SpatCon Guide

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This document provides information on features, options, and the use of the open source spatial convolution program *SpatCon*; its implementation in the free <u>GTB</u> (GuidosToolbox) and <u>GWB</u> (GuidosToolbox Workbench module: <u>GWB SC</u>) software package, the *SpatCon* standalone version, the *SpatCon* input data requirements and parameter settings. This is a living document. The latest version of this document, and the most recent *SpatCon* source code, is available on <u>GitHub.</u>

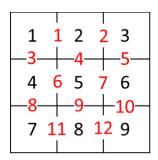
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1. General description

SpatCon implements a moving window analysis of a two-dimensional image (or a map) comprised of pixels (grid cells). It moves a square window across the image, one pixel at a time, accumulating and discarding information along the way. Based on the pixel values in the window on the input image at a given pixel location, a metric is calculated and assigned to that location on the output image. Thus, the output pixel value codes the input context of that pixel location, and the spatial resolution of the input image is preserved. The spatial scale of the analysis is defined by the size of the window¹. All SpatCon metrics are calculated from either (a) the frequencies of different input pixel values in the window, or (b) the pixel value adjacency matrix for the window, which contains the frequencies of different types of pixel value adjacencies in the window. Adjacency is defined by the 4-neighbor rule, and adjacencies at the boundary of the window are ignored. For example, a 3x3 window contains 9 pixels and 12 adjacencies (Fig. 1).

Figure 1. Example 3x3 pixel window containing 9 pixels (numbered in black font) and 12 adjacencies (red font).



¹ Other aspects of scale are defined by the input dataset – spatial resolution (pixel size), spatial extent (image size), and thematic resolution (image legend).

2. Important notes: missing values, re-coding input pixel values, output images

2.1. Missing values

In *SpatCon*, the input image is buffered on all four sides with missing pixel values, where the buffer size is selected so that a full window can be centered on every pixel in the input image². User-defined missing pixels can also occur within the image area. The metrics are calculated based on whatever is in a window, and the user chooses to include or ignore missing values. The result is stored as the location of the output pixel in the center of the window, even if the user has defined that input pixel as missing. For example, suppose that ocean water is defined as missing on an input land cover image. The pattern metric image may have metric values where the ocean water is near the coastline because a portion of the window is not ocean water.

Spatcon always produces a missing value if there is no information in the window to perform a given calculation. For metrics calculated from pixel value frequencies, this can happen when all pixels in the window are missing. For metrics calculated from the frequencies of pixel value adjacencies, this can happen when all requested adjacencies within the window are missing; an adjacency is missing if either of the two adjacent pixels is missing. Thus, it is possible for a window which contains a given pixel value to have no adjacencies for that pixel value, for example a checkerboard image with only one pixel value separated by missing pixels. Adjacencies at the boundary of a window are ignored, i.e., they are not treated as missing data.

While the user may choose to include or ignore missing values in metric calculations, it is recommended to ignore them unless there is a compelling reason to include them. If they are included, then it may be difficult to interpret some of the metrics (see section 4). This is because the *SpatCon* INTERNAL pixel value for missing data is ALWAYS zero. That is, the user may define a non-zero input pixel value to be missing, but that value is converted to an internal zero for metric calculations.

2.2. Re-coding pixels

If requested, *SpatCon* will re-code the input pixel values using a user-specified lookup table. The *SpatCon* parameters m, a, and b must refer to input pixel values AFTER the requested re-coding.

2.3. Output maps

In an 8-bit output map, the missing value is always 0 (zero). In a 32-bit output map, the missing value is always -0.01.

The default output format is 8-bit (byte). However, many of the metrics are computed as float values, and the re-scaling to byte values in the range [1,255] is done as byte value = (float value * 254) + 1. Note that a true zero metric value is stored as the number 1, reserving metric value zero for missing values. The user may re-scale byte output to float output in other software: float value = (byte value -1) / 254 (or simply select float output from SpatCon).

² If w is the side length of the window, the buffer width is (w-1)/2 pixels. For a pixel at the corner of a rectangular image, at least $\frac{3}{4}$ of the window is in the buffer area. The buffer area is removed before writing the output image.

