

# Package ‘leafR’

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**Type** Package

**Title** Calculates the Leaf Area Index (LAD) and Other Related Functions

**Version** 0.3.5

**Description** A set of functions for analyzing the structure of forests based on the leaf area density (LAD) and leaf area index (LAI) measures calculated from Airborne Laser Scanning (ALS), i.e., scanning lidar (Light Detection and Ranging) data. The methodology is discussed and described in Almeida et al. (2019) <[doi:10.3390/rs11010092](https://doi.org/10.3390/rs11010092)> and Stark et al. (2012) <[doi:10.1111/j.1461-0248.2012.01864.x](https://doi.org/10.1111/j.1461-0248.2012.01864.x)>.

**Imports** lidR, sp, data.table, raster, stats

**License** GPL-3

**Encoding** UTF-8

**RoxygenNote** 7.1.1

**URL** <https://github.com/DRAAlmeida/leafR>,  
<https://leafR.r-forge.r-project.org>

**BugReports** <https://github.com/DRAAlmeida/leafR/issues>

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FHD	<i>Foliage Height Diversity</i>
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### Description

Calculates the foliage height diversity (FHD) metric from abundances considered as per-voxel relative LAD values, as described in MacArthur and MacArthur (1961).

### Usage

```
FHD(lad_profile, evenness = FALSE, LAD.threshold = -1)
```

### Arguments

lad_profile	a data.frame including values of relative LAD at height intervals, output of the lad.profile function (use relative = TRUE)
evenness	boolean, defines whether FHD should be based on Shannon's diversity or evenness (Hill 1973). The default FALSE calculates Shannon diversity as the original FHD by MacArthur and MacArthur (1961); the alternative TRUE was recommended by Valbuena et al. (2012), and it calculates Shannon evenness dividing it by the natural logarithm of the number of number of voxels with LAD values above the threshold.
LAD.threshold	numerical (0,1), defines the minimum value of LAD for considering the relative leaf abundance of a voxel in FHD calculation. Defaults to the inverse of the total number of voxels.

### Value

A `numeric` containing the Foliage Height Diversity calculated from the Leaf Area Density profile

## References

- Hill M. O. (1973) Diversity and evenness: a unifying notation and its consequences. *Ecology*. 54: 427–432. doi: [10.2307/1934352](https://doi.org/10.2307/1934352)
- MacArthur R.H., MacArthur J.W. (1961). On bird species diversity. *Ecology* 42: 594–598. doi: [10.2307/1932254](https://doi.org/10.2307/1932254)
- Valbuena R., Packalen P., Martín-Fernández S., Maltamo M. (2012) Diversity and equitability ordering profiles applied to the study of forest structure. *Forest Ecology and Management* 276: 185–195. doi: [10.1016/j.foreco.2012.03.036](https://doi.org/10.1016/j.foreco.2012.03.036)

## Examples

```
# Get the example laz file
normlas.file = system.file("extdata", "lidar_example.laz", package="leafR")

# Calculate LAD from voxelization
VOXELS_LAD = lad.voxels(normlas.file,
                        grain.size = 2)

# Calculate the LAD profile
lad_profile = lad.profile(VOXELS_LAD, relative = TRUE)

FHD(lad_profile, evenness = FALSE)
FHD(lad_profile, evenness = TRUE)
```

---

GC

*Gini coefficient of foliage structural diversity*

---

## Description

Calculates the Gini coefficient (GC) from individual LIDAR returns (i.e. without voxelization), as described for the L-coefficient of variation (equivalent to Gini) in Valbuena et al. (2017).

## Usage

```
GC(normlas.file, threshold = 1)
```

## Arguments

normlas.file	normalized las file
threshold	numerical, defines the minimum height considered to represent an echo from leaves.

## Value

A **numeric** containing the Gini coefficient (GC) calculated from the normalized LAS file

**Note**

Valbuena et al. (2012) argues on why Gini is better suited to describe structural complexity the Foliage Height Diversity or the Gini-Simpon index.

