Does Block Size Matter?

The Impact of Urban Design on Economic Vitality for Chinese Cities

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0 The publication in EPB

Article

Does block size matter? The impact of urban design on economic vitality for Chinese cities

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1   Introduction

Pioneering urbanists like Jacobs (1961) and Lefebvre (1962) were the among the first to specify the features of good urban design (e.g. small blocks) and how it cultivates community, sociocultural vibrancy, and healthy neighborhoods. Other influential urbanists such as Gehl (1971), Lynch (1981), Whyte (1980), Montgomery (1998) also established new ground on ways to understand urban vibrancy.

Economic vitality

1 **Economic vitality**

1 Social vitality

1 Ecological vitality

- **Our literature review shows that while urban form indicators have been widely analyzed, there have only been a handful of studies that look at the impact of urban design on urban or economic vitality through quantitative analysis.**

- **We assume economic vitality is a dimension of urban vitality in this study, which focuses more on economic vitality rather than the broad urban vitality.**
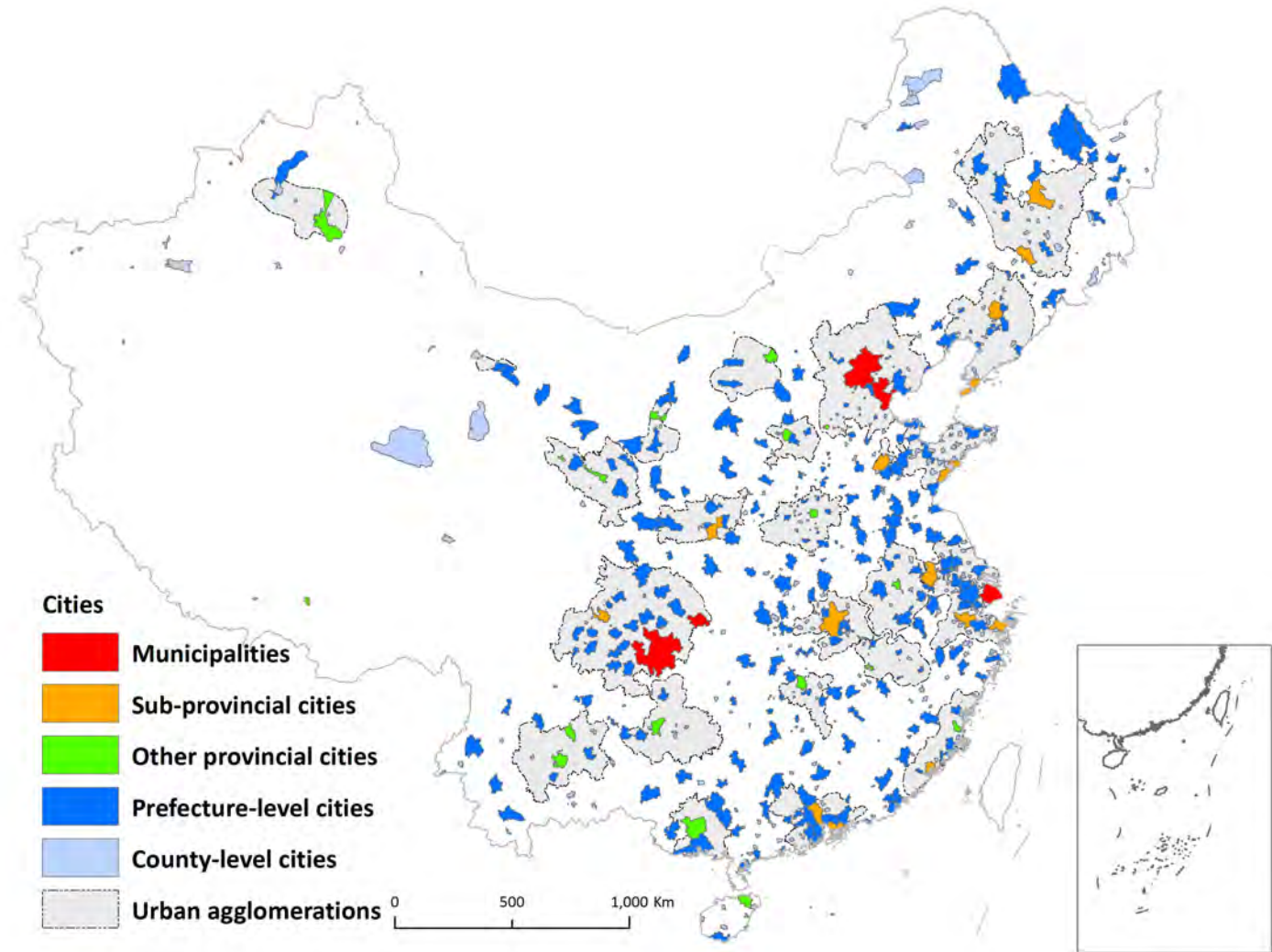
1 **Research questions of this study**

- **Do urban design principles positively associate with vibrant cities in terms of economy?**
  - **How much is a variable such as intersection density correlating with economic vitality compared to other factors?**
- **Does this relationship vary across cities of different administrative levels?**
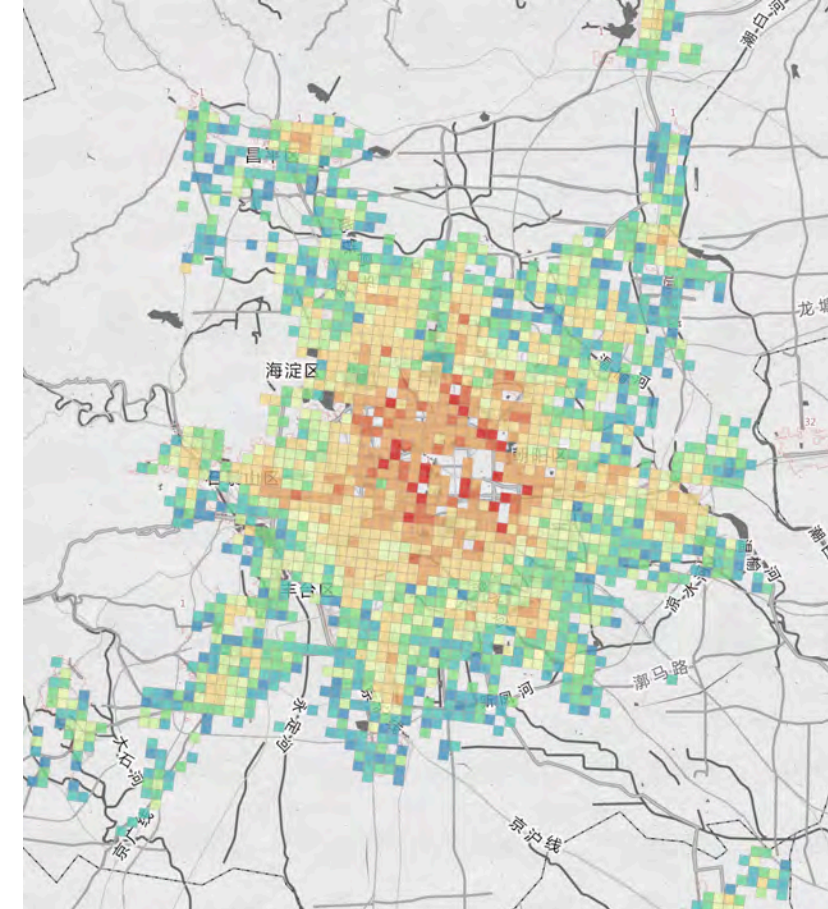
2 Study area and Data

