

# Simulating the driving effects of planning policies or future variables on LUCC with the PLUS model



Team: High-performance Spatial Computational Intelligence Lab @ CUG

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#### **CONTENT**

- 1. Methodology
- 2. Consider the driving effects of planning transport infrastructure on LUCC
- 3. Consider the driving effects of development zone on LUCC

Note that these functions are only integrated in PLUS v1.3.5 and later versions. Please learning tutorial A before reading this tutorial. The planning data in this tutorial is the dummy data for model test. Please don't regard them as real planning data.



01

Methodology

## The update mechanism



We proposed a update mechanism of planning transport infrastructure based on random forest (RF) and a random seeding mechanism based on planning development zone, which can consider the driving effects of planning policies or future variables on LUCC into simulation.

This study only consider planning policies in space, not macro-scale policies, including 1) planning traffic lines or sites and 2) planning development zone. Moreover, predicted variables exported by other models can also be imported to the PLUS model with the same way, for example, the future population, GDP, temperature, precipitation and etc.

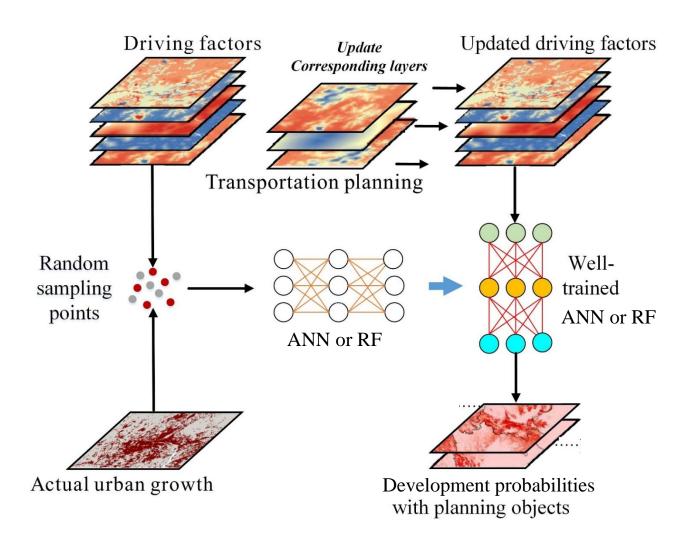
References: Liang, X., Liu, X., Li, D., Zhao, H., Chen, G., 2018, Urban growth simulation by incorporating planning policies into a CA-based future land-use simulation model, International Journal of Geographical Information Science, 32(11): 2294-2316. (ESI highly cited paper)

Liang X., Guan Q.\*, Clarke KC, Liu S., Wang B., Yao Y., 2021.

Understanding the drivers of sustainable land expansion
using a patch-generating simulation (PLUS) model: A case
study in Wuhan, China, Computers, Environment and Urban
Systems, 85:101569

#### The update mechanism





#### Flow chart

- First, sampled land-use map data and historical driving force data are employed to train the RF.
- The driving factors that will be updated are specified in this step (only driving factors with both historical and planning schemes (or future variables) can be updated).
- In the RF prediction process, the historical driving forces in the specified layers are replaced with data that include both historical and future driving forces and output the development probabilities

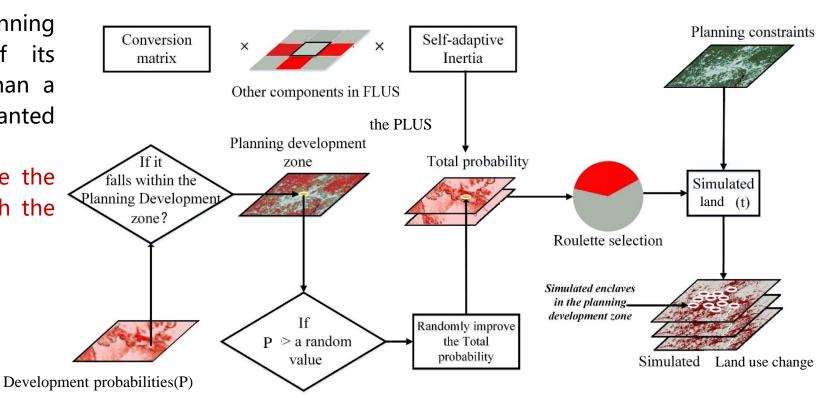
### The random seeding mechanism



#### Flow chart

- A cell that is located in the planning development zones is selected. If its development probability is greater than a random value within [0, 1], a seed is planted in the cell.
- A planted seed will randomly increase the total probability of an urban area with the following rule:

$$TP_k = \begin{cases} r + TP_k & if \ r + TP_k \le 1\\ 1 & if \ r + TP_k > 1 \end{cases}$$