2.4. Hardware requirement

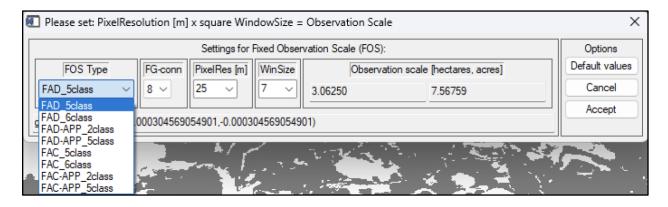
Available RAM (GB)³: For byte output, approximately 2 x image size in GB = number of rows x number of columns / 1024^3 . For float output, approximately 5 x image size in GB. For example, the RAM requirements for processing an image having 100,000 rows and 75,000 columns: uncompressed image size in GB = $100000 \times 75000 / 1024^3 = 6.98492$ GB. With a factor of 5, the *SpatCon* float output processing requires approximately 35 GB of available RAM. Please note that your access to the system available free RAM may be limited on a multi-user system.

On multi-core machines, all cores that are available within the executing shell will be used (default). To use fewer cores, perform the optional environment setting (Section 5) before executing GWB SC.

3. SpatCon parameters

GWB_SC – providing access to all SpatCon metrics: the *SpatCon* parameters are specified in the file sc-parameters.txt. Each line has a parameter code (a letter), a space, and a parameter value *X* (a number). Parameters that are not needed for the selected metric are ignored. Important: The *SpatCon* parameters m, a, and b refer to values AFTER optional re-coding. GWB_SC will apply the *SpatCon* parameters to all (Geo)TIFF-images placed in the directory *input/*.

GTB – providing access to a <u>GTB-customized</u> subset of SpatCon metrics (R 6-LM, 7-LM, 76-Clustering, 77-Contagion, 81-Density) only: the file gsc-parameters.txt is written automatically after collecting all parameter settings via a dedicated popup window (below). The settings of this popup window are applied to either, the currently loaded image (GTB menu: Image Analysis \rightarrow Pattern \rightarrow Moving Window) or (GTB menu: Image Analysis \rightarrow Fragmentation), or to all images specified for batch-processing (GTB menu: File \rightarrow Batch Process \rightarrow Fragmentation or Pattern \rightarrow Moving Window).



³ It is strongly recommended to NOT use swap space for large images because disk I/O speed is a major constraint. For large images, it is recommended to use the module <u>GWB_SPLITLUMP</u> to run <u>GWB_SC</u> on a set of overlapping stripes of input data.

SpatCon parameter listing:

Required:

- R x = *SpatCon* metric. Permitted values: 1, 6, 7, 10, 20, 21, 51, 52, 53, 54, 71, 72, 73, 74, 75, 76, 77, 78, 81, 82, 83
- W x = window size. the number of pixels on the side of a x*x window (e.g., W 5 for a 5x5 window), must be an odd and positive integer number > 1 (e.g., 3,5,7,9...), maximum must be smaller than the x or y dimension of the input map.

Required for some metrics:

- A x = First target code. Required for metric 75, 76, 77, 78, 81, 82, 83. Default = 0.
- B x = Second target code. Required for metric 76, 78, 82, 83. Default = 0.

Optional:

- H x = How missing pixels or adjacencies are handled during metric calculation. 1 = Ignore (default). 2 = Include in calculations. The value 2 is not available for metric 21, 82, 83.
- F x = Output precision. 0 = 8-bit byte (default). 1 = 32-bit float. Float is not available for metric 1, 6, 7, 10.
- Z x = Request re-code of input pixels. 0 = No (default). 1 = Yes
- M x = missing value. Specifies which pixel value is missing, AFTER optional re-coding. Default = 0.

3.2. Re-coding input pixel values (optional)

The re-coding parameters are specified using the GWB REC module input file rec parameters.txt.

4. SpatCon metrics.

Below, R x refers to metric number x, which is selected by the R parameter.

• R 1: Majority (most frequent) pixel value

Description: the most frequent pixel value in the window.

Notes:

- 1. How are ties handled? During image input, the pixel values are re-coded for internal storage, and this depends on the order in which a new pixel value is encountered on the input image. If there is a tie for the majority, the lowest re-coded pixel value is returned.
- 2. Float output not available.
- R 6: Landscape mosaic (19-class version), and
- R 7: Landscape mosaic (103-class version)

Description: classification of the window based on the relative frequency of three different pixel values.

Notes:

- 1. The classification model is a tri-polar (ternary) chart, with the three axes corresponding to the proportions of input pixel values 1, 2, and 3. See the Landscape Mosaic <u>product sheet</u> for additional description and examples.
- 2. The non-missing pixels in the image (after optional re-coding) must be in 1, 2, 3 only.
- 3. Float output not available.

