

# Coupling fire information with climate: General methodology

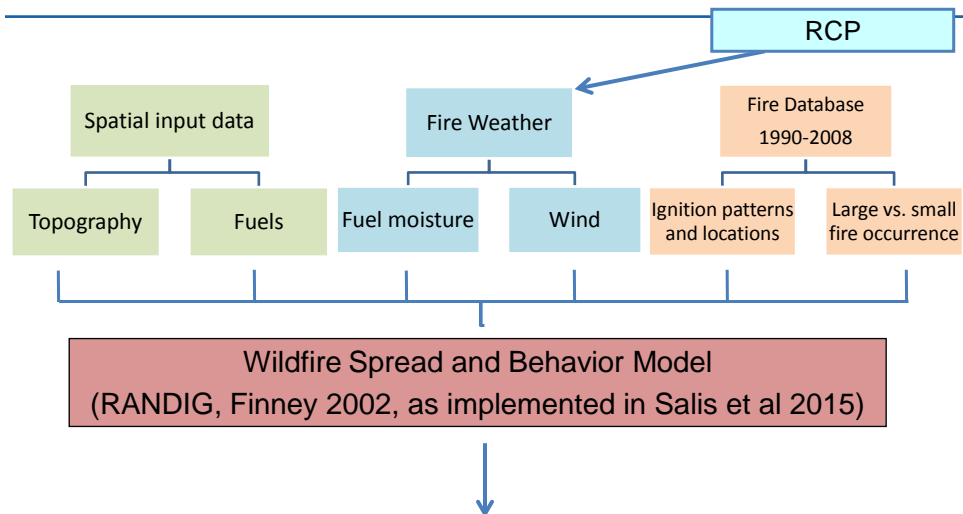
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3<sup>rd</sup> Workshop on “Fire Spread and  
Behavior Modeling in a context of  
Climate Change”

July 25-29, 2016 Sassari - Italy



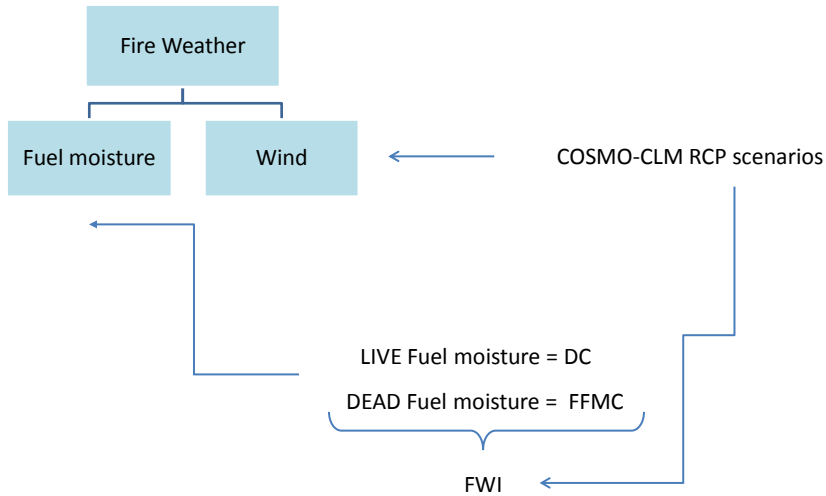
## Methodologies development to assess fire exposure



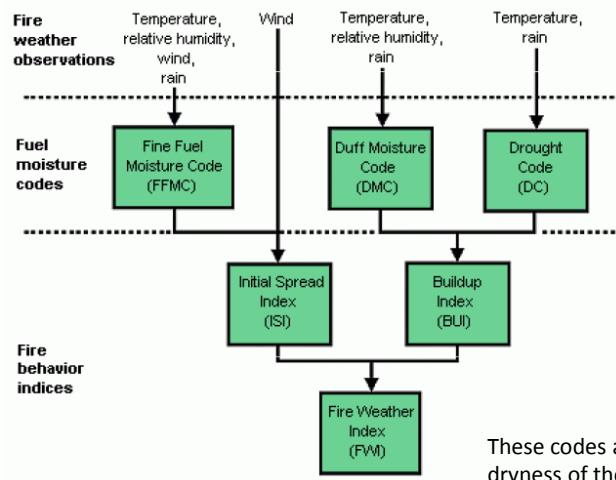
Burn probability (BP), Conditional flame length (CFL), Average fire size (FS), Fire potential index (FPI), etc.

