

# Package ‘geocomplexity’

September 24, 2024

**Title** Mitigating Spatial Bias Through Geographical Complexity

**Version** 0.1.0

**Description** The geographical complexity of individual variables can be characterized by the differences in local attribute variables, while the common geographical complexity of multiple variables can be represented by fluctuations in the similarity of vectors composed of multiple variables. In spatial regression tasks, the goodness of fit can be improved by incorporating a geographical complexity representation vector during modeling, using a geographical complexity-weighted spatial weight matrix, or employing local geographical complexity kernel density. Similarly, in spatial sampling tasks, samples can be selected more effectively by using a method that weights based on geographical complexity. By optimizing performance in spatial regression and spatial sampling tasks, the spatial bias of the model can be effectively reduced.

**License** GPL-3

**Encoding** UTF-8

**URL** <https://ausgis.github.io/geocomplexity/>,  
<https://github.com/ausgis/geocomplexity>

**BugReports** <https://github.com/ausgis/geocomplexity/issues>

**RoxygenNote** 7.3.2

**Depends** R (>= 4.1.0)

**Imports** dplyr, magrittr, pander, purrr, sdsfun, sf, stats, terra,  
tibble

**Suggests** ggplot2, knitr, Rcpp, RcppArmadillo, rmarkdown, tidyverse,  
viridis

**LinkingTo** Rcpp, RcppArmadillo

**VignetteBuilder** knitr

**NeedsCompilation** yes

**Author** Wenbo Lv [aut, cre, cph] (<<https://orcid.org/0009-0002-6003-3800>>),  
Yongze Song [aut, ths] (<<https://orcid.org/0000-0003-3420-9622>>)

**Maintainer** Wenbo Lv <lyu.geosocial@gmail.com>

**Repository** CRAN

**Date/Publication** 2024-09-24 19:10:06 UTC

## Contents

geocd_raster . . . . .	2
geocd_swm . . . . .	3
geocd_vector . . . . .	4
geocs_raster . . . . .	5
geocs_swm . . . . .	6
geocs_vector . . . . .	7
gwr_geoc . . . . .	8
moran_test . . . . .	9

<b>Index</b>	<b>11</b>
--------------	-----------

---

geocd_raster	<i>geocomplexity for spatial raster data based on spatial dependence</i>
--------------	--

---

## Description

This function calculates geocomplexity for spatial raster data based on spatial dependence.

## Usage

```
geocd_raster(r, order = 1, normalize = TRUE, method = "moran")
```

## Arguments

r	SpatRaster object or can be converted to SpatRaster by terra::rast().
order	(optional) The order of the adjacency object. Default is 1.
normalize	(optional) Whether to further normalizes the calculated geocomplexity. Default is TRUE.
method	(optional) In instances where the method is moran, geocomplexity is determined using local moran measure method. Conversely, when the method is spvar, the spatial variance of attribute data serves to characterize geocomplexity. For all other methods, the shannon information entropy of attribute data is employed to represent geocomplexity. The selection of the method can be made from any one of the three options: moran, spvar or entropy. Default is moran.

## Value

A SpatRaster object

## Note

In contrast to the geocd\_vector() function, the geocd\_raster() performs operations internally on raster data based on neighborhood operations(focal) without providing additional wt object.

## References

- Zehua Zhang, Yongze Song, Peng Luo & Peng Wu (2023) Geocomplexity explains spatial errors, *International Journal of Geographical Information Science*, 37:7, 1449-1469, DOI: 10.1080/13658816.2023.2203212
- Anselin, L. (2019). A local indicator of multivariate spatial association: Extending geary's c. *Geographical Analysis*, 51(2), 133–150. <https://doi.org/10.1111/gean.12164>

## Examples

```
library(terra)
m = matrix(c(3,3,3,3,1,3,
            3,3,3,2,1,2,
            3,3,3,1,2,1,
            1,3,2,2,2,2,
            2,2,2,1,1,2,
            1,2,1,1,1,1),
          nrow = 6,
          byrow = TRUE)
m = rast(m)
names(m) = 'sim'
plot(m, col = c("#d2eaac", "#a3dae1", "#8cc1e1"))
gc1 = geocd_raster(m,1)
gc2 = geocd_raster(m,2)
gc1
plot(gc1)
gc2
plot(gc2)
```

---

geocd_swm	<i>constructing spatial weight matrix based on geocomplexity with spatial dependence</i>
-----------	--

---

## Description

constructing spatial weight matrix based on geocomplexity with spatial dependence

## Usage

```
geocd_swm(sfj, wt = NULL, style = "B", ...)
```

## Arguments

sfj	An sf object or spatial vector object that can be converted to sf by <code>sf::st_as_sf()</code> .
wt	(optional) Spatial weight matrix based on spatial adjacency or spatial distance relationships.
style	(optional) A character that can be B,W,C. More to see <code>spdep::nb2mat()</code> . Default is B.
...	(optional) Other parameters passed to <code>geocomplexity::geocd_vector()</code> .