• R 10: Number of unique pixel values

Description: the number of unique pixel values in the window.

Notes:

1. Float output not available.

R 20: Median pixel value

Description: the median pixel value in the window.

Notes:

- 1. Calculated by constructing the cumulative distribution of pixel values. The median pixel value is the one for which the cumulative number of pixels first exceeds 50% of the total number of pixels.
- 2. If missing values are included in the calculation, they are represented by internal pixel value 0 (zero), which complicates interpretation.
- 3. This metric is not interpretable for categorical input data; input data should be ordinal or numeric.
- 4. While float output is available, the result is always an integer value because of the way the median is calculated, and byte output is recommended.
- 5. An input pixel value of 0 is assumed to be missing data⁴.

• R 21: Mean pixel value

Description: the mean (arithmetic average) pixel value in the window.

Notes:

- 1. Calculated as the sum of pixel values divided by the number of pixels, rounded to the nearest byte value.
- 2. Missing values are always excluded; the parameter "h" has no effect.
- 3. This metric is not interpretable for categorical input data; input data should be ordinal or numeric.
- 4. An input pixel value of 0 is assumed to be missing data (see footnote to R20).

• R 51: Gini-Simpson pixel diversity

Description: measures pixel value diversity in the window; larger numbers indicate lower diversity. Notes:

- 1. The Gini-Simpson index equals one minus Simpson's classical index; larger values indicate lower diversity.
- 2. Let Pi be the proportion of the i-th pixel value (Fig. 2). The index is calculated as ($1 \sum (Pi^*Pi)$).
- 3. May be difficult to interpret when missing values are included.

⁴ This can be awkward if zero is supposed to represent a real value of zero, instead of being treated as missing data. The user must rescale the input data, e.g., from [0, 100] to [1, 100], and assign pixel value zero to "true missing" pixels.

Figure 2. Illustration of the tabulation of Fi and calculation of Pi on an input image with four unique pixel values (N = 4).

Input image with four pixel values, 25 pixels, and 40 adjacencies

1	4	4	1	2
1	2	1	2	1
2	2	1	3	1
1	1	1	1	1
1	1	2	2	2

Frequency	Proportion
(Fi)	(Pi)

	(Fi)	(Pi)
1	14	0.56
2	8	0.32
3	1	0.04
4	2	0.08
um	25	1.00

• R 52: Gini-Simpson pixel evenness

Description: measures pixel value evenness in the window; larger numbers indicate higher evenness. Notes:

- 1. Calculated as the observed Gini-Simpson pixel diversity index divided by the maximum Gini-Simpson pixel diversity index, where the maximum index depends on the number of unique pixel values.
- 2. Let Pi be the proportion of the i-th pixel value (Fig. 2), and let N be the number of unique pixel values. The maximum Gini-Simpson index, obtained when all Pi are the same value, equals 1-1/N. The metric is calculated as $(1-\sum(Pi^*Pi))/(1-1/N)$. The potential divide-by-zero error for the case of only one pixel value is avoided by setting the index in that case to the maximum (1.0 float, 255 byte).
- 3. May be difficult to interpret when missing values are included.

R 53: Shannon pixel evenness

Description: measures pixel value evenness in the window; larger numbers indicate higher evenness. Notes:

- 1. Calculated as the classical Shannon diversity index divided by the maximum Shannon index, where the maximum depends on the number of unique pixel values.
- 2. Let Pi be the proportion of the i-th pixel value (Fig. 2), and let N be the number of unique pixel values. Shannon diversity equals $-\sum(Pi^*log(Pi))$, and larger values indicate lower diversity (hence, higher evenness). The maximum diversity, obtained when all Pi are the same, equals log(N). The metric is calculated as $-\sum(Pi^*log(Pi)) / log(N)$. The potential divide-by-zero error for the case of only one pixel value is avoided by setting the index in that case to the maximum (1.0 float, 255 byte).
- 3. May be difficult to interpret when missing values are included.

• R 54: Pmax

Description: The proportion of the total number of pixels having the most frequent pixel value. Notes:

1. The proportion of each unique pixel value is computed (Fig. 1), and Pmax is the maximum of those proportions.

Note for adjacency metrics R 71 - R 78:

These metrics are derived from the attribute adjacency matrix in the window. Let M be a t X t adjacency matrix where t is the number of unique pixel values, and the cells of M contain Fij, the frequency of pixel adjacencies of type i|j (i.e., a pixel of value i adjacent to a pixel of value j) within a window. Window boundary adjacencies are excluded. (Fig. 1).