Salis et al., 2013

## Data collection



## Fire Weather Index structure



These codes and indices are indicators of the dryness of the forest fuels and give relative measure of the burning conditions that can be **expected** for a "standard" fuel type.



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## Fire Weather Index structure

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Low numbers mean wet; high numbers mean dry.

### **Fine Fuel Moisture Code (FFMC)**

**Range: 0 - 101**

The dryness of the smallest forest fuels (surface litter, leaves, needles, small twigs, etc). Derived from yesterday's FFMC and the local noon dry bulb temperature, relative humidity, wind speed, and 24-hour precipitation.

### **Duff Moisture Code (DMC)**

**Range: 0 - Unlimited**


The dryness of the medium-sized surface fuels and upland duff layers (approximately 2 to 10 cm). Derived from yesterday's DMC and the local noon dry bulb temperature, relative humidity and 24-hour precipitation.

### **Drought Code (DC)**

**Range: 0 - Unlimited**

The dryness of the largest surface fuels and deep duff layers (approximately 10+ cm). Derived from yesterday's DC and the local noon dry bulb temperature and 24-hour precipitation.

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## Fire Weather Index structure

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### **Initial Spread Index (ISI)**

**Range: 0 – Unlimited**

A relative measure of how quickly a fire can be expected to spread. Derived from the FFMC and wind speed.

### **Build Up Index (BUI)**

**Range: 0 - Unlimited**


A relative measure of the amount of fuel available for combustion. Derived from the DC and DMC.

### **Fire Weather Index (FWI)**

**Range: 0 - Unlimited**

A relative measure of potential fire intensity—or energy available to be released. The FWI is a good indicator of overall fire danger. Derived from the BUI and ISI.

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## Methodology

1981-2005, 2021-2050,  
Three 30-years period 2051-2080

- 1) Calculate of 25<sup>th</sup>, 50<sup>th</sup>, 75<sup>th</sup>, 90<sup>th</sup>, 95<sup>th</sup> and 97<sup>th</sup> percentile of FFMC and DC daily values for each pixel, and then summarized in the 4 30-years periods.
- 2) Label FFMC and DC values above the Sardinian 75th percentile as "moderate", "dry", "very dry" or "extreme".
- 3) Associate the abovementioned labels to specific moisture conditions for the vegetation
- 4) Calculate the percentage of days corresponding to each moisture class for the 30-years periods and each macro-area.



## How to...

How to calculate FWI using current and future climate data?

**R facilities → cffdrs/fireDanger**

How to set-up wind and fuel moisture conditions from current and future climate data?

**CDO**

How to visualize the data?

**PANOPLY**

How to present the data?

**R facilities**



# Application of R tools and methods to calculate fire danger

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## An introduction to R

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**R** is an integrated suite of software facilities for data manipulation, calculation and graphical display. It has

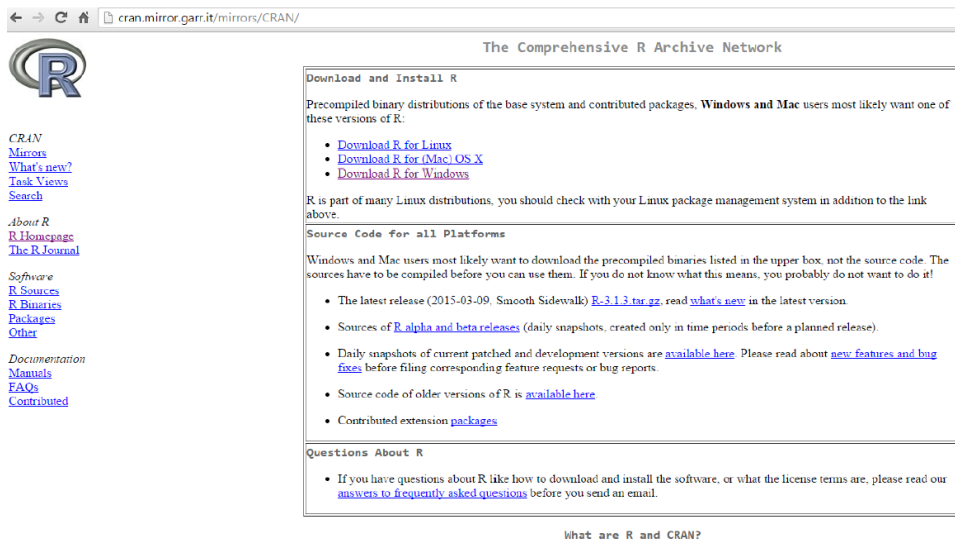
- an effective data handling and storage facility,
- a suite of operators for calculations on arrays, in particular matrices, a large, coherent, integrated collection of intermediate tools for data analysis,
- graphical facilities for data analysis and display,
- a well developed, simple and effective programming language (called 'S') which includes conditionals, loops, user defined recursive functions and input and output facilities.