 $TP_{m{k}}$  - denotes the total probability of specific land k

r - a random value within [0, 1]



# 02

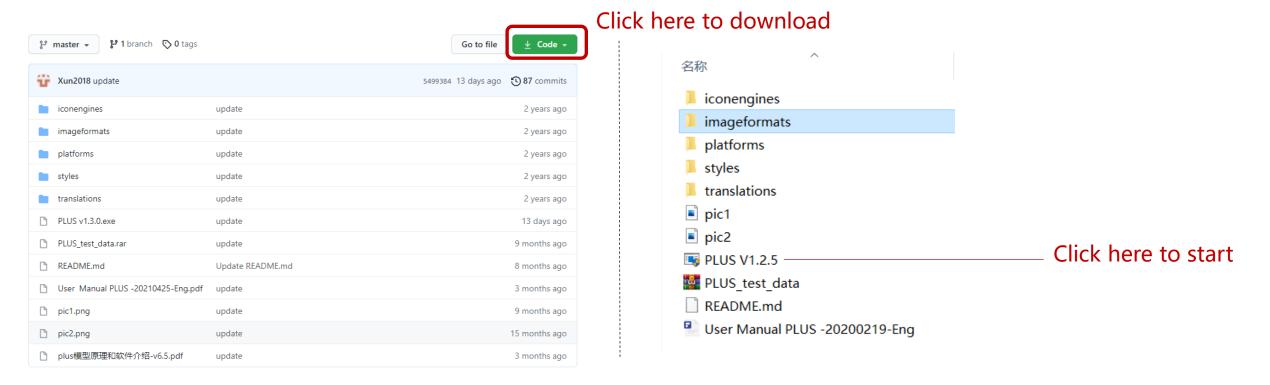
# Consider the driving effects of planning transport infrastructure on LUCC