**Value**

A matrix

**Examples**

```
econineq = sf::read_sf(system.file('extdata/econineq.gpkg', package = 'geocomplexity'))
wt_gc = geocd_swm(econineq)
wt_gc[1:5,1:5]
```

---

geocd\_vector

*geocomplexity for spatial vector data based on spatial dependence*

---

**Description**

This function calculates geocomplexity for spatial vector data based on spatial dependence.

**Usage**

```
geocd_vector(
  sfj,
  wt = NULL,
  method = "moran",
  normalize = TRUE,
  returnsf = TRUE
)
```

**Arguments**

sfj	An sf object or spatial vector object that can be converted to sf by <code>sf::st_as_sf()</code> .
wt	(optional) Spatial weight matrix. Must be a matrix class.
method	(optional) In instances where the method is moran, geocomplexity is determined using local moran measure method. Conversely, when the method is spvar, the spatial variance of attribute data serves to characterize geocomplexity. For all other methods, the shannon information entropy of attribute data is employed to represent geocomplexity. The selection of the method can be made from any one of the three options: moran, spvar or entropy. Default is moran.
normalize	(optional) Whether to further normalizes the calculated geocomplexity. Default is TRUE.
returnsf	(optional) When returnsf is TRUE, return an sf object, otherwise a tibble. Default is TRUE.

**Value**

A tibble (returnsf is FALSE) or an sf object (returnsf is TRUE)

**Note**

If `wt` is not provided, for polygon vector data, `geocomplexity` will use a first-order queen adjacency binary matrix; for point vector data, the six nearest points are used as adjacency objects to generate an adjacency binary matrix.

**Examples**

```
econineq = sf::read_sf(system.file('extdata/econineq.gpkg', package = 'geocomplexity'))
gc = geocd_vector(econineq)
gc

library(ggplot2)
library(viridis)
ggplot(gc) +
  geom_sf(aes(fill = GC_Gini)) +
  scale_fill_viridis(option = "mako", direction = -1) +
  theme_bw()
```

---

 geocs\_raster

*geocomplexity for spatial raster data based on geographical similarity*


---

**Description**

This function calculates geocomplexity for spatial raster data based on geographical similarity.

**Usage**

```
geocs_raster(r, order = 1, normalize = TRUE, similarity = 1, method = "spvar")
```

**Arguments**

<code>r</code>	SpatRaster object or can be converted to SpatRaster by <code>terra::rast()</code> .
<code>order</code>	(optional) The order of the adjacency object. Default is 1.
<code>normalize</code>	(optional) Whether to further normalizes the calculated geocomplexity. Default is TRUE.
<code>similarity</code>	(optional) When <code>similarity</code> is 1, the similarity is calculated using geographical configuration similarity, otherwise the cosine similarity is calculated. Default is 1.
<code>method</code>	(optional) When <code>method</code> is <code>spvar</code> , variation of the similarity vector is represented using spatial variance, otherwise shannon information entropy is used. Default is <code>spvar</code> .

**Value**

A SpatRaster object

**Note**

In contrast to the `geocs_vector()` function, the `geocs_raster()` performs operations internally on raster data without providing additional `wt` object.

**Examples**

```
library(terra)
m1 = matrix(c(3,3,3,3,1,3,
             3,3,3,2,1,2,
             3,3,3,1,2,1,
             1,3,2,2,2,2,
             2,2,2,1,1,2,
             1,2,1,1,1,1),
           nrow = 6,
           byrow = TRUE)
m1 = rast(m1)
names(m1) = 'sim1'
m2 = m1
set.seed(123456789)
values(m2) = values(m1) + runif(ncell(m1),-1,1)
names(m2) = 'sim2'
m = c(m1,m2)
gc1 = geocs_raster(m,1)
gc2 = geocs_raster(m,2)
gc1
plot(gc1)
gc2
plot(gc2)
```

---

geocs\_swm

*constructing spatial weight matrix based on geocomplexity with similar geographical configurations*

---

**Description**

constructing spatial weight matrix based on geocomplexity with similar geographical configurations

**Usage**

```
geocs_swm(sfj, wt = NULL, style = "B", ...)
```

**Arguments**

<code>sfj</code>	An <code>sf</code> object or spatial vector object that can be converted to <code>sf</code> by <code>sf::st_as_sf()</code> .
<code>wt</code>	(optional) Spatial weight matrix based on spatial adjacency or spatial distance relationships.
<code>style</code>	(optional) A character that can be B,W,C. More to see <code>spdep::nb2mat()</code> . Default is B.
<code>...</code>	(optional) Other parameters passed to <code>geocomplexity::geocs_vector()</code> .

**Value**

A matrix

**Examples**

```
econineq = sf::read_sf(system.file('extdata/econineq.gpkg', package = 'geocomplexity'))
wt_gc = geocs_swm(econineq)
wt_gc[1:5,1:5]
```

---

geocs_vector	<i>geocomplexity for spatial vector data based on geographical similarity</i>
--------------	---

---

**Description**

This function calculates geocomplexity for in spatial vector data based on geographical similarity.