- **Five categories of cities ranging from municipalities to county-level cities**

- **The city proper of all cities as the study as the study area of the study**
  - **The administrative boundary**
  - **市辖区**

Cities

🟥	**Municipalities**
🟧	**Sub-provincial cities**
🟩	**Other provincial cities**
🟦	**Prefecture-level cities**
🟦	**County-level cities**
⬜	**Urban agglomerations**

0   500   1,000 Km

Observing economic (consuming) vitality and its impact factors at the 1km-grid level

- **Considering data availability and computation load, we regard the 1km by 1km grid as the analysis unit in the study.**

- **In China, there were a total of 63,425 km² of urban areas in 2010. We categorize any grid that has more than 0.5 km² of urban land areas as an urban grid**

- **There are 43,646 urban grids in total within administrative areas of Chinese cities**

- **According to three Ds (density, diversity and design) proposed by Bernick and Cervero (1996) and 5 Ds (density, diversity, design, distance to transit and destination accessibility) proposed by Belzer and Autler (2002), we select impact factors contributing to economic vitality for all urban grids**

- **Sina Weibos and housing prices as auxiliary data to represent urban vitality in other dimensions**

| Main Type	Name	Description	Data Source
Vitality	DIANPING	Dianping comments for each square kilometer grid in 2014 (#/ha)	http://www.dianping.com, and used by Long (2016)
	WEIBO	Weibo count of each square kilometer grid in 2014 (#/ha)	http://www.weibo.com
	HOUSING_PRICE	Average housing price for each square kilometer grid in 2014 (CNY)	http://www.Soufun.com
Design	INTERSECTION	Number of intersections for each square kilometer grid in 2014 (#/ha)	Long (2016)
Density	POI_DENSITY	POI (point of interest) count of each square kilometer grid in 2014 (#/km²)	Long (2016)
	POP_DENSITY	Population count of each grid derived from the township level population density of China in 2010 (#/km)	Long et al (2015)
Diversity	MIXED-USE	Mixed-use level determined per grid from data in 2014	Long (2016) using the method in Liu and Long (2016)
Amenities	AMENITIES	The total number of bus stops, education and research facilities, governmental facilities and convenient stores in each square kilometer grid in 2014 (#/km²)	Derived from POIs in 2014, see Long (2016)
Access to Transit	ACCESSIBILITY	The average air distance to the closest city center, sub-center, green space, shopping center, hospital, and subway and HSR station in 2014 (km)	Derived from POIs in 2014 using Spatial Analyst of ArcGIS, see Long (2016)
City level control variables	GDP	GDP per capita of the city in 2014 (CNY)	MOHURD (2015)
	TERTIARY	Percentage of GDP that the tertiary sector accounted for in 2014	
	INCOME	Average income of each person in the city in 2014	
	CITY_LEVEL	The administrative level of the city in 2014 (5 for the metropolitan cities and 2 for the prefectural cities)	See details in Section 3.1

2 **Consuming vitality**

- **DIANPING represents Dazhong Dianping, an aggregated social media tool used to rate restaurant and other service industry companies in China**

- **China's Yelp!**

Consuming vitality

- **Collect 13 million POIs, 1.9 m POIs with at least one user comment, and 47 million comments for all POIs in 2014**

- **Aggregate the fine-grained POIs to urban grids**

- **The Dianping data not representative for county-level cities since the smallest cities do not always have enough Dianping users, hence we do not analyze county-level cities**

- **Only include urban grids with at least one user comment, and remove the top 1% of geographic units that contain the most comments to avoid outliers**

- **24,512 urban grids used in the further analysis**
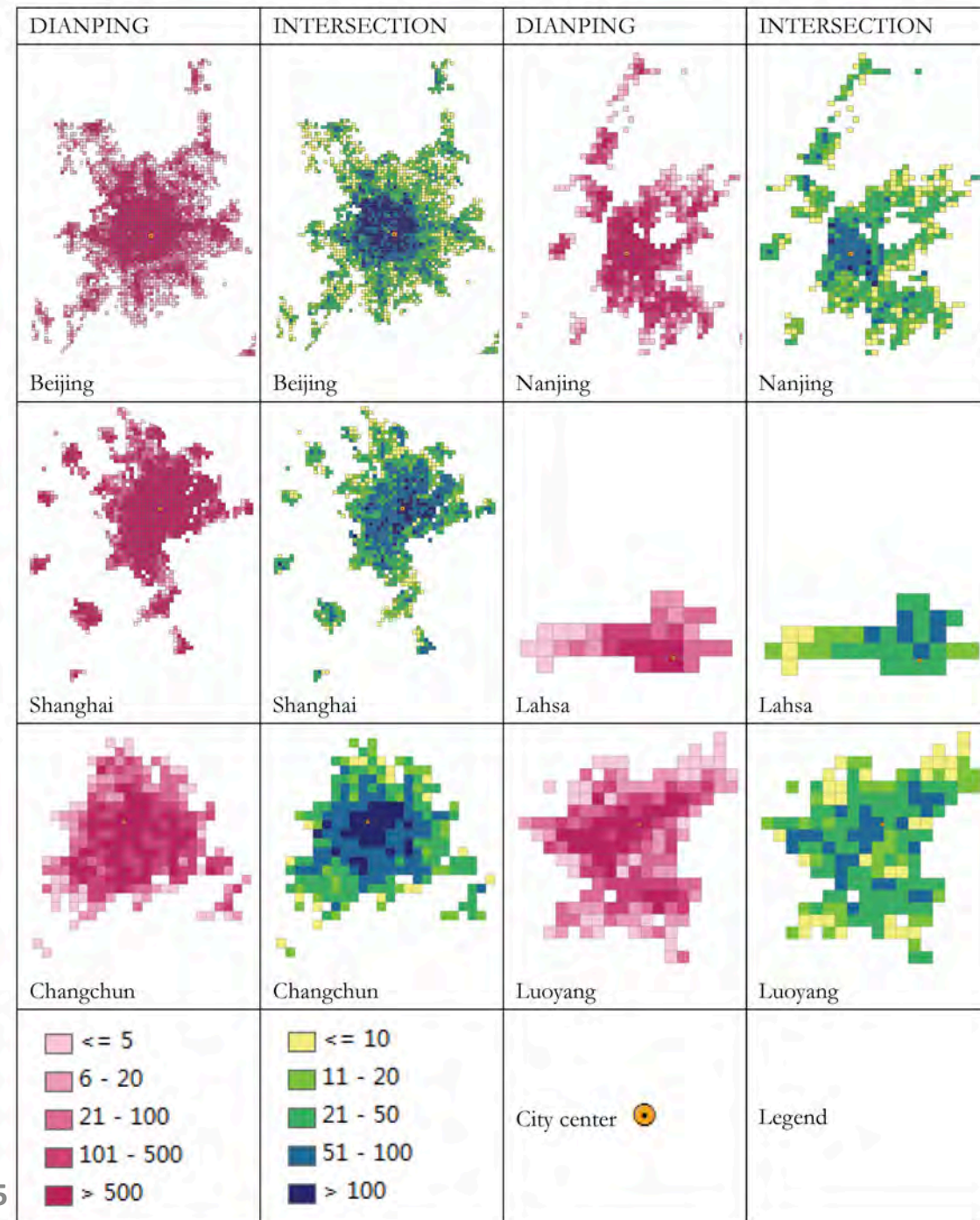
Road intersection density representing block size