#### **Download PLUS v1.3.5**



Link: https://github.com/HPSCIL/Patch-generating\_Land\_Use\_Simulation\_Model

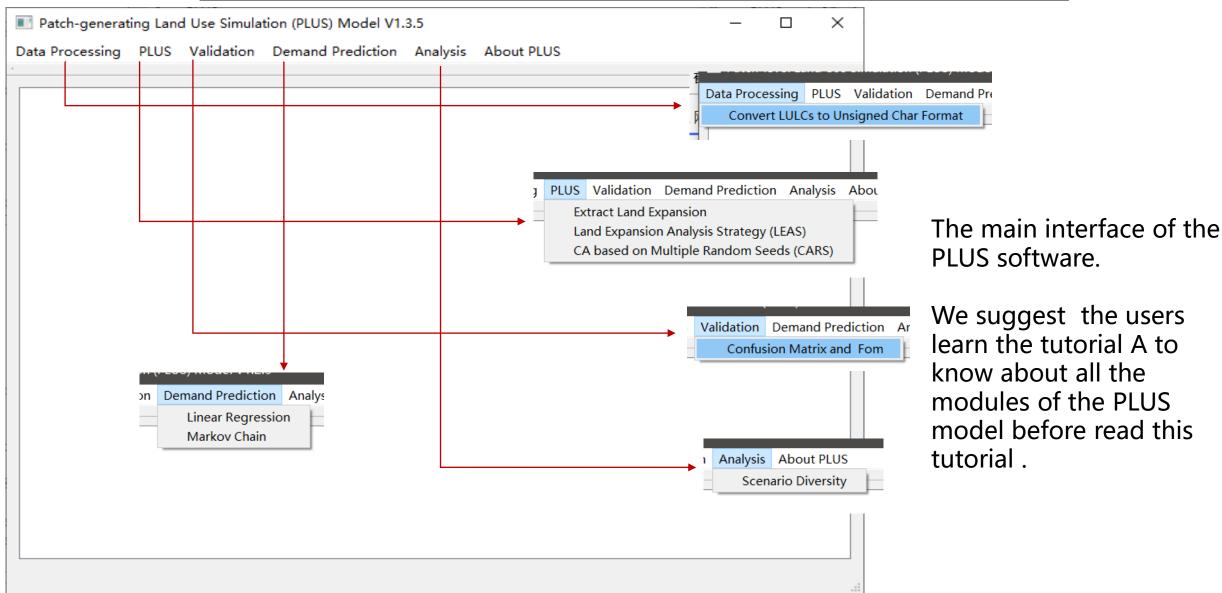


PLUS can run in the environment of Windows Vista/7/8/X64 without install process and the support of other software



#### Main interface







# Add in the planning traffic data



| ■ LEAS |                           |   |  | - 🗆 X    |          | Input&Output  |
|--------|---------------------------|---|--|----------|----------|---|
|        | Input Raster              |   |  |          |          |   |
|        | Land expansion map        | 1 C:/Users/HP/Downloads/PLUS/PLUS_test_data/  | change03_13_landuse_1to2.tif   |          | <b>/</b> | Land expansion map (see tutorial A to know how to obtain this file) |
|        | T1>T2                     |   |  |          |          | The know now to obtain this me,                                     |
|        |                           |   |  |          |          | Driving factors of LUCC   |
|        | Folder of driving factors | C:/Users/HP/Downloads/PLUS/PLUS_test_data/dringfacto  | r/   |          |          | Inches the planting welless a                                       |
|        |                           | 1 C:/Users/HP/Downloads/PLUS/PLUS_test_data/<br>dringfactor/Dis to TertiaryHistory2.tif<br>C:/Users/HP/Downloads/PLUS/PLUS_test_data/<br>dringfactor/wh Pop.tif | Corresponding future variable(optional)  Corresponding future variable(optional) | <u>^</u> | <b>V</b> | Import the planning polices o                                       |
|        |                           | C:/Users/HP/Downloads/PLUS/PLUS_test_data/  | Corresponding future variable(optional)  |          |          | future variables (optional)   |
|        | File list in the folder   | dringfactor/wh df dem.tif C:/Users/HP/Downloads/PLUS/PLUS_test_data/ dringfactor/wh df pre.tif C:/Users/HP/Downloads/PLUS/PLUS_test_data/                       | Corresponding future variable(optional)  |          | <b>✓</b> | Output path   |
|        | Tite fist in the forder   | 5 dringfactor/wh df slope.tif   | Corresponding future variable(optional)  |          |          | •   |
|        |                           | 6 C:/Users/HP/Downloads/PLUS/PLUS_test_data/<br>dringfactor/wh df tem.tif   | Corresponding future variable(optional)  |          |          |   |
|        |                           | 7 dringfactor/wh dist gov.tif   | Corresponding future variable(optional)  |          |          |   |
|        |                           | 8 C:/Users/HP/Downloads/PLUS/PLUS_test_data/<br>dringfactor/wh dist highspdstation.tif<br>C:/Users/HP/Downloads/PLUS/PLUS_test_data/                            | Corresponding future variable(optional)  | Ų        |          |   |
|        | Uniform sampling          | (RFR)   |  |          |          | Other parameters  |
|        | Number of regression tree |   | mTry [16]  |          |          | ✓ See tutorial A  |
|        | Output Raster             |   |  |          |          |   |
|        | Development potential     | C:/Users/HP/Downloads/PLUS/PLUS_test_data/result/Dev  | Prob. tif  |          |          |   |
|        | Operating Parameters      |   |  |          |          |   |
|        | Thread                    | -   |  |          |          |   |
|        |                           |   |  |          |          |   |
|        | Multi-thre                | ad to reduce running  | g time   | Start    |          |   |