**R is a free software!**



# How to download R

<http://cran.mirror.garr.it/mirrors/CRAN/>



The screenshot shows the CRAN website interface. On the left, there is a navigation menu with links for CRAN, Mirrors, What's new?, Task Views, Search, About R, R Homepage, The R Journal, Software, R Sources, R Binaries, Packages, Other, Documentation, Manuals, FAQs, and Contributed. The main content area is titled "The Comprehensive R Archive Network" and contains a "Download and Install R" section. This section provides instructions for Windows and Mac users, including links to download R for Linux, Mac OS X, and Windows. It also mentions that R is part of many Linux distributions and provides source code for all platforms. A "Questions About R" section is also present, with a link to frequently asked questions.

**Download and Install R**

Precompiled binary distributions of the base system and contributed packages. **Windows** and **Mac** users most likely want one of these versions of R.

- [Download R for Linux](#)
- [Download R for \(Mac\) OS X](#)
- [Download R for Windows](#)

R is part of many Linux distributions, you should check with your Linux package management system in addition to the link above.

**Source Code for all Platforms**

Windows and Mac users most likely want to download the precompiled binaries listed in the upper box, not the source code. The sources have to be compiled before you can use them. If you do not know what this means, you probably do not want to do it!

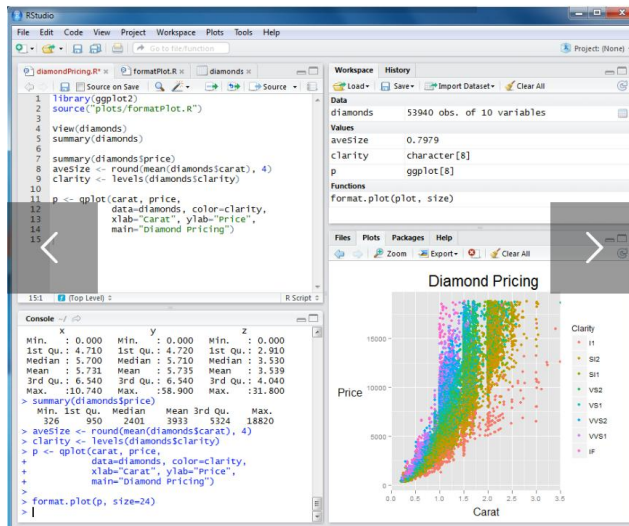
- The latest release (2015-03-09, Smooth Sidewalk) [R-3.1.3.tar.gz](#), read [what's new](#) in the latest version.
- Sources of [R alpha and beta releases](#) (daily snapshots, created only in time periods before a planned release).
- Daily snapshots of current patched and development versions are [available here](#). Please read about [new features and bug fixes](#) before filing corresponding feature requests or bug reports.
- Source code of older versions of R is [available here](#).
- Contributed extension [packages](#).

**Questions About R**

- If you have questions about R like how to download and install the software, or what the license terms are, please read our [answers to frequently asked questions](#) before you send an email.

What are R and CRAN?