- # road intersections for each urban block to represent urban design in the spatial dimension

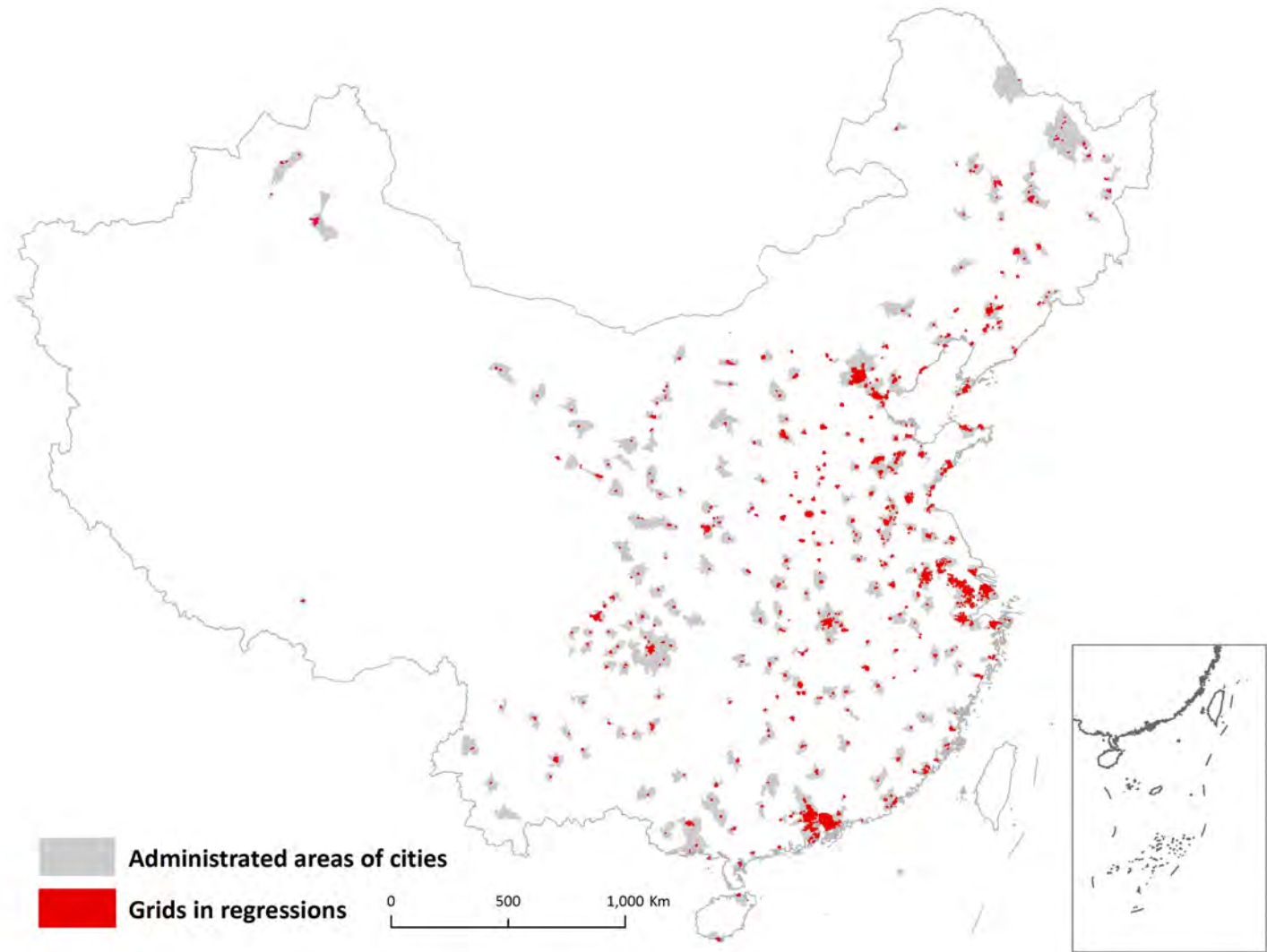- The Impact of "Urban Design" on Economic Vitality for Chinese Cities
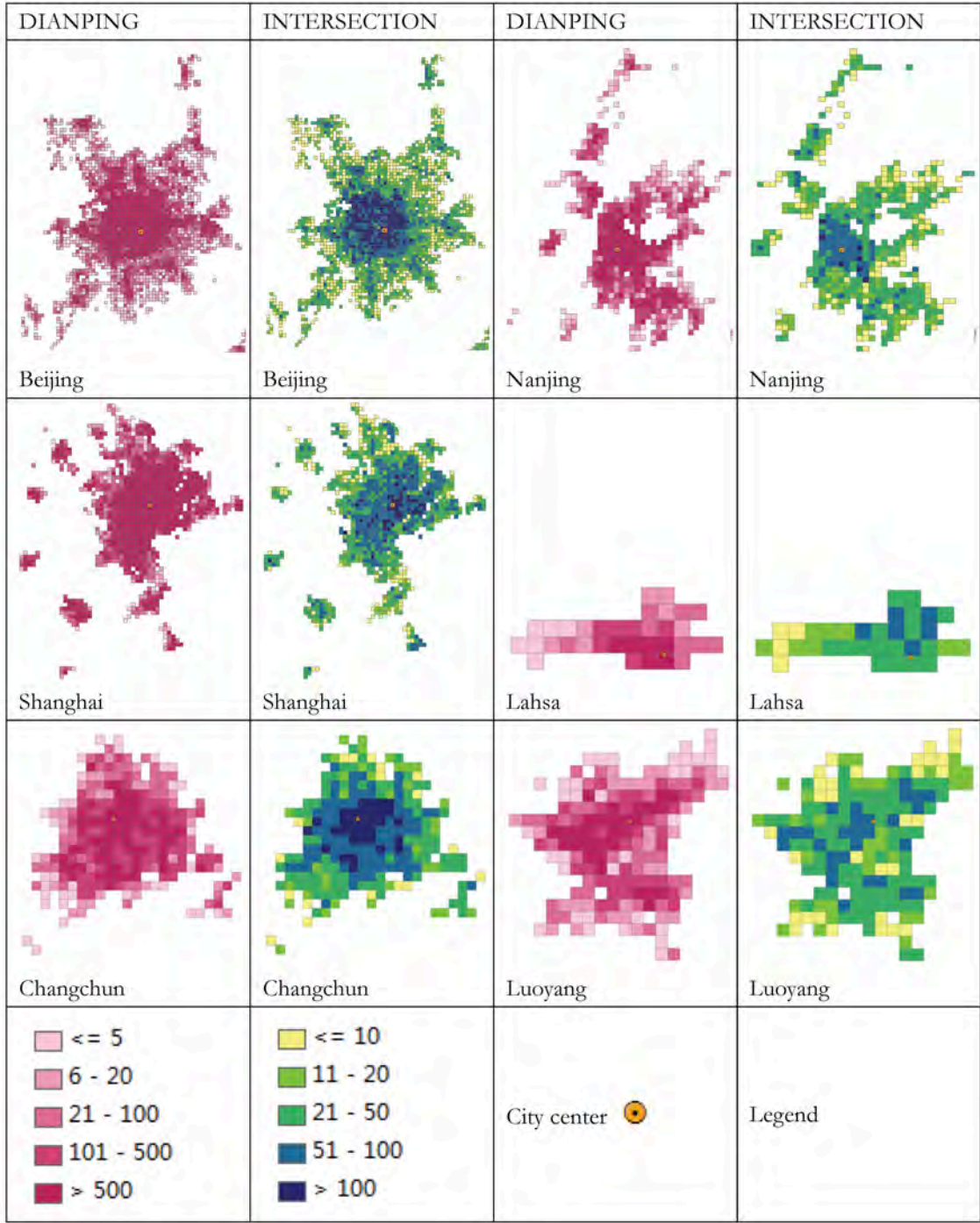
24,512 urban grids in the further analysis