# Add in the planning traffic data



| LEAS  | - □ X   |
|---|---|
| Input Raster  Land expansion map 1 C:/Users/HP/Downlo                     | oads/PLUS/PLUS_test_data/change03_13_landuse_1to2.tif             |
| T1>T2   |   |
| Folder of driving factors C:/Users/HF/Downloads/FLUS                      | FLUS_test_data/dringfactor/                                       |
| 1 C;/Users/HP/Download<br>dringfactor/Dis to Tert                         | ds/PLUS/PLUS test_data/ C:/Dis_to_TertiaryDummyPlanning2.tif      |
| C:/Users/HP/Download<br>dringfactor/wh Pop.tif                            | ds/PLUS/PLUS_test_data/ Corresponding future variable(optional)   |
| C;/Users/HP/Download<br>dringfactor/wh df dem                             | ds/PLUS/PLUS_test_data/ Corresponding future variable(optional)   |
| C:/Users/HP/Download<br>dringfactor/wh df pre.t                           | ds/PLUS/PLUS_test_data/ Corresponding future variable(optional)   |
| File list in the folder  C:/Users/HP/Download                             | ds/PLUS/PLUS_test_data/ Corresponding future variable(optional) - |
| dringfactor/wh df tem:  | ls/PLUS/PLUS_test_data/ Corresponding future variable(optional)   |
| C:/Users/HP/Download<br>dringfactor/wh dist go                            | ds/PLUS/PLUS_test_data/ Corresponding future variable(optional)   |
| 8 C:/Users/HP/Download<br>dringfactor/wh dist hig<br>C:/Users/HP/Download | ds/PLUS/PLUS test_data/ Corresponding future variable(optional)   |
| ☐ Uniform sampling  Random Forest Regression (RFR)                        |   |
|   | pling rate 0.01 mTry 16   |
| Outside Producti  |   |
| Output Raster   |   |
| Development potential C:/Users/MP/Downloads/PLUS                          | /PLUS_test_data/result/devprob. tif                               |
| Operating Parameters  |   |
| Thread 1  | -   |
|   |   |

Click the button that corresponding to the proximity to the historical tertiary road "Dis\_toTertiaryHistory2.tif" to import the planning tertiary road data "Dis\_to\_TertiaryDummyPlanning.tif" (All the test data can be found in the zip file PLUS\_test\_data.rar)