## RStudio installed over the web



The screenshot shows the RStudio interface. The top menu bar includes File, Edit, Code, View, Project, Workspace, Plots, Tools, and Help. The main window is divided into several panes. On the left, the "Source" pane shows an R script with the following code:

```
1 library(ggplot2)
2 source("plots/formatPlot.R")
3
4 view(diamonds)
5 summary(diamonds)
6
7 summary(diamonds$price)
8 aveSize <- round(mean(diamonds$carat), 4)
9 clarity <- levels(diamonds$clarity)
10
11 p <- ggplot(carat, price,
12             data=diamonds, color=clarity,
13             xlab="Carat", ylab="Price",
14             main="Diamond Pricing")
15
16 format.plot(p, size=24)
```

The "Console" pane shows the output of the script, including summary statistics for the diamonds dataset and the execution of the ggplot2 code. The "Plots" pane displays a scatter plot titled "Diamond Pricing" showing the relationship between Carat (x-axis) and Price (y-axis). The plot is faceted by Clarity, with a legend on the right showing different clarity levels: I1, SI2, SI1, VS2, VSI1, VS1, and IF.

<https://www.rstudio.com/products/rstudio/download2/>



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## R packages

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Once you have downloaded the R executable, you only have to run it and follow instruction. Some R functions are available in additional packages, so you need to install them.

You can download them from [http://www.cran.r-project.org/web/packages/available\\_packages\\_by\\_name.html](http://www.cran.r-project.org/web/packages/available_packages_by_name.html)

In order to carry out the exercises of hands-on session you need some packages to work with excel files:

cffdrs



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## Canadian Forest Fire Danger Rating System (CFFDRS)

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<http://rpackages.ianhowson.com/rforge/cffdrs/man/cffdrs-package.html>

Package: cffdrs  
Type: Package  
Version: 1.7.4  
Date: 2016-04-26  
License: GPL-2

This package includes 10 functions:

FWI System calculation → `fwi`, `fwiRaster`, `hffmc`, `hffmcRaster`, `sdmc`, `gfmc`, and `wDC`

FBP System calculation → `fbp` and `fbpRaster`

`fireSeason` has been added to determine fire season start and end dates based on weather.



## Canadian Forest Fire Danger Rating System (CFFDRS)

The `fwi`, `fwiRaster`, and `sdmc` functions calculate the outputs based on daily noon local standard time (LST) weather observations of temperature, relative humidity, wind speed, and 24-hour rainfall, as well as the previous day's moisture content.

The `hffmc`, `gfmc`, and `hffmcRaster` functions calculate the outputs based on hourly weather observations of temperature, relative humidity, wind speed, and hourly rainfall, as well as the previous hour's weather conditions.

The `fbp` and `fbpRaster` functions calculate the outputs of the FBP System based on given set of information about fire weather conditions (weather observations and their associated FWI System components), fuel type, and slope (optional).



### cffdrs package - fwi

Function FWI

```
fwi(input,init=data.frame(ffmc=85,dmc=6,dc=15,lat=55), batch=TRUE,
out= "all", lat.adjust=TRUE,uppercase=TRUE)
```

INPUT: A dataframe containing input variables of daily weather observations taken at noon LST. Variable names have to be the same as in the following list, but they are case insensitive. The order in which the input variables are entered is not important.

<code>id</code>	(optional)	Unique identifier of a weather station or spatial point (no restriction on data type); required when <code>batch=TRUE</code>
<code>lat</code>	(recommended)	Latitude (decimal degree, default=55)
<code>long</code>	(optional)	Longitude (decimal degree)
<code>yr</code>	(optional)	Year of observation; required when <code>batch=TRUE</code>
<code>mon</code>	(recommended)	Month of the year (integer 1-12, default=7)
<code>day</code>	(optional)	Day of the month (integer); required when <code>batch=TRUE</code>
<code>temp</code>	(required)	Temperature (centigrade)
<code>rh</code>	(required)	Relative humidity (%)
<code>ws</code>	(required)	10-m height wind speed (km/h)
<code>prec</code>	(required)	24-hour rainfall (mm)





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## cffdrs package - fwi

---

### Function FWI

```
fwi(input,init=data.frame(ffmc=85,dmc=6,dc=15,lat=55), batch=TRUE,
out= "all", lat.adjust=TRUE,uppercase=TRUE)
```

INIT: A data.frame or vector contains either the initial values for FFMC, DMC, and DC or the same variables that were calculated for the previous day and will be used for the current day's calculation. The function also accepts a vector if the initial or previous day FWI values is for only one weather station (a warning message comes up if a single set of initial values is used for multiple weather stations). Defaults are the standard initial values for FFMC, DMC, and DC defined as the following:

ffmc	Fine Fuel Moisture Code (FFMC; unitless) of the previous day. Default value is 85.
dmc	Duff Moisture Code (DMC; unitless) of the previous day. Default value is 6.
dc	Drought Code (DC; unitless) of the previous day. Default value is 15.
lat	Latitude of the weather station (optional, default=55). Latitude values are used to make day length adjustments in the function.