- **After this process of improving data quality, of all of the geographic units we aggregated, there were 24,512 urban geographical units in Tier 1, Tier 2, Tier 3, and Tier 4 cities that met the requirements outlined above.**

- **These 24,512 geographic units are the final units used in this analysis.**

Administrated areas of cities

Grids in regressions

0   500   1,000 Km

More details about the data used in the study
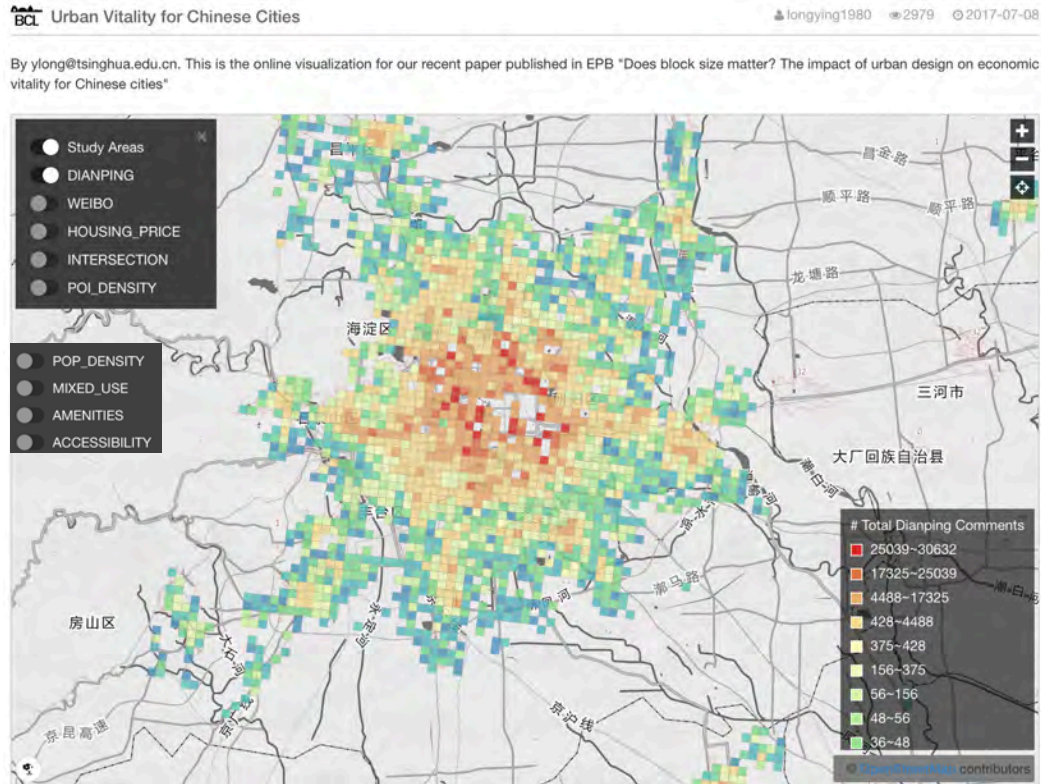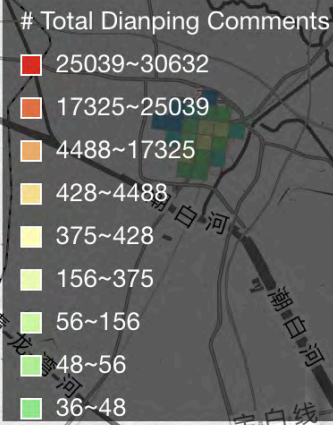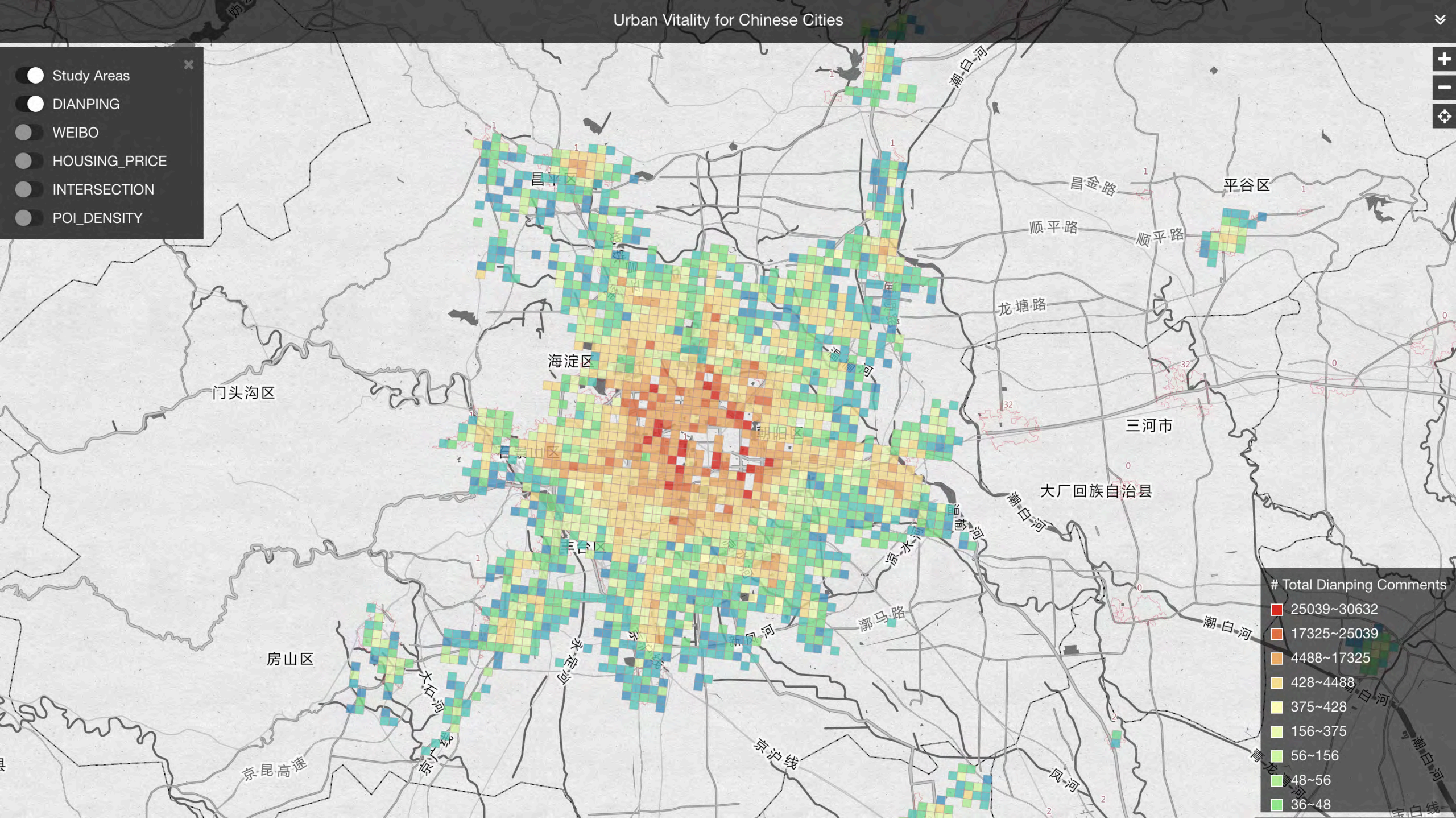
- **https://geohey.com/apps/dataviz/2fdcf9c298b9447a8ff7ba528a3243fd/share?ak=ZmYzNmY0ZWJhYjcwNGU2ZGExNDgxMWUxNmZiOWNhNGY**