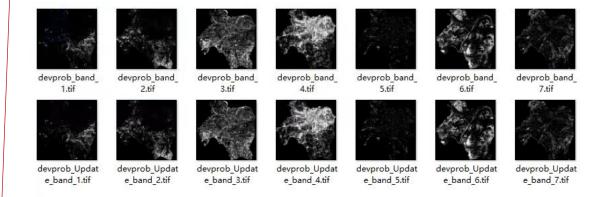


# **Output results**



| ■ LEAS  |  | - 🗆 X                                 |
|---|--|---------------------------------------|
| 7, 0. 0743194, 0. 0337096, 0. 0578886, 0. 0382<br>084, 0. 0616151, 0. 055121, 0. 0297373, 0. 036<br>337   | Input Raster   |                                       |
| Predict, please wait Output file: C:/Users/HP/Downloads/ PLUS/FUIS_test_data/result/ devprob_band_1.tif-band! Output file: C:/Users/HP/Downloads/ PLUS/FUIS_test_data/result/ devprob_band_2.tif-band2 Output file: C:/Users/HP/Downloads/  | Land expansion map 1 C://Users/HP/Downloads/PLUS/PLUS_test_data/change03_13_landuse_1to2.tif   |                                       |
| PLIS/FUS test data/result/ devprob_band_3. tif-band3 Output file: C:/Users/HF/Downloads/ PLUS/FUS_test_data/result/ devprob_band_4. tif-band4 Output file: C:/Users/HF/Downloads/ PLUS/FUS_test_data/result/ devprob_band_5. tif-band5 Output file: C:/Users/HF/Downloads/ PLUS/FUS_test_data/result/ devprob_band_6. tif-band6 Output file: C:/Users/HF/Downloads/ PLUS/FUS_test_data/result/ devprob_band_7. tif-band7 Output file: C:/Users/HF/Downloads/ PLUS/FUS_test_data/result/ devprob_band_7. tif-band7 Output file: C:/Users/HF/Downloads/ Output file: C:/Users/HF/Downloads/ Output file: C:/Users/HF/Downloads/ | Folder of driving factors  C:/Users/HP/Downloads/PLUS/PLUS_test_data/dringfactor//Dis to TertiaryPlistory.2.if  C:/Users/HP/Downloads/PLUS/PLUS_test_data/dringfactor//Dis to TertiaryPlistory.2.if  C:/Users/HP/Downloads/PLUS/PLUS_test_data/dringfactor/wh Pop.tif  C:/Users/HP/Downloads/PLUS/PLUS_test_data/dringfactor/wh dem.tif  C | D D D D D D D D D D D D D D D D D D D |
| LUS/PLUS_test_data/result/<br>evprob_Update_band_2.tif=band2  | ☐ Uniform sampling   |                                       |
| Output file: C:/Users/HF/Downloads/ TUNS/FUNS_test_data/result/ levprob_Update_band_3.tif-band3  Output file: C:/Users/HF/Downloads/ TUNS/FLUS_test_data/result/ levprob_Update_band_4.tif-band4  | Random Forest Regression (RFR)  Number of regression tree 20 Sampling rate 0.01 mTry 16  Output Raster   |                                       |
| output file: C:/Users/HP/Downloads/<br>/LUS/PLUS_test_data/result/<br>leyprob Update band 5.tif-band5   | Development potential C:/Users/HP/Downloads/PLUS/PLUS_test_data/result/devprob.tif   |                                       |
| hutput file: C:/Users/NP/Downloads/<br>TLMS/PLUS_test_data/result/<br>levprob_Update_band_6. tif-band6  | Operating Parameters  Thread 4   |                                       |
| Output file: C:/Users/HP/Downloads/<br>PLUS/PLUS_test_data/result/<br>devprob_Update_band_7.tif-band7<br>total_time_for_one_block: 229.141 s  |  | Start                                 |

✓ Click "Start" button and wait for the output files



✓ Output two groups of development probabilities:devprob\_Update\_band1-7.tif: development

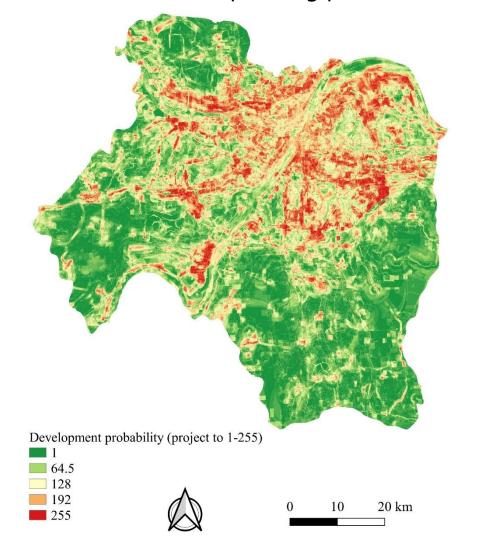
probabilities under the influences of planning policies, which is the input of the next step.

**devprob\_band1-7.tif:** development probabilities without the influences of planning policies, which is used to compare with the one with the influences of planning policies.