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## cffdrs package - fwi

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### Function FWI

```
fwi(input,init=data.frame(ffmc=85,dmc=6,dc=15,lat=55), batch=TRUE,
out= "all", lat.adjust=TRUE,uppercase=TRUE)
```

BATCH: Whether the computation is iterative or single step, default is TRUE. When batch=TRUE, the function will calculate daily FWI System outputs for one weather station over a period of time chronologically with the initial conditions given (init) applied only to the first day of calculation.

If multiple weather stations are processed, an additional "id" column is required in the input to label different stations, and the data needs to be sorted by date/time and "id".

If batch=FALSE, the function calculates only one time step (1 day) base on either the initial start values or the previous day's FWI System variables, which should also be assigned to init argument.



## cffdrs package - fwi

### Function FWI

```
fwi(input,init=data.frame(ffmc=85,dmc=6,dc=15,lat=55), batch=TRUE,
out="all", lat.adjust=TRUE, uppercase=TRUE)
```

### out

The function offers two output options, out="all" will produce a data frame that includes both the input and the FWI System outputs; out="fwi" will generate a data frame with only the FWI system components.

### lat.adjust

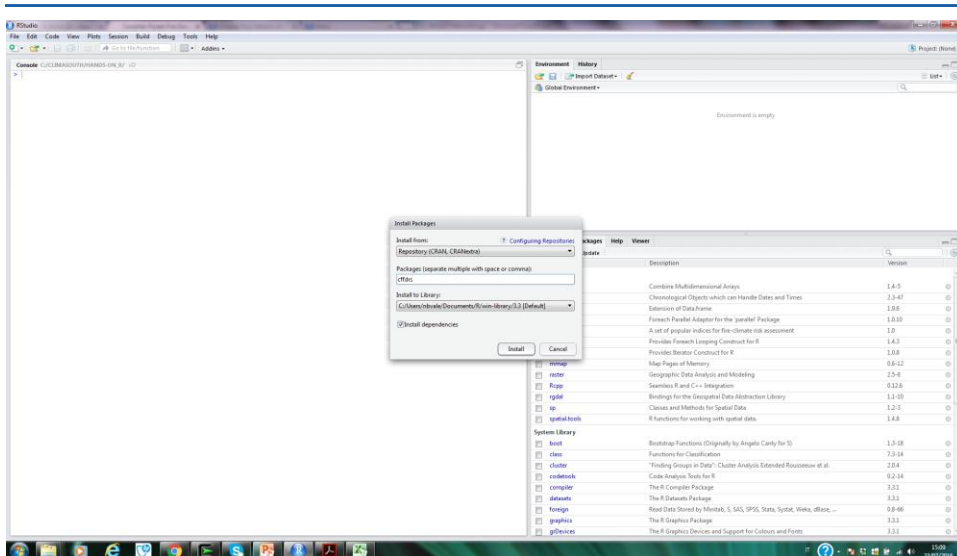
The function offers options for whether day length adjustments should be applied to the calculations. The default value is "TRUE".

