fragmentation of cropland.

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