**References**

Valbuena R., Packalen P., Martín-Fernández S., Maltamo M. (2012) Diversity and equitability ordering profiles applied to the study of forest structure. *Forest Ecology and Management* 276: 185–195. doi: [10.1016/j.foreco.2012.03.036](https://doi.org/10.1016/j.foreco.2012.03.036) Valbuena R., Maltamo M., Mehtätalo L., Packalen P. (2017) Key structural features of Boreal forests may be detected directly using L-moments from airborne lidar data. *Remote Sensing of Environment*. 194: 437–446. doi: [10.1016/j.rse.2016.10.024](https://doi.org/10.1016/j.rse.2016.10.024)

**Examples**

```
# Get the example laz file
normlas.file = system.file("extdata", "lidar_example.laz", package="leafR")

GC(normlas.file, threshold =1)
```

---

GS *Gini-Simpson index of foliage structural diversity*

---

**Description**

Calculates the Gini-Simpson (GS) index metric (i.e. complement of Simpson diversity  $(1 - \gamma)$ ) from abundances considered as per-voxel relative LAD values.

**Usage**

```
GS(lad_profile, evenness = FALSE, LAD.threshold = -1)
```

**Arguments**

lad_profile	a data.frame including values of relative LAD at height intervals, output of the lad.profile function (use relative = TRUE)
evenness	boolean, defines whether GS should be based on Simpson's diversity or evenness (Hill 1973). The default FALSE calculates Simpson's diversity ( $\gamma$ ); the alternative TRUE was recommended by Valbuena et al. (2012), and it divides by the number of voxels with LAD values above the threshold, following Smith and Wilson (1996).
LAD.threshold	numerical (0,1), defines the minimum value of LAD for considering the relative leaf abundance of a voxel in GS calculation. Defaults to the inverse of the total number of voxels.

**Value**

A **numeric** containing the Gini-Simpson index calculated from the Leaf Area Density profile

## References

- Hill M. O. (1973) Diversity and evenness: a unifying notation and its consequences. *Ecology*. 54: 427–432. doi: [10.2307/1934352](https://doi.org/10.2307/1934352)
- Smith B., and Wilson J.B. (1996). A consumer's guide to evenness indices. *Oikos* 76: 70–82. doi: [10.2307/3545749](https://doi.org/10.2307/3545749)
- Valbuena R., Packalen P., Martín-Fernández S., Maltamo M. (2012) Diversity and equitability ordering profiles applied to the study of forest structure. *Forest Ecology and Management* 276: 185–195. doi: [10.1016/j.foreco.2012.03.036](https://doi.org/10.1016/j.foreco.2012.03.036)

## Examples

```
# Get the example laz file
normlas.file = system.file("extdata", "lidar_example.laz", package="leafR")

# Calculate LAD from voxelization
VOXELS_LAD = lad.voxels(normlas.file,
                        grain.size = 2)

# Calculate the LAD profile
lad_profile = lad.profile(VOXELS_LAD, relative = TRUE)

GS(lad_profile, evenness = FALSE)
GS(lad_profile, evenness = TRUE)
```

---

k.coefficient	<i>Calculate k coefficient provided a known real LAI and the calculated LAI</i>
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---

## Description

Calculate k coefficient provided a known real LAI and the calculated LAI

## Usage

```
k.coefficient(lidar.lai, real.lai = 6)
```

## Arguments

lidar.lai	the output from lai() function
real.lai	numeric, known real LAI

## Value

A **numeric** with the calculate value for k coefficient for calibrating the real LAI from calculated LAI.