Spatcon provides several metrics related to the classical "contagion" metric from the landscape ecology literature, which was first developed to measure the tendency for individual pixel values to appear "clumped together" on an image. These classical metrics typically preserved the order of pixels in each pair, such that i|j was tabulated separately from the pair j|i (Fig. 3). For consistency with the literature at that classical time, the SpatCon algorithms for R 71, R 72, and R 73 preserve pixel order. It must be noted, however, that the order for a given pair of pixels arbitrarily depends on the adjacency rule by which a set of pixel pairs is tabulated. Riitters et al. (1996) investigated this dependence on pixel order (and other aspects of constructing the attribute adjacency matrix). They concluded that the classical contagion metrics measure the entropy of the entire adjacency matrix (i.e., not specifically the lack of entropy due to clumping alone⁵), and proposed R 74 as an alternative metric that is more robust to clumping alone.

Pixel order is not relevant for *SpatCon* metrics R 75, R 76, R 77, and R 78 which describe one or two specific types of pixel adjacencies. For these metrics, the adjacency i|j to equivalent to the adjacency j|i (Fig. 4). For i \neq j, the total number of adjacencies between pixel values 1 and 2 equals Fi,j_j + Fj,i. For i = j, the total number is Fi,i. In the following examples for these metrics (Figs. 5 – 8), the first target code = 1 for clarity of presentation, but the first target code can be any valid pixel value.

Figure 3. Illustration of the tabulation of Fij and calculation of Pij on the input image (Fig. 2) with four unique pixel values (t = 4), preserving the order of pixel values in adjacent pixel pair, for metrics R 71, R 72, R 73. In this example, the adjacency rule is left|right and top|bottom, thus tabulating each adjacency only one time. Metric R 74 is the sum of the proportions on the diagonal.

Frequency	/r::\
Frequency	(+11)

	1	2	3	4	Sum
1	12	9	1	1	
2	6	4	1	0	
3	2	0	0	0	
4	2	1	0	1	
Sum					40

Proportion (Pij)

	1	2	3	4	Sum
1	0.300	0.225	0.025	0.025	
2	0.150	0.100	0.025	0	
3	0.050	0	0	0	
4	0.050	0.025	0	0.025	
Sum					1.000

⁵ In the attribute adjacency matrix, entropy can be lower if the diagonal elements are large (due to tendency for a given pixel value to be adjacent to itself, i.e., clumping), or if the non-diagonal elements are large (due to tendency for two different pixel values to be adjacent.

Figure 4. Illustration showing the adjacency matrix for the input image (Fig. 2) when not preserving the order of pixels in pairs (c.f., Fig. 3). This form of the adjacency matrix is used for R 75, R 76, R 77, and R 78.

	1	2	3	4	Sum
1	12	15	3	3	
2		4	1	1	
3			0	0	
4				1	
Sum					40

• R 71: Angular second moment

Description: Haralick's classical texture metric.

Notes:

- 1. Haralick's metric is essentially Simpson's diversity index (c.f., R 51) applied to frequencies of pixel value adjacencies instead of the frequencies of pixel values.
- 2. Let Pij be the proportion of total adjacencies which are of adjacency type i|j (Fig. 3). Angular second moment equals $\sum (Pij^*Pij)$.
- 3. May be difficult to interpret when missing values are included.

• R 72: Gini-Simpson adjacency evenness

Description: Analogous to Gini-Simpson's pixel evenness index (R 52), measures the evenness of the adjacency frequencies.

Notes:

- 1. Calculated as an observed index divided by the maximum index, where the maximum index depends on the number of possible types of adjacencies, which depends on the number of unique pixel values in the window.
- 2. Let Pij be the proportion of total adjacencies which are of adjacency type i|j (Fig. 3), and let t be the number of unique pixel values in the window. The observed index equals $1 \sum (Pij^*Pij)$ (c.f., R71). The maximum index, obtained when all Pij = $1/t^2$, equals $1 (1 / (t^2))$. The metric is calculated as $1 [[1 \sum (Pij^*Pij)] / [1 (1 / (t^2))]]$.
- 3. May be difficult to interpret when missing values are included.