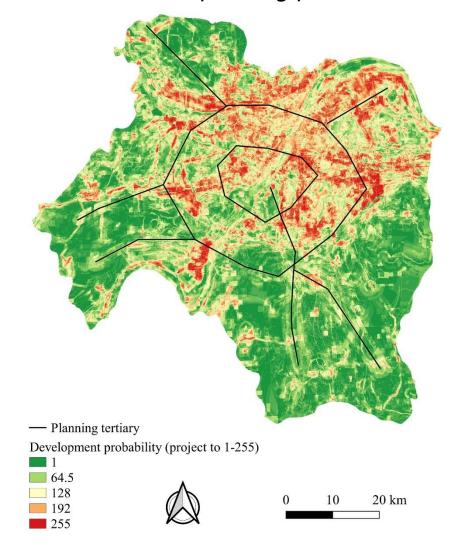
# **Output results**



Urban development potential without the influences of planning policies



Urban development potential under the influences of planning policies





03

# Consider the driving effects of development zones on LUCC

#### Add in the planning development zones



| ■ CARS |                                    |           |                          |                          |                                 | _                            | □ ×                        |    |
|--------|------------------------------------|-----------|--------------------------|--------------------------|---------------------------------|------------------------------|----------------------------|----|
| I      | Neighborhood Size 3                | ,         |                          |                          |                                 |                              | Thread 1                   |    |
|        | Data Preparation  Land use pattern |           |                          |                          |                                 |                              |                            |    |
|        | Development potential              |           |                          |                          |                                 |                              |                            | \/ |
|        | Conversion constraints             |           |                          |                          |                                 |                              | ovlopment Zone             |    |
|        | Output Path                        |           |                          |                          |                                 |                              |                            |    |
|        | Patch generation threshol          | d 0.5     | Expansion coefficient 0. |                          | Percentage of s                 |                              |                            |    |
|        |                                    |           |                          | The h<br>seeds<br>for th | igher th<br>, the i<br>e land i | ne perc<br>more d<br>use pat | entage<br>ispersed<br>tern | of |
|        | Color Dynam:                       | o Display |                          |                          | Parameter                       | Stop                         | Run                        |    |

|     | Development type 0 ♣ ☑ Devlopment Zone |
|-----|--|
|     | Development weight 0.5                 |
|     |  |
| /   |  |
| ent | 0.1 Percentage of seeds 0.0001         |

Click the "Development Zone" checkbox to active the "Development type " and "Development weight" parameters

"Development Zone" is used to define the land use type that influenced by the planning policies; "Development weight" ranges from 0-1, which is used to define the strength of the planning policies.



#### Add in the planning development zones



Make the "conversion constraints area and planning development zones", the value of conversion constraints area is 0, and the value of planning development zone is 2. Value 1 means transitions are allowed

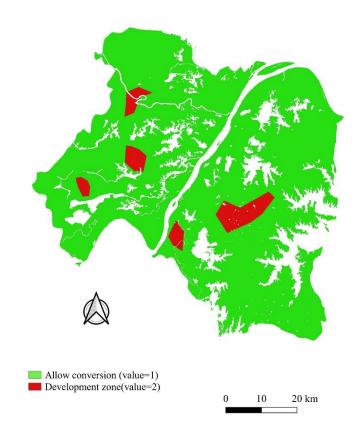
Open water/coversion restrict area (value=0) Allow conversion (value=1) Development zone(value=2)

Import this file to the conversion tools of the PLUS model to convert it to 'unsigned char' format



Convert LULCs Data to Unsigned Char Format Original LULCs 1 C:/Users/HP/Downloads/PLUS/PLUS test data/dummyDevelopmentZone water.tif Finish! Output Folder OK C:/Users/HP/Downloads/PLUS/PLUS test data/ — Please wait — Output path: C:/Vsers/HP/Downloads/PLUS/PLUS\_test\_data/dummyDevelopmentZone\_water\_uc.tif Convert

The value 0 will be convert to nodata value in this tool and will not be showed in the final results.