**Examples**

```

normlas.file = system.file("extdata", "lidar_example.laz", package="leafR")

# Calculate LAD from voxelization
VOXELS_LAD = lad.voxels(normlas.file,
                        grain.size = 2)

# Calculate the LAD profile
lad_profile = lad.profile(VOXELS_LAD)

# Calculate LAI derived from LAD profile
lidar.lai = lai(lad_profile); lidar.lai

# The real LAI was measured in the field work for validation
k.coefficient(lidar.lai, real.lai = 6)

```

---

lad.profile

*This function calculate the lad profile from the input lad.voxels*


---

**Description**

This function calculate the lad profile from the input lad.voxels

**Usage**

```
lad.profile(VOXELS_LAD, relative = FALSE)
```

**Arguments**

VOXELS_LAD	3D grid of LAD values (output of lad.voxels() function)
relative	produce lad profile by relative total LAI values. Indicate when usinh effective LAI

**Value**

A [data.frame](#) with the calculated Leaf Area Density

**Examples**

```

# Get the example laz file
normlas.file = system.file("extdata", "lidar_example.laz", package="leafR")

# Calculate LAD from voxelization
VOXELS_LAD = lad.voxels(normlas.file,
                        grain.size = 2)

lad_profile = lad.profile(VOXELS_LAD)
plot(lad_profile$height ~ lad_profile$lad, type = "l", ylim = c(0, 40),

```

```
ylab = "Canopy height (m)", xlab = "LAD (m2/m3)")

# relative LAD PROFILE
relative.lad_profile = lad.profile(VOXELS_LAD, relative = TRUE)

plot(relative.lad_profile$height ~ relative.lad_profile$lad, type = "l", ylim = c(0, 40),
      ylab = "Canopy height (m)", xlab = "LAD (% of LAI)")
```

---

lad.voxels	<i>Creates a data frame of the 3D voxels information (xyz) with Leaf Area Density values from las file</i>
------------	--

---

### Description

Creates a data frame of the 3D voxels information (xyz) with Leaf Area Density values from las file

### Usage

```
lad.voxels(normlas.file, grain.size = 1, k = 1)
```

### Arguments

normlas.file	normalized las file
grain.size	horizontal resolution (suggested 1 meter for lad profiles and 10 meters for LAI maps)
k	coefficient to transform effective LAI to real LAI (k = 1; for effective LAI)

### Value

A [data.frame](#) of the 3D voxels information (xyz) with Leaf Area Density values

### Note

The values of LAD are not estimated below 1 meter. For the following reasons: ground points influence relative low sampling

### Examples

```
# Get the example laz file
normlas.file = system.file("extdata", "lidar_example.laz", package="leafR")

VOXELS_LAD = lad.voxels(normlas.file,
                       grain.size = 2, k=1)
```

---

LAHV

*Leaf Area Height Volume metric*

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### Description

Calculates the leaf area height volume (LAHV) metric as described in Almeida et al. (2019).

### Usage

```
LAHV(lad_profile, LAI.weighting = FALSE, height.weighting = FALSE)
```

### Arguments

`lad_profile` output of the `lad.profile` function  
`LAI.weighting` boolean, define if LAVH should be weighted by total LAI. default FALSE  
`height.weighting` boolean, define if LAVH should be weighted by the max height. default FALSE

### Value

A [numeric](#) containing the Leaf Area Height Volume calculated from the Leaf Area Density profile.

### References

Almeida, D. R. A., Stark, S. C., Chazdon, R., Nelson, B. W., Cesar, R. G., Meli, P., ... Brancalion, P. H. S. (2019). The effectiveness of lidar remote sensing for monitoring forest cover attributes and landscape restoration. *Forest Ecology and Management*, 438, 34–43. doi: [10.1016/J.FORECO.2019.02.002](https://doi.org/10.1016/J.FORECO.2019.02.002)