R 73: Shannon adjacency evenness

Description: "Classical" contagion in the landscape ecology literature, derived by O'Neill et al (1988) with a correction by Li and Reynolds (1993), is analogous to Shannon's pixel evenness index (R 53). Notes:

- 1. Calculated as an observed index divided by the maximum index, where the maximum index depends on the number of possible types of adjacencies, which depends on the number of unique pixel values in a window.
- 2. Let Pij be the proportion of total adjacencies which are of adjacency type i | j (Fig. 3). Let t be the number of unique pixel values. The observed index equals -1 * $\sum Pij*log(Pij)$. The maximum index value, obtained when all Pij = $1/t^2$, equals 2*log(t). The metric is calculated as $1 [[-1 * \sum Pij*log(Pij)] / [2*log(t)]]$.
- 2. Larger values indicate less entropy in the attribute adjacency matrix, which may be related to clumping.
- 3. May be difficult to interpret when missing values are included.
- 4. The potential error in the logarithm function is avoided by assuming log(0) = 0.

• R 74: Sum of diagonals

Description: a measure of overall contagion (clumping) considering all pixel values in a window. Notes:

- 1. Calculated as the total number of pixel-value adjacencies that are self-adjacencies, divided by the total number of adjacencies. Let Pii be the proportion of total adjacencies which are of type i|i (Fig. 3). The metric is calculated as ∑Pii.
- 2. Larger values indicate more clumping over all pixel values in the window.
- 3. May be difficult to interpret when missing values are included.

• R 75: Proportion of total adjacencies involving a specific pixel value.

Description. The relative frequency of pixel adjacencies involving a specific pixel value.

Notes:

- 1. Calculated for the specified pixel value as the sum of adjacencies involving the specific pixel value divided by the total number of adjacencies in a window (Fig. 5).
- 2. The specific pixel value is selected by the input parameter "first target code".
- 3. In this metric, the adjacency could be an adjacency between pixels with the same pixel value.

Figure 5. Illustration of the calculation of R75 for the adjacency matrix in Fig. 4.

	1	2	3	4	Sum
1	12	15	3	3	33
2		4	1	1	
3			0	0	
4				1	
Sum					40

R75. Proportion of total adjacencies involving a specific pixel value. First target code = 1. Calculation:

33 / 40 = 0.825

• R 76: Proportion of total adjacencies which are between two specific pixel values.

Description: The relative frequency of a specific type of pixel value adjacency in the window. Notes:

- 1. Metric is calculated as the frequency of adjacencies for two specific pixel values, divided by the total number of adjacencies (Fig. 6).
- 2. The two specific byte values are selected by the input parameters first target code and second target code. The order of the two target codes is not important
- 3. The two target codes may be the same value (Fig. 6).

Figure 6. Illustration of the calculation of R 76 for the adjacency matrix in Fig. 4.

	1	2	3	4	Sum
1	12	15	3	3	33
2		4	1	1	
3			0	0	
4				1	
Sum					40

R76. Proportion of total adjacencies which are between two specific pixel values. First target code = 1. Second target code = 3. Calculation: 3 / 40 = 0.075

If the first and second target codes = 1, The calculation is 12/40 = 0.300

• R 77: Proportion of adjacencies involving a specified pixel value which are adjacencies with that same pixel value.

Description: Describes the contagion or clumping of the specified pixel value.

Notes:

- 1. The metric is calculated for the specified pixel value as the number of same value adjacencies divided by the total number of adjacencies involving that pixel value (Fig. 7).
- 2. The value indicates pixel value "contagion."
- 3. The specific pixel value is selected by the input parameter "first target code."
- 4. If "fragmentation" is the opposite of "contagion," then the metric complement (1 R 77) indicates "fragmentation" of the specific pixel value, which is relevant when using R 78.

Figure 7. Illustration of the calculation of R 77 for the adjacency matrix in Fig. 4.

	1	2	3	4	Sum
1	12	15	3	3	33
2		4	1	1	
3			0	0	
4				1	
Sum					40

R77. Proportion of adjacencies involving a specified pixel value which are adjacencies with that same pixel value.

First target code = 1.

Calculation:

12 / 33 = 0.364

• R 78: Proportion of adjacencies involving a specific pixel value which are adjacencies between that pixel value and another specific pixel value.

Description: The relative contribution of the second pixel value ("second target code") to the adjacencies involving the first pixel value ("first target code") (c.f., R 77).