### uppercase

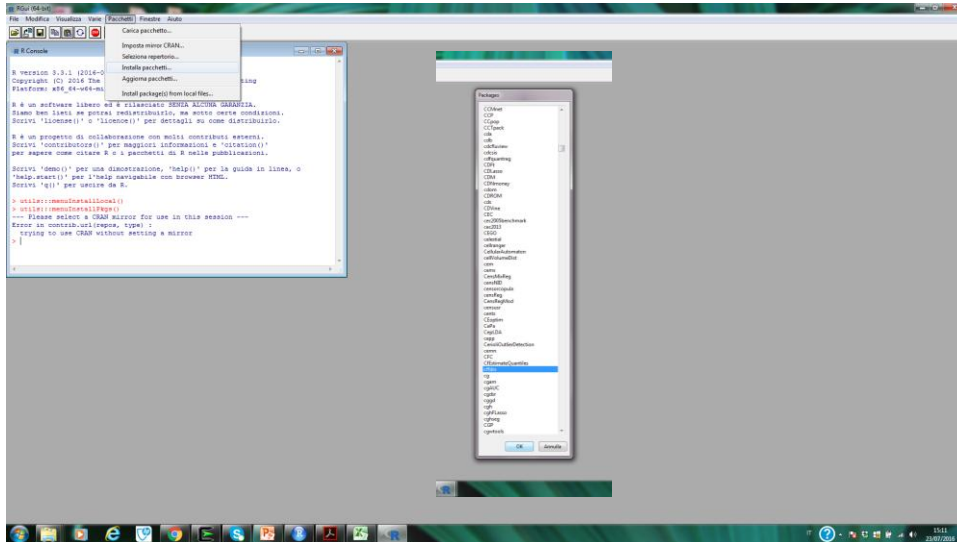
Output in upper cases or lower cases would be decided by this argument. Default is TRUE.



## cffdrs package intallation with RStudio



## cffdrs package installation with R



## cffdrs package

```
workdir <- "C:/CLIMASOUTH/HANDS-ON_R/"
setwd(workdir)
library(cffdrs)
```

```
nsard <- read.table("C:/CLIMASOUTH/HANDS-ON_R/nsard2.txt",
header=T)
summary(nsard)
```

long	lat	yr	mon	day	temp	rh
Min. :8.000	Min. :40	Min. :1995	Min. : 1.000	Min. : 1.00	Min. : 3.80	Min. :26.00
1st Qu.:8.000	1st Qu.:40	1st Qu.:1998	1st Qu.: 4.000	1st Qu.: 8.00	1st Qu.:15.40	1st Qu.:67.00
Median :8.000	Median :40	Median :2002	Median : 7.000	Median :16.00	Median :20.40	Median :76.00
Mean :8.333	Mean :40	Mean :2002	Mean : 6.523	Mean :15.73	Mean :21.17	Mean :74.11
3rd Qu.:9.000	3rd Qu.:40	3rd Qu.:2006	3rd Qu.:10.000	3rd Qu.:23.00	3rd Qu.:26.40	3rd Qu.:83.00
Max. :9.000	Max. :40	Max. :2009	Max. :12.000	Max. :31.00	Max. :41.60	Max. :99.00
					NA's :227	NA's :245

ws	prec
Min. : 0.00	Min. : 0.000
1st Qu.: 8.10	1st Qu.: 0.000
Median :11.70	Median : 0.000
Mean :13.87	Mean : 1.155
3rd Qu.:17.40	3rd Qu.: 0.000
Max. :77.80	Max. :157.990
NA's :280	NA's :899

Can prevent the analysis

```
nsard2 <- na.exclude(nsard)
```

---

## cffdrs package

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```
nsard2[1:5259,] -> alghero
alghero$date <- as.Date(as.POSIXlt(paste(alghero$yr, "-",
  alghero$mon, "-", alghero$day, sep="")))

```

```
# (1) FWI System variables for a single weather station:
# Using the default initial values and batch argument,
# the function calculate FWI variables chronically:

```

```
fwi.alghero<-fwi(alghero)
```

Default value of lat is 55, while Alghero is 40




---

## cffdrs package

---

Default value of lat is 55, while Alghero is 40

```
# Using a different set of initial values:
fwi.alghero2<-fwi(alghero,init=data.frame(ffmc=80,
dmc=10,dc=16, lat=40))

# This could also be done as the following:
fwi.alghero2 <-fwi(alghero,init=data.frame(80,10,6,40))

# Or:
fwi.alghero2 <-fwi(alghero,init=c(80,10,6,40))

```



## cffdrs package

### Summary (fwi.alghero2)

```

LONG      LAT      YR      MON      DAY      TEMP      RH      WS
Min. :.8  Min. :.40  Min. :1995  Min. : 1.000  Min. : 1.00  Min. : 3.8  Min. :30.00  Min. : 0.00
1st Qu.:.8  1st Qu.:.40  1st Qu.:1998  1st Qu.: 3.000  1st Qu.: 8.00  1st Qu.:16.0  1st Qu.:68.00  1st Qu.: 7.40
Median :.8  Median :.40  Median :2002  Median : 6.000  Median :16.00  Median :21.2  Median :76.00  Median :10.00
Mean :.8  Mean :.40  Mean :2002  Mean : 6.416  Mean :15.64  Mean :21.9  Mean :74.35  Mean :11.39
3rd Qu.:.8  3rd Qu.:.40  3rd Qu.:2006  3rd Qu.: 9.000  3rd Qu.:23.00  3rd Qu.:27.4  3rd Qu.:82.00  3rd Qu.:14.10
Max. :.8  Max. :.40  Max. :2009  Max. :12.000  Max. :31.00  Max. :40.4  Max. :98.00  Max. :54.30