- **http://geohey.com/gallery/bcl**

Study Areas

DIANPING

WEIBO

HOUSING_PRICE

INTERSECTION

POI_DENSITY

昌平区

平谷区

昌金路

顺平路

顺平路

海淀区

门头沟区

龙塘路

三河市

朝阳区

大厂回族自治县

石景山区

潮白河

房山区

丰台区

新凤河

潮马路

大石河

永定河

京沪线

凤河

潮白河

京昆高速

京沪线

Total Dianping Comments

25039~30632

17325~25039

4488~17325

428~4488

375~428

156~375

56~156

48~56

36~48

Study Areas

DIANPING

WEIBO

HOUSING_PRICE

INTERSECTION

POI_DENSITY

昌平区

平谷区

昌金路

顺平路

顺平路

龙塘路

海淀区

温榆河

门头沟区

朝阳区

三河市

石景山区

大厂回族自治县

潮白河

丰台区

潮白河

潮马路

房山区

新凤河

潮白河

大石河

永定河

京沪线

京昆高速

京沪线

凤河

青龙湾河
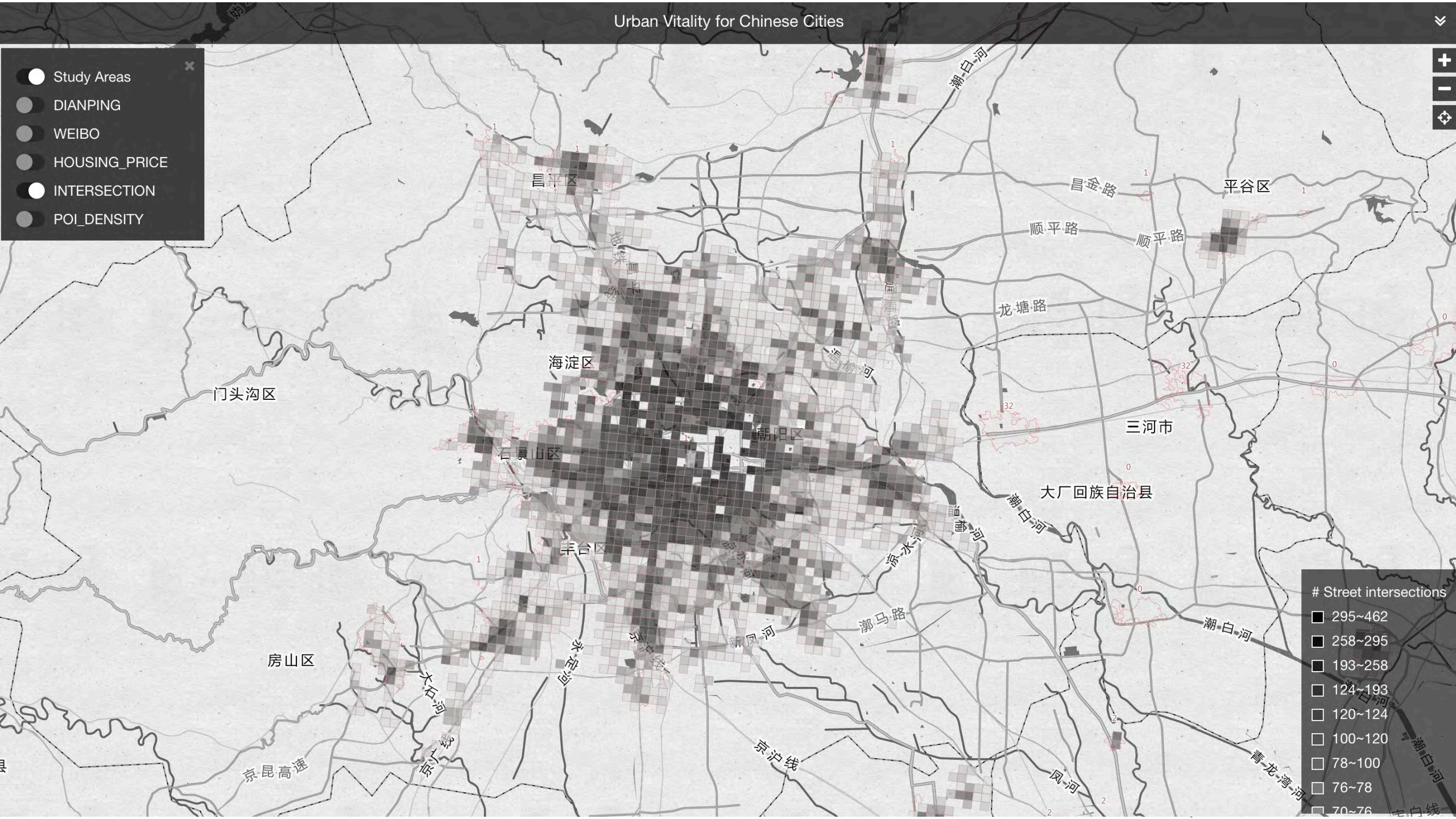
Street intersections

295~462

258~295

193~258

124~193

120~124

100~120

78~100

76~78

70~76

Study Areas

DIANPING

WEIBO

HOUSING_PRICE

INTERSECTION

POI_DENSITY

昌平区

门头沟区

海淀区

石景山区

朝阳区

丰台区

房山区

大兴区

三河市

大厂回族自治县

平谷区

顺平路

龙塘路

Average Housing Price in ...

■	80000~105000
■	67790~80000
■	39882~67790
■	19491~39882
■	18750~19491
■	14545~18750
■	10728~14545
■	10084~10728
■	9303~10084

Study Areas

DIANPING

WEIBO

HOUSING_PRICE

INTERSECTION

POI_DENSITY

潮白河

昌金路

平谷区

昌平区

顺平路

顺平路

地铁昌平

龙塘路

海淀区

温榆河

三河市

朝阳区

大厂回族自治县

石景山区

门头沟区

京密河

丰台区

凉水河

新凤河

潮白河

房山区

潮马路

大石河

京沪线

永定河

京沪线

Total GeoWeibos

县

	2298~4706
	1719~2298
	885~1719
	332~885
	314~332
	221~314
	140~221
	131~140
	114~131