# **Parameter setting**



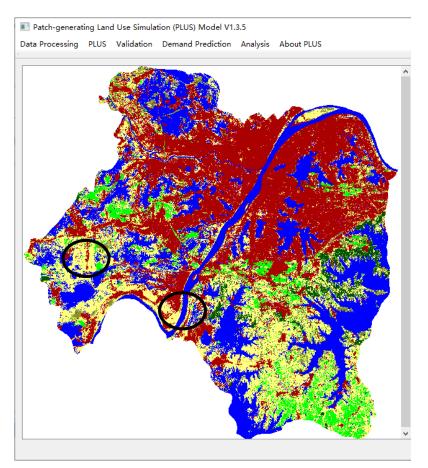
| ■ CARS                  |   |   |                   |                                      |   |                |                  | - 🗆                            | ×   |  |  |
|-------------------------|---|---|-------------------|--------------------------------------|---|----------------|------------------|--------------------------------|---|--|--|
|                         | Neighborhood Size 5 🕏  Data Preparation |   |                   |                                      |   |                |                  | Thread 8                       |   |  |  |
|                         | Land use patt                           | C:/Users/HP/Downloads/Patch-generating_Land_Use_Simulation_Model/PLUS_test_data/LULCs/wh2013 refy.tif   |                   |                                      |   |                |                  | Initial                        | land use data   |  |  |
|                         |   | 1 C:/Users/HP/Downloads/PLUS/PLUS_test_data/result/devprob_Update_band_1.tif  |                   |                                      |   |                | ^                |                                |   |  |  |
|                         |   | 2 C:/Users/HP/Downloads/PLUS/PLUS_test_data/result/devprob_Update_band_2.tif 3 C:/Users/HP/Downloads/PLUS/PLUS_test_data/result/devprob_Update_band_3.tif |                   |                                      |   |                |                  | Devel                          | opment potential  |  |  |
|                         | Development potent                      | 4 C:/Users/   | HP/Downloads/P    | LUS/PLUS_test_da<br>LUS/PLUS_test_da | ta/result/devprob<br>ta/result/devprob<br>ta/result/devprob | Update_band_4. | tif              |                                | The value of urban land is 4 in this data. When the value is 0, |  |  |
| Import the conversion ( |   | 1 C:/Usars  |                   |                                      | La Development ty   | уре 4          |                  | Devlopment Z                   | the development zone will not take effects.                     |  |  |
| planning development    | zones here:                             | C:/Vsers/HP/  | Downloads/PLUS/Pl | LUS_test_data/res                    | ult/simulationRes   | ılt. tif       |                  |                                | The default development weigh                                   |  |  |
|                         | Patch generation thr                    | eshold 0.5  | Енр               | ansion coefficier                    | at 0.1  | Percents       | age of seeds 0.1 |                                | is 0.5  |  |  |
|                         | Weights Transti                         | on Matrix Land  | l Demands         |                                      |   |                |                  |                                |   |  |  |
|                         |   | Type 1  | Type 2            | Type 3                               | Type 4  | Type 5         | Туре б           | Type 7                         |   |  |  |
|                         | Start Amounts Future Amounts 1          | 147705  | 308025            | 1377648                              | 0<br>1998479  | 0<br>39707     | 1355776          | 98729                          | -   |  |  |
|                         | ruture Amounts 1                        | 147703  | 300023            | 1377040                              |   |                |                  |                                | calculation of future Land use                                  |  |  |
|                         |   | demand.   |                   |                                      |   |                |                  | calcalation of ratare Land ase |   |  |  |
|                         | Color 🗸 I                               | ynamic Display  |                   |                                      |   | Param          | eter Sto         | p Run                          | Click 'Run' to start simulation                                 |  |  |



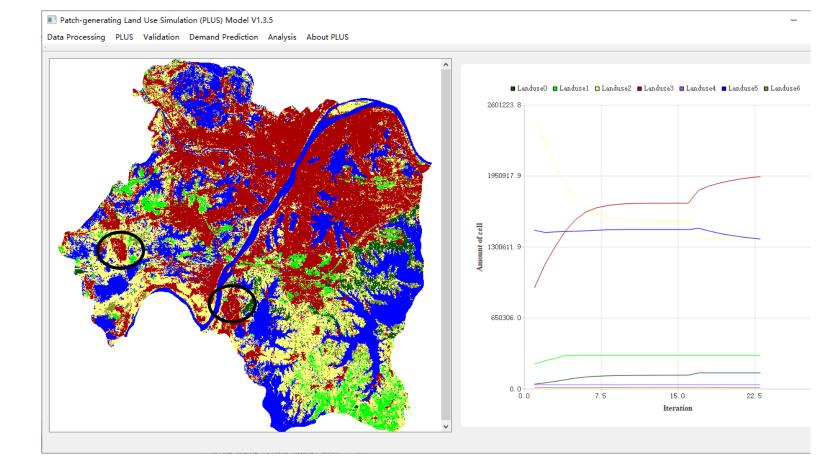
#### Results affected by the development zones



The picture on the left is the result without the influences of planning development zones



The picture on the right is the result under the influences of planning development zones .We can see the new developed urban patches affected by the planning development zones.







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# Thanks!