Notes:

- 1. The metric is calculated for the two specified pixel values as the number of pixel adjacencies of that type, divided by the total number of adjacencies involving the first pixel value (Fig. 8).
- 2. Repeating this metric for other selections of the second pixel value allows partitioning the "fragmentation" of the first pixel value (<u>Wade et al. 2003</u>).
- 3. The specific pixel values are selected by the input parameters "first target code" and "second target code". The order of target codes is important. If the two target codes are the same, the result is the same as for R 77.

Figure 8. Illustration of the calculation of R 78 for the adjacency matrix in Fig. 4.

	1	2	3	4	Sum
1	12	15	3	3	33
2	1	4	1	1	
3			0	0	
4				1	
Sum					40

R78. Proportion of adjacencies involving a specific pixel value which are adjacencies between that pixel value and another specific pixel value.

First target code = 1.

Second target code = 3.

Calculation:

3/33 = 0.091

The remaining metrics are based on the frequencies of different pixel values (Fig. 2).

R 81: Area density.

Description: the proportion of a window that is a specific pixel value.

Notes:

- 1. Calculated as the number of pixels of first target code divided by the total number of pixels in a window.
- 2. Interpretation as fragmentation: if the specified pixel value was not fragmented, then R 81 = 1.0, and departures from that baseline indicate fragmentation.
- 3. It is arguably the basic measure of fragmentation because all other measures of fragmentation (e.g., 1
- -R 77) depend on area density; the simplest example is that if R 81 = 1 then 1 R 77 must equal 0.
- 4. Riitters et al. (2000) developed a fragmentation classification based on (R 81, R 77).

• R 82: Ratio of the frequencies of two specific pixel values.

Description. Ratio of the frequencies of two specified pixel values.

Notes:

- 1. Calculated as the number of pixels of the "first target code" divided by the number of pixels of the "second target code". The order of target codes is important.
- 2. If byte output is requested, the calculated ratio is mapped to values in [1, 255] as follows. Let n1 and n2 be the number of pixels of target codes 1 and 2 respectively.

If n1 > 0 and n2 = 0 then value = 255.

If n1 = 0 and n2 > 0 then value = 1.

If n1=n2=0 then value = 0 (missing).

If n1=n2 then value = 128.

If n1 > n2 the value increases with n1 from 129 to 254.

If n1 < n2 the value decreases with n2 from 127 to 2.

• R 83: Combined ratio of two specific pixel values.

Description: Ratio of the frequency of a specified pixel value to the sum of frequencies of that pixel value and a second specified pixel value.

Notes:

1. Calculated as the number of pixels of first target code divided by the sum of the numbers of pixels of first target code and second target code. The order of target codes is important.

5. Compiling and using SpatCon in standalone mode

This section is relevant ONLY if you are NOT using GTB or GWB_SC to access *SpatCon*. If you ARE using GTB or GWB_SC, then ignore this section and refer to the GWB_SC usage notes (Section 3).

Compiling and environment

Linux gcc:

gcc -std=c99 -m64 -O2 -Wall -fopenmp spatcon.c -o spatcon -lm -static /usr/lib/gcc/x86_64-linux-gnu/10/libgomp.a

macOS gcc:

/usr/local/bin/gcc-8 -std=c99 -m64 -O2 -Wall -fopenmp spatcon.c -o spatcon_mac -lm -ldl -static-libgcc /usr/local/Cellar/gcc@8/8.5.0/lib/gcc/8/libgomp.a

MS-Windows with mingw64:

```
gcc -std=c99 -m64 -O2 -Wall -fopenmp spatcon.c -o spatcon.exe -lm -D__USE_MINGW_ANSI_STDIO
```

SpatCon ran originally in *classic mode* which has some strange handling of I/O filenames. It is normally easier to run in *GUIDOS* mode, which hardwires all the I/O filenames.

SpatCon recognizes an optional environment variable to specify number of cores to use. If this is not specified, then *SpatCon* will use all cores of the operating system.

Examples for N cores:

Linux *csh family of shells: setenv OMP_NUM_THREADS N Linux all other shells: export OMP_NUM_THREADS=N Windows: set OMP_NUM_THREADS=N

Classic Mode:

See Section 3 for description and format of parameter file.

```
./spatcon <arg1> <arg2> <arg3>
```

arg1 =input file (8-bit; note that a .bsq extension will be added by spatcon)

arg2 =output file (note that a .bsq extension will be added)

arg3 =parameter file

The program looks in the current directory for:

Required: An 8-bit bsq input file <arg1>.bsq.