京昆高速

京广乡

凤河

青龙湾河

潮白河
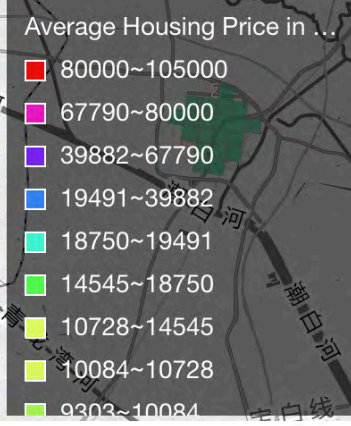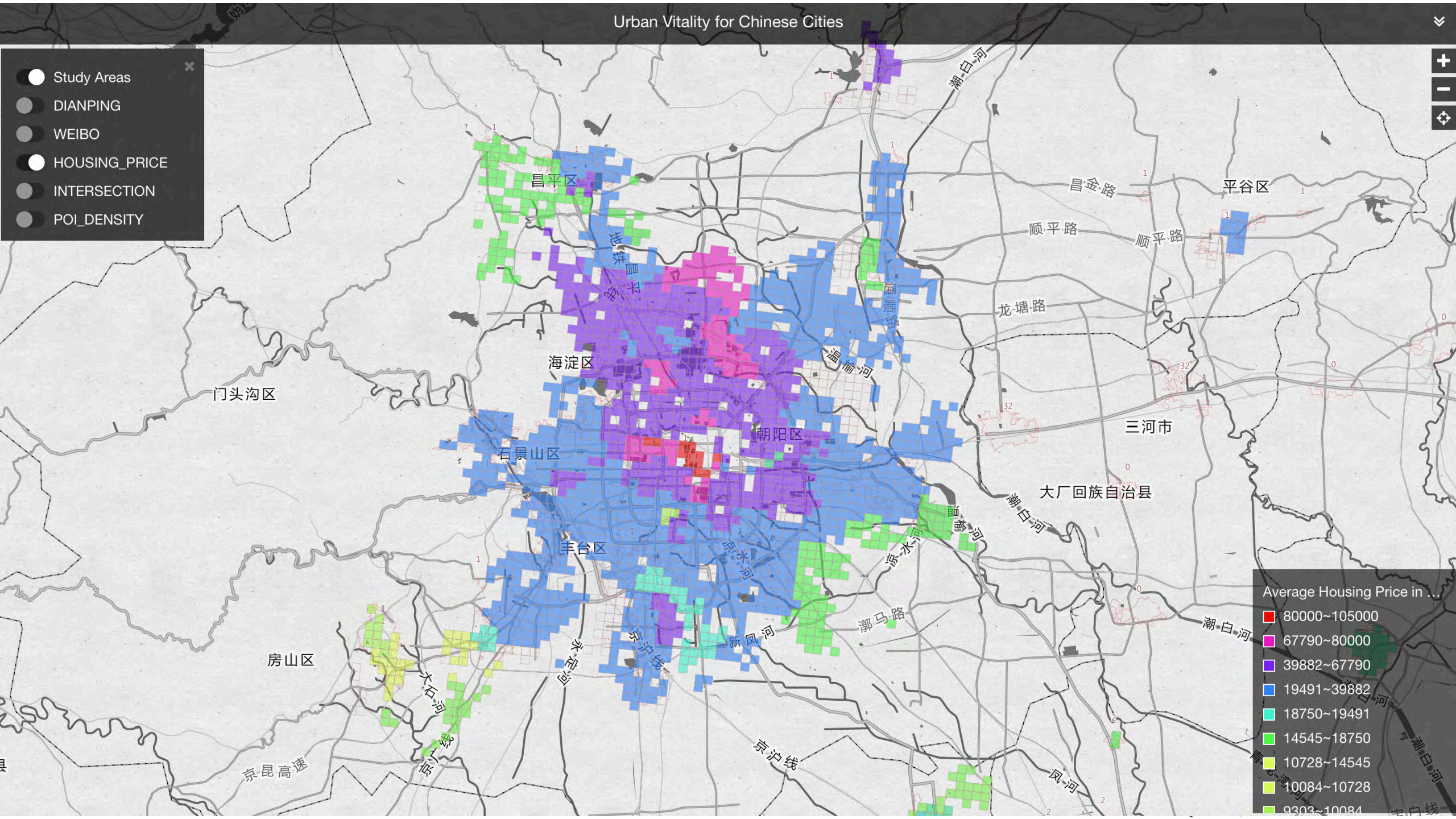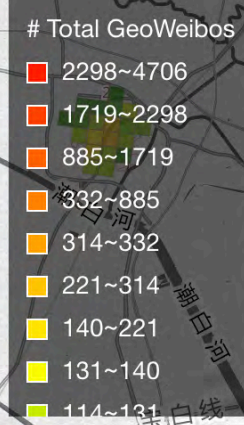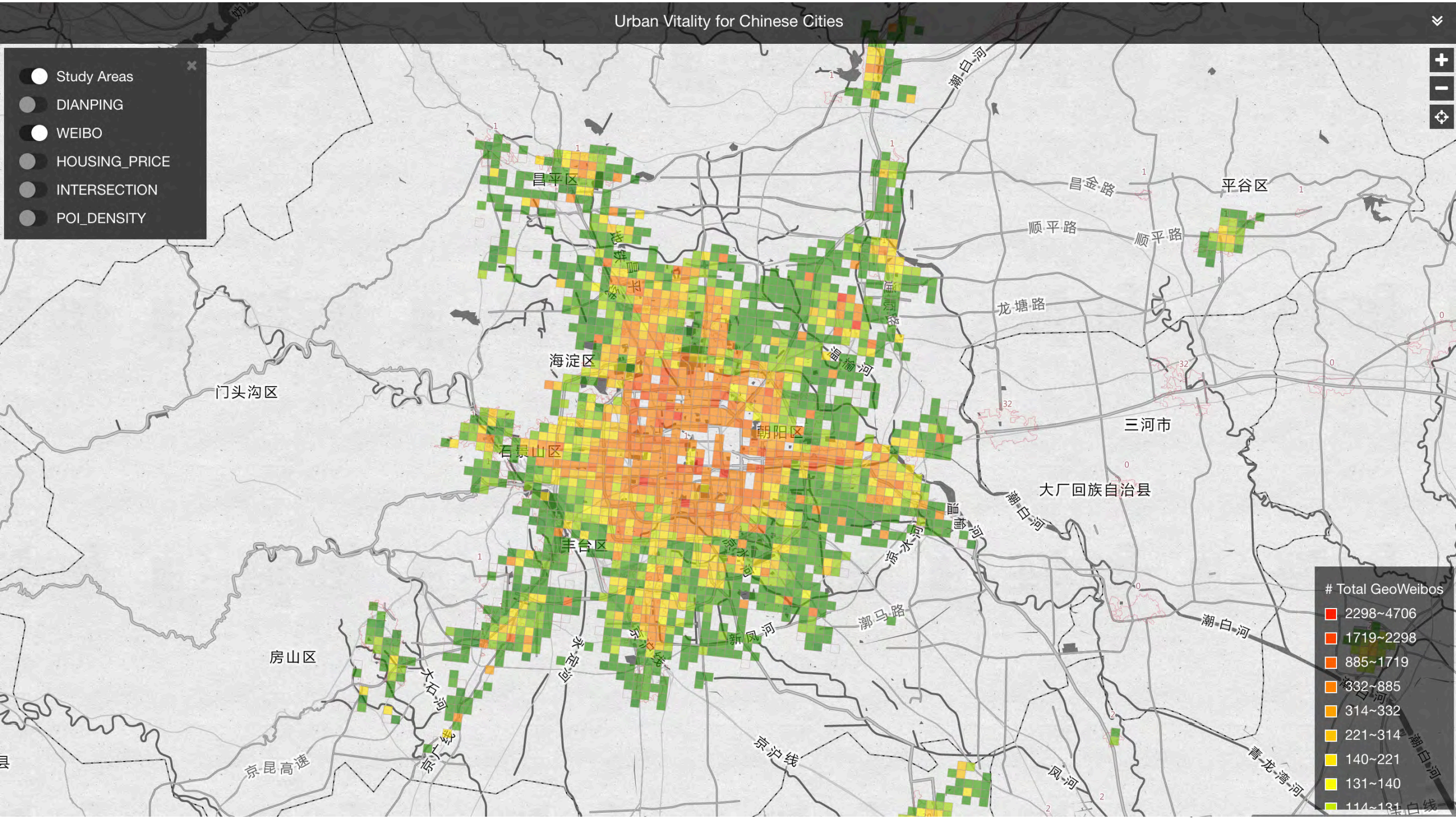
POI_DENSITY

POP_DENSITY

MIXED_USE

AMENITIES

ACCESSIBILITY

Urban Areas in 2010

昌平区

平谷区

昌金路

顺平路

顺平路

龙塘路

海淀区

温榆河

三河市

门头沟区

朝阳区

大厂回族自治县

石景山区

温榆河

凉水河

丰台区

凉水河

潮白河

潮马路

新凤河

房山区

大石河

永定河

京沪线

京昆高速

凤河

Functional Mixture in Entr...

- 1.83~1.94
- 1.79~1.83
- 1.76~1.79
- 1.72~1.76
- 1.68~1.72
- 1.63~1.68
- 1.57~1.63
- 1.5~1.57
- 1.4~1.5

Study Areas

DIANPING

WEIBO

HOUSING_PRICE

INTERSECTION

POI_DENSITY

Total Dianping Comments

■	25039~30632