### Examples

```
# Get the example laz file
normlas.file = system.file("extdata", "lidar_example.laz", package="leafR")

# Calculate LAD from voxelization
VOXELS_LAD = lad.voxels(normlas.file,
                        grain.size = 2)

# Calculate the LAD profile
lad_profile = lad.profile(VOXELS_LAD)

LAHV(lad_profile, LAI.weighting = FALSE, height.weighting = FALSE)
LAHV(lad_profile, LAI.weighting = TRUE, height.weighting = FALSE)
LAHV(lad_profile, LAI.weighting = FALSE, height.weighting = TRUE)
LAHV(lad_profile, LAI.weighting = TRUE, height.weighting = TRUE)
```



---

lai	<i>calculates the lead area index (LAI)</i>
-----	---

---

### Description

calculates the lead area index (LAI)

### Usage

```
lai(lad_profile, min = 1, max = 100)
```

### Arguments

lad_profile	output of the lad.profile function
min	min canopy height
max	max canopy height

### Value

A [numeric](#) containing the LAI calculated from the Leaf Area Density

### Note

The use of min and max arguments allowed the estimation of the LAI for different vertical strata

### Examples

```
# Get the example laz file
normlas.file = system.file("extdata", "lidar_example.laz", package="leafR")

# Calculate LAD from voxelization
VOXELS_LAD = lad.voxels(normlas.file,
                        grain.size = 2)

# Calculate the LAD profile
lad_profile = lad.profile(VOXELS_LAD)

lidar.lai = lai(lad_profile); lidar.lai
understory.lai = lai(lad_profile, min = 1, max = 5); understory.lai

# relative LAD PROFILE
relative.lad_profile = lad.profile(VOXELS_LAD, relative = TRUE)

#understory relative LAI (% of total LAI)
relative.understory.lai = lai(relative.lad_profile, min = 1, max = 5); relative.understory.lai
```

---

lai.raster	<i>Produce a raster map of LAI. The resolution of the raster depends of grain.size choosed on lad.voxel() funtion.</i>
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---

### Description

Produce a raster map of LAI. The resolution of the raster depends of grain.size choosed on lad.voxel() funtion.

### Usage

```
lai.raster(VOXELS_LAD, min = 1, relative.value = NULL)
```

### Arguments

VOXELS_LAD	3D grid of LAD values (output of lad.voxels() function)
min	mix canopy height
relative.value	LAI map can be made in percentage of a relative lai value (indicate for effective LAI) A Leaf Area Index (LAI) <a href="#">RasterLayer</a> produced from the LAD voxels output from <a href="#">lad.voxels()</a> function.

### Examples

```
library(raster)
# Get the example laz file
normlas.file = system.file("extdata", "lidar_example.laz", package="leafR")

# Calculate LAD from voxelization
# use thicker grain size to avoid voxels
# without returns
VOXELS_LAD.5 = lad.voxels(normlas.file,
                          grain.size = 5, k=1)

#Map using absolute values
lai_raster = lai.raster(VOXELS_LAD.5)
plot(lai_raster)

#####
## RELATIVE LAI Raster
#####
# Calculate voxels LAD with finer grain size for
# better estimation of LAI
VOXELS_LAD = lad.voxels(normlas.file,
                        grain.size = 2)

# Calculate the LAD profile
lad_profile = lad.profile(VOXELS_LAD)
```

```
#Calculate LAI derived from LAD profile
lidar.lai = lai(lad_profile)

#Map using relative values (%)
relative.lai_raster = lai.raster(VOXELS_LAD.5, relative.value = lidar.lai)
plot(relative.lai_raster)
```

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lidar\_example.laz      *lidar\_example.laz included raw data*

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### Description

Tiny LiDAR data example for providing functional examples

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pointsByZSlice      *Count number of points in each Z slice*

---

### Description

Count number of points in each Z slice

### Usage

```
pointsByZSlice(Z, maxZ)
```

### Arguments

Z                    numeric vector. The heights vector.  
maxZ                numeric. The maximum height expected in the whole dataset.

### Value

A [list](#) of point counts in each Z slice of 1 meter

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