**Usage**

```
geocs_vector(
  sfj,
  wt = NULL,
  method = "spvar",
  similarity = 1,
  normalize = TRUE,
  returnsf = TRUE
)
```

**Arguments**

sfj	An sf object or spatial vector object that can be converted to sf by <code>sf::st_as_sf()</code> .
wt	(optional) Spatial weight matrix. Must be a matrix class. If wt is not provided, geocomplexity will use a first-order inverse distance weight matrix via <code>sdsfun::inverse_distance_swm()</code> function.
method	(optional) When method is <code>spvar</code> , variation of the similarity vector is represented using spatial variance, otherwise shannon information entropy is used. Default is <code>spvar</code> .
similarity	(optional) When <code>similarity</code> is 1, the similarity is calculated using geographical configuration similarity, otherwise the cosine similarity is calculated. Default is 1.
normalize	(optional) Whether to further normalizes the calculated geocomplexity. Default is TRUE.
returnsf	(optional) When <code>returnsf</code> is TRUE, return an sf object, otherwise a tibble. Default is TRUE.

**Value**

A tibble (returnsf is FALSE) or an sf object (returnsf is TRUE)

**Examples**

```
econineq = sf::read_sf(system.file('extdata/econineq.gpkg', package = 'geocomplexity'))
gc = geocs_vector(dplyr::select(econineq, -Gini))
gc

library(ggplot2)
library(viridis)
ggplot(gc) +
  geom_sf(aes(fill = GC)) +
  scale_fill_viridis(option = "mako", direction = -1) +
  theme_bw()
```

---

gwr\_geoc

*geographical complexity-geographically weighted regression*


---

**Description**

geographical complexity-geographically weighted regression

**Usage**

```
gwr_geoc(
  formula,
  data,
  gcs = NULL,
  alpha = seq(0.05, 1, 0.05),
  bw = "RMSE",
  adaptive = TRUE,
  kernel = "gaussian"
)
```

**Arguments**

formula	A formula of GCGWR model.
data	An sf object or spatial vector object that can be converted to sf by <code>sf::st_as_sf()</code> .
gcs	(optional) The geocomplexity matrix corresponding to each variable, which is calculated by default using <code>geocd_vector()</code> .
alpha	(optional) Balancing the weights of attribute similarity matrix and geographic distance matrix.
bw	(optional) The bandwidth used in selecting models. The optimal bandwidth will be selected based on RMSE by default.
adaptive	(optional) Whether the bandwidth value is adaptive or not. Default is TRUE.
kernel	(optional) Kernel function. Default is gaussian.



**Value**

A list with GCGWR results.

SDF an sf tibble with coefficients, standard errors and t values

diagnostic goodness of fit indicators

args some key parameters

**Examples**

```
## The following code takes a long time to run:
econineq = sf::read_sf(system.file('extdata/econineq.gpkg', package = 'geocomplexity'))
g = gwr_geoc(formula = Gini ~ ., data = econineq,
             bw = "AIC", adaptive = TRUE)
g
```

---

moran_test	<i>global spatial autocorrelation test</i>
------------	--

---

**Description**

Spatial autocorrelation test based on global Moran'I Index.

**Usage**

```
moran_test(sfj, wt = NULL, alternative = "greater", symmetrize = FALSE)
```

**Arguments**

sfj	An sf object or vector object that can be converted to sf by <code>sf::st_as_sf()</code> .
wt	(optional) Spatial weight matrix. Must be a matrix class. If wt is not provided, geocomplexity will use a first-order queen adjacency binary matrix via sdsfun package.
alternative	(optional) Specification of alternative hypothesis as greater (default), lower, or two.sided.
symmetrize	(optional) Whether or not to symmetrize the asymmetrical spatial weight matrix <b>wt</b> by: $1/2 * (wt + wt')$ . Default is FALSE.

**Value**

A list with moran\_test class and result stored on the result tibble. Which contains the following information for each variable:

MoranI observed value of the Moran coefficient

EI expected value of Moran's I

VarI variance of Moran's I (under normality)

ZI standardized Moran coefficient

PI *p*-value of the test statistic

**Note**

This is a C++ implementation of the `MI.vec` function in `spfilterR` package, and embellishes the console output.

The return result of this function is actually a list, please access the result tibble using `$result`.

The non-numeric columns of the attribute columns in `sfj` are ignored.

**Examples**

```
econineq = sf::read_sf(system.file('extdata/econineq.gpkg',package = 'geocomplexity'))  
moran_test(econineq)
```

# Index

geocd\_raster, 2  
geocd\_swm, 3  
geocd\_vector, 4  
geocs\_raster, 5  
geocs\_swm, 6  
geocs\_vector, 7  
gwr\_geoc, 8  
moran\_test, 9