■	17325~25039
■	4488~17325
■	428~4488
■	375~428
■	156~375
■	56~156
■	48~56
■	36~48

锡林郭勒盟
吉林
通辽市
辽源市
赤峰市
阜新市
通化市
朝阳市
辽宁
葫芦岛市 营口市
秦皇岛市
大连市 丹东市
朝鲜
包头市
张家口市
大同市
北京
酒泉市
鄂尔多斯市
天津
河北
沧州市
张掖市
榆林市
东营市
烟台市
银川市
阳泉市
衡水市
甘肃
中卫市
宁夏
吕梁市
邢台市
海西蒙古族藏族自治州
泰安市
青岛市
临夏回族自治州
庆阳市
陕西
临汾市 长治市
济宁市
日照市
天水市
中国
运城市
鹤壁市
枣庄市
甘南藏族自治州
郑州市
菏泽市
连云港市
商洛市
河南
商丘市
淮北市
淮安市
玉树藏族自治州
陇南市
驻马店市
阜阳市
江苏
青海
安康市 十堰市
淮南市
扬州市
广元市
常州市
上海郊县
绵阳市
随州市
安徽
上海
昌都市
达州市
宣城市 湖州市
四川
南充市
宜昌市

$$Ln(DIANPING) = ß0 + ß_1 * INTERSECTION$$
$$+ ß_2 * POI\_DENSITY + ß_3 * POP\_DENSITY$$
$$+ ß_4 * MIXTURE + ß_5 * AMENITIES$$
$$+ ß_6 * ACCESSIBILITY + ß_7 * GDP + ß_8 * TERTIARY$$
$$+ ß_9 * INCOME + ß_{10} * CITY\_LEVEL$$