PREC      DATE      FFMC      DMC      DC      ISI
Min. : 0.000  Min. :1995-01-01  Min. : 7.88  Min. : 0.1115  Min. : 1.108  Min. : 0.000001
1st Qu.: 0.000  1st Qu.:1998-03-26  1st Qu.:74.89  1st Qu.: 6.1984  1st Qu.: 209.998  1st Qu.: 1.311108
Median : 0.000  Median :2002-03-17  Median :82.01  Median :18.1217  Median : 396.780  Median : 2.533475
Mean : 1.292  Mean :2002-03-13  Mean :76.48  Mean : 47.6799  Mean : 467.634  Mean : 2.837236
3rd Qu.: 0.000  3rd Qu.:2006-01-31  3rd Qu.:85.33  3rd Qu.: 65.2808  3rd Qu.: 685.304  3rd Qu.: 3.919576
Max. :157.990  Max. :2009-12-31  Max. :94.53  Max. :430.7015  Max. :1587.844  Max. :22.166060

BUI      FWI      DSR
Min. : 0.1982  Min. : 0.0000  Min. : 0.00000
1st Qu.:11.0035  1st Qu.: 0.8872  1st Qu.: 0.02201
Median :31.5235  Median : 5.2314  Median : 0.50877
Mean : 69.0551  Mean : 8.8873  Mean : 2.24366
3rd Qu.:102.2818  3rd Qu.:15.4623  3rd Qu.: 3.46405
Max. :502.3488  Max. :53.6454  Max. :31.32146
> |

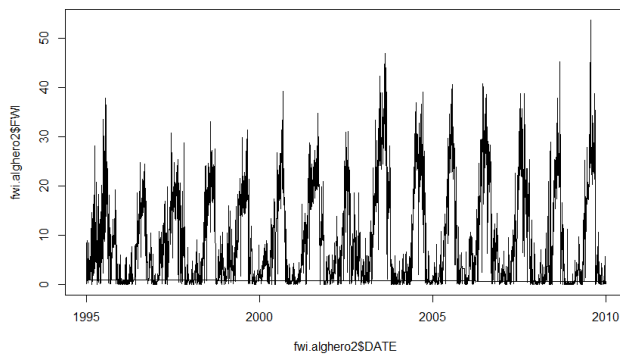
```

```
plot(fwi.alghero2$DATE,fwi.alghero2$FWI, ty="l")
```



## cffdrs package

```
plot(fwi.alghero2$DATE,fwi.alghero2$FWI, ty="l")
```



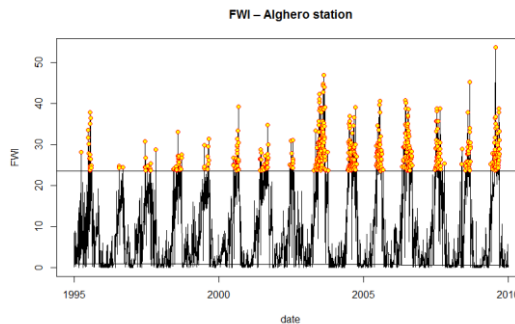
```
plot(fwi.alghero2$DATE,fwi.alghero2$FWI, ty="l", main="FWI -
Alghero station", xlab="date", ylab="FWI")
```



## cffdrs package