Required: A text file <arg1>.siz, which contains two lines:

nrows xxxxx where xxxx is the number of rows in the input file

ncols yyyyy where yyyy is the number of columns in the input file

Required: A text file (any name) which contains the run parameters

Optional: If re-coding is requested, a text file <arg1>.rec, which contains a re-coding lookup table.

Output. The program writes the output file <arg2>.bsq into the current directory.

Note: all filenames have a 500-character limit.

Guidos Mode:

See Section 3 for description and format of parameter file.

./spatcon

The program looks in the current directory for:

Required: scinput an 8-bit input file

Required: scsize.txt, which contains two lines:

nrows xxxxx where xxxx is the number of rows in the input file ncols yyyyy where yyyy is the number of columns in the input file

Required: scpars.txt parameter file

Optional: If recoding is requested, a text file screcode.txt a re-coding lookup table

Output. The program writes the output file scoutput into the current directory.

Format of optional re-code file:

Important: The SpatCon parameters M, A, and B refer to values AFTER optional re-coding.

Each line has two numbers separated by a space: <old value> <space> <new value>

Old values that are not listed will not be re-coded.

All old and new values must be in the range [0, 255].

The old values can appear in any order.

If an old value appears on more than one line, the last one listed will be used.

Hints:

Can be used to set the M, A, and B parameters according to subsets (aggregations) of the input pixel values.

Example:

25 0 (if the M parameter is zero, then pixel value 25 is considered missing)

15 1

16 1 (In this case, both input values 15 and 16 are both re-coded to value = 1)

18 134

18 55 (In this case the old value 18 is new value 55, not 134)

...

File formats:

SpatCon accepts input as 8-bit (Geo)TIFF images and automatically converts SpatCon output to a 8-bit or 32-bit (Geo)TIFF images. In standalone mode, SpatCon I/O supports only the BSQ data format, which is sometimes referred to as ENVI format, which is a flat, binary series of 8-bit (or 32-bit) pixel values. Importantly, SpatCon does not support the standard BSQ header files, and a little work is needed to set up the SpatCon input size parameter file, and the metadata files that image format translators expect to convert SpatCon BSQ output to some other format.

To prepare an input BSQ, one option is gdal_translate, for example: gdal_translate -of ENVI -ot Byte <filename>.tif <spatcon input file name>.bsq

Another option is QGIS, exporting an image in ENVI format with output filename ending in .bsq. Another GIS option is ArcMap, exporting an image in BSQ format. The choice of output file names should conform to either *classic* or *GUIDOS* mode (see above).

To prepare the required size parameter file for *SpatCon* (see above), the user must inspect the resulting *.hdr files to learn the number of rows and columns in the image. The number of rows is often labeled as lines or NROWS, and the number of columns is often labeled as samples or NCOLS.

To view the output file in an image viewer or use the file in a GIS, it is necessary to construct appropriate header files for the output BSQ image. When the *SpatCon* output file is 8-bit, this can usually be done by copying the input header file to the output header file, e.g., from <input>.hdr to <output>.hdr (some GIS

also require copying the *.prj file, but do not copy any other files), and then running the appropriate gdal_translate or GIS import command.

When the *SpatCon* output file is 32-bit, the same general procedure can be used, except the header file (*.hdr) must be edited after copying, so that the output file is interpreted as 32-bit values instead of 8-bit values. When using the ENVI specification, the data type should be 3 (signed 32-bit integer) instead of 1 (8-bit unsigned integer). With ArcMap BSQ it is a little more complicated, changing NBITS from 8 to 32, and changing both BANDROWBYTES and TOTALROWBYTES to be 4 times the value given for the input 8-bit image, and ensuring the NODATA value (if used), is zero.

The above suggestions do not cover the range of format or software possibilities but should be enough to guide a knowledgeable user.

6. SpatCon history.

In 1992 my transition into the field of landscape ecology was marked by the development of a computer program (*landstat.c; landscape statistics*⁶) to calculate a suite of landscape pattern metrics from a categorical raster map (<u>Riitters et al. 1995</u>). In 1994, inspired by <u>Baker and Cai (1992)</u>, I developed a moving window implementation (*spatcon.c; spatial convolution*) for several of the *landstat* metrics, and added a few more, thus permitting pixel-level mapping of landscape patterns as measures of landscape context (<u>Riitters et al. 1997</u>). *SpatCon* and *landstat* were personal research tools for exploring the questions of what to measure, how, and why (<u>Riitters 2019</u>). As such, documentation and distribution were always a low priority, and code obfuscation is the natural result of 30 years of modifying the original code only enough to not break it.