3 Results

The profile of variables in regressions

- **The dependent variable DIANPING, representing total number of comments accrued per geographical unit ranges from 1 to 30,632 per km² and exhibits a long-tailed distribution, shows that there are more units with a very high number of comments than units with a very low number. To balance this, we take the natural log of DIANPING for the regressions.**

- **AMENITIES and ACCESSIBILITY are long-tailed distributed as well.**

- **In contrast, INTERSECTION, ranging from 0 to 462 intersections per square kilometer, exhibits a left-skewed normal distribution.**

- **MIXTURE is right-skewed and normally distributed.**

No.	Name	Min.	Max.	Mean	Std. Deviation
1	**DIANPING**	1	30,632	900	2,993
2	**INTERSECTION**	0	462	83	58
3	**POI_DENSITY**	0	2,914	200	254
4	**POP_DENSITY**	0	195,947	9,270	8,324
5	**MIXTURE**	0	1.94	1.38	0.57
6	**AMENITIES**	0	113.3	11.2	11.7
7	**ACCESSIBILITY**	0	336.4	18.0	28.2
8	**GDP**	6,222	249,040	65,170	27,928
9	**TERTIARY**	9.8	78.7	48.9	13.0
10	**INCOME**	13,818	71,923	43,052	12,165
11	**CITY_LEVEL**	2	5	3.0	1.2
	N=24,512				

- **All variables pass correlation analysis and VIF examinations, showing that there is no multicollinearity**

- **We use several regression models to understand the effect of urban form on economic vitality.**

- **All three models suggest that intersection density positively contributes to economic vitality and it is also the most important factor compared to all other variables used in the model.**

Table 3. Regression results for all cities (N=24,512)

Variable	Model 1 Beta	Model 1 Sig.	Model 2 Beta	Model 2 Sig.	Model 3 Beta	Model 3 Sig.
(Constant)				0.000		0.000
INTERSECTION	0.625	0.000	0.327	0.000	0.266	0.000
POI_DENSITY			0.011	0.210	0.052	0.000
POP_DENSITY			0.116	0.000	0.110	0.000
MIXTURE			0.095	0.000	0.125	0.000
AMENITIES			0.286	0.000	0.290	0.000
ACCESS TO TRANSIT			-0.111	0.000	-0.054	0.000
GDP					-0.026	0.000
TERTIARY					-0.015	0.016
INCOME					0.149	0.000
CITY_LEVEL					0.108	0.000
City fixed effect	Yes					
Dependent variable	Ln(DIANPING)					
N	24,512					
R²	0.391		0.487		0.528	

- **The regression results based on administrative level still show that intersection density and the other urban design indicators have a positive effect on economic vitality. Moreover, we find that the effect is larger for the highest tier cities.**

Table 4. Regression Results for Each City Tier

Variable	Tier 1		Tier 2		Tier 3		Tier 4	
	Beta	Sig.	Beta	Sig.	Beta	Sig.	Beta	Sig.
(Constant)		0.004		0.000		0.015		0.844
INTERSECTION	0.357	0.000	0.286	0.000	0.177	0.000	0.215	0.000
POI_DENSITY	0.066	0.000	0.038	0.020	0.140	0.000	0.080	0.000
POP_DENSITY	0.089	0.000	0.124	0.000	0.086	0.000	0.076	0.000
MIXED-USE	0.170	0.000	0.123	0.000	0.188	0.000	0.101	0.000
AMENITIES	0.148	0.000	0.317	0.000	0.329	0.000	0.322	0.000
ACCESSIBILITY	-0.187	0.000	-0.067	0.000	-0.024	0.107	-0.064	0.000
GDP	0.125	0.000	-0.162	0.000	0.155	0.000	0.045	0.000
TERTIARY	-0.149	0.000	-0.018	0.110	0.005	0.728	0.040	0.000
INCOME	0.108		0.088	0.000	-0.082	0.000	0.035	0.000
City fixed effect	Yes							
Dependent variable	Ln(DIANPING)							
N	4039		5467		2493		12513	
R²	0.624		0.569		0.583		0.416	

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- **We look at the average residential housing price per one square kilometer unit and also Sina Weibo records.**
  - **400,000 housing price records** from www.Soufun.com
  - **30.3 million Weibo records** that had geographical information from www.weibo.com

- **The effect still holds for both models.**

- **And for each category of cities as well.**

Table 5. Regression results for housing price and Weibo records

Variable	HOUSING PRICE		WEIBO	
	Beta	Sig.	Beta	Sig.
(Constant)		0.000		0.000
INTERSECTION	0.159	0.000	0.298	0.000
POI_DENSITY	-0.026	0.009	-0.027	0.000
POP_DENSITY	0.107	0.000	0.105	0.000
MIXTURE	-0.026	0.000	0.286	0.000
AMENITIES	-0.018	0.076	0.252	0.000
ACCESSIBILITY	-0.070	0.000	-0.046	0.000
GDP	-0.052	0.000	0.018	0.000
TERTIARY	-0.211	0.000	0.054	0.000
INCOME	0.473	0.000	-0.118	0.000
CITY_LEVEL	0.053	0.000	0.085	0.000
City fixed effect	Yes			
Dependent variable	Ln(HousingPrice)		Ln(Weibo)	
N	17,997		31,823	
R^2	0.536		0.593	

4 Discussion

4　Concluding remarks

- **A data intensive urban study**
  - **Multiple emerging big/open datasets**
  - **24,512 urban grids**
  - **286 Chinese cities**

- **Yes, the block size really matters!**
  - **Findings from the whole city system, rather a single city**
  - **Findings hold for each category of cities**
  - **For each dimension of urban vitality as well**

- **Informing our findings to stakeholders**
  - **Real estate developers**
  - **Local decision makers**
  - **Planners and designers**

4 **Potential practical applications**

- **The positive effect of intersection density on economic vitality should encourage real estate developers to propose urban planning schemes with smaller blocks.**
  - **Through our sponsor Energy Innovation who has been working with World Bank**
- **Our findings should also be considered by local governments and developers when creating long-term urban development plans.**
  - Through our sponsor Energy Innovation who has been working with World Bank
- **The database that we created for this analysis will be released in the public domain. We hope that the shared dataset can be used for other urban studies as well.**

- **Extending the study to the urban block level**
- **Collecting more emerging new (big) urban data as a proxy of urban vitality**
- **Zooming into a specific city and combining field survey with data analysis**

- **From UNDERSTANDING to CREATING**
  - **Data Augmented Design**

Thanks for your attention!

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