```
quantile(fwi.alghero2$FWI, probs=.9) -> fwi90
abline(h=fwi90)
```

```
points(fwi.alghero2$DATE[which(fwi.alghero2$FWI>fwi90)],fwi.alghero2$FWI[which(fwi.alghero2$FWI>fwi90)], pch=21, col='red',bg='yellow')
```



## cffdrs package

The following are the FWI values used by EFFIS as thresholds of the fire danger classes

Fire Danger Classes	FWI ranges (upper bound excluded)
Very low	< 5.2
Low	5.2 - 11.2
Moderate	11.2 - 21.3
High	21.3 - 38.0
Very high	38.0 - 50.0
Extreme	>= 50.0



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## cffdrs package

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```
par(mfrow=c(3,1))
plot(fwi.alghero2$DATE,fwi.alghero2$FWI, ty="1")
plot(fwi.alghero2$DATE,fwi.alghero2$FFMC, ty="1")
plot(fwi.alghero2$DATE,fwi.alghero2$DC, ty="1")

write.table(fwi.alghero2, "C:/CLIMASOUTH/HANDS-
ON_R/fwi.alghero.txt", sep="\t")
```



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## fireDanger Package

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Provides functions for the calculation of several popular indices for fire risk assessment based on meteorological data.

Author(s)

Joaquin Bedia, with contributions of Sixto Herrera and Maialen Iturbide  
Santander Meteorology Group (<http://www.meteo.unican.es>)

Maintainer: Joaquin Bedia <bediaj@unican.es>

This R package contains implementations of several popular fire danger indices widely applied in many areas of the world:

- \* The Canadian Fire Weather Index System (including all its components)
- \* The Angstrom Index
- \* The Fuel Moisture Index
- \* The Nesterov Index (including the more recent modified version)
- \* The Keetch-Byram Drought Index
- \* The McArthur's drought factor, and the Forest Fire Danger Index (FFDI)



---

## fireDanger Package

---

```
fwi(date, Tm, H, r, W, return.all = FALSE)
```

### Arguments

- **date** A vector of dates.
- **Tm** A numeric vector of temperature records (in degree C)
- **H** A numeric vector of relative humidity records (in %)
- **r** A numeric vector of precipitation records (in mm)
- **W** A numeric vector of wind speed records (in km/h)
- **return.all** Logical. Should all FWI system components be returned?. If TRUE, a complete dataframe is returned with all FWI components. Default to FALSE, and in this case only FWI is returned.




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## fireDanger Package

---

```
# Prepare the data.frame for Tm, H, r, W, in R with the
package ncdf4
```

```
ncname <- "rh_2000_boxrnnALG"
ncfname <- paste(ncname, ".nc", sep = "")
dname <- "rh"
ncin <- nc_open(ncfname)
lon <- ncvar_get(ncin, "lon")
nlon <- dim(lon)

lat <- ncvar_get(ncin, "lat", verbose = F)
nlat <- dim(lat)

print(c(nlon, nlat))
t <- ncvar_get(ncin, "time")
tunits <- ncatt_get(ncin, "time", "units")
nt <- dim(t)
```





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## fireDanger Package

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```
rh.array <- ncvr_get(ncin, dname)
dlname <- ncatt_get(ncin, dname, "long_name")
dunits <- ncatt_get(ncin, dname, "units")
dim(rh.array)
rh.vec.long <- as.vector(rh.array)
length(rh.vec.long)
rh.mat <- matrix(rh.vec.long, nrow = nt, ncol = nlon * nlat)
rh.df <- data.frame(rh.mat)
rh.df2[is.na(rh.df)] <- 0
```

```
read.table('./date.txt',h=TRUE) -> date2000
date2000p <- as.Date(as.POSIXlt(paste(date2000$YEAR, "-",
date2000$MONTH, "-", date2000$DAY, sep="")))

```




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## fireDanger Package

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```
matrix(rep(NA, 366*2255), ncol=2255) -> fwi.alg
for (i in 1:2255) {
print(paste('calculating point',i))
fwi(date=date2000p, Tm=temp.df[ ,i], H=rh.df[ ,i], r=prec.df
[ ,i], W=ws.df[ ,i], ret=FALSE) -> fwi.alg[ ,i]
}
```



---

## fireDanger Package

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```
apply(fwi.alg, FUN=mean, MARGIN=2) -> fwi.alg.map  
cbind.data.frame(coords, fwi.alg.map) -> fwi.alg.map  
coordinates(fwi.alg.map) <- c(1,2)  
gridded(fwi.alg.map) <- TRUE  
splot(fwi.alg.map, col.regions=rev(heat.colors(21)))
```



**Thanks**