As part of a long-standing research collaboration, Peter Vogt (European Commission, Joint Research Centre, Ispra) began including a *SpatCon* executable in some of his <u>image analysis software</u> (<u>Vogt and Riitters 2017</u>; <u>Vogt et al. 2022</u>), thus providing both desktop and server-based access to several of the *SpatCon* metrics which had proven most useful in our collaborative research. Peter also developed user guides to explain what those metrics are and how they can be used within his <u>GuidosToolBox</u> and <u>GuidosToolbox Workbench</u>. In 2022, Peter suggested that some users may be interested in some of the original yet hidden *SpatCon* metrics, which prompted this current effort to better document what those metrics are for the GWB_SC module.

⁶ Originally "land.c (air)," to measure sunfleck patterns on photographs, but never used for that purpose.

7. Programming notes

The *SpatCon* author is not a professional programmer. As research tools, the code was typically obfuscated, the documentation did not exist, there was no tech support, and the error messages were enigmatic, yet it was all sufficient for my purposes. The objective of the current effort is to improve the documentation for use of *spatcon.c* within the GWB_SC module.

The moving window algorithm in *SpatCon* is very efficient because (a) the entire window needs to be evaluated only for the first pixel on a given row of the map – for subsequent steps in that row the accumulator is updated only according to the changing contents of the leading and trailing columns of the window⁷, and (b) the algorithm is parallelized over the input rows⁸.

The evolving uses of *SpatCon* took advantage of improved hardware without making substantial changes to the code. The original coding was on a PC-386⁹ which was okay for coding and testing, and while my work environment provided a Sparc10 (64MB RAM), there was still a problem with *SpatCon* applications to the relatively large, high-resolution digital raster maps which were becoming available by the mid-90's (Riitters et al. 1997). This problem was solved by tiling the input map into overlapping tiles (*splitter.c*), executing *SpatCon* on each tile, and collecting the output tiles into a single map at the end (*lumper.c*). In this way it was feasible to process the first available 30-m resolution land cover map of the continental U.S. (~9.1 x 10⁹ pixels) on a new Ultra60 (1.5GB RAM) as if it was just one big map (Riitters et al. 2002). In 2002, I began automating tile processing on a Linux cluster¹⁰ with the Portable Batch System. The cluster became obsolete with the acquisition of a dual quad-core workstation with 128GB RAM in 2012; GOMP-assisted parallel processing¹¹ came soon after, as the major hardware constraint shifted from "RAM-limited" to "core-limited." With parallel processing on modern (2022) workstations, disk I/O typically accounts for >95% of the total execution time.

Compared to the original code in 1994, most code changes involved simplifications rather than improvements. There is no longer a need to support, among other things, byte-swapping (Motorola/Intel chips), conditional compilation (ANSI/K&R C), weird data formats (e.g., *.pcx, *.xwd, and Arc/INFO ASCII), or user selection of the window step size and output pixel resolution. The important improvements include the addition of several metrics and parallel processing, and compatibility with the software packages GuidosToolBox and GuidosToolbox Workbench.

⁷ This "subtract from the left and add from the right" logic was self-evident when working on a 16 Mhz 386 chip in 1994, but someone did publish a paper on it ~25 years later. I also did not publish my independent rediscovery of two other famous algorithms while writing *landstat.c* – flood-filling for patch identification and wall-following for perimeter identification.

⁸ It cannot be parallelized over the columns in a row because the accumulator is updated serially within a row.

⁹ Around 1990 I recycled some 286 components to build a 386 machine, with appreciation for Aubrey Pilgrim's 1988 book "Build your own 80386 IBM compatible and save a bundle." I learned C on DOS via Watcom C 8.0/386+DOS4G extender to take advantage of the 386's 32-bit memory addressing.

¹⁰ A compute node was typically a rack-mounted dual Pentium III 866, 1.5GB RAM, small disk, and network card; all cheap and unreliable from eBay. The Ultra60 became the head node serving a NFS filesystem and running shell scripts to automate batch queue submissions. This homemade cluster achieved a maximum of 24 cores running on 14 nodes.

¹¹ Remarkably, only one line of new code and rearrangement of accumulator memory management.