

Appendix A. R-Package Documentation

Package ‘ObsNetwork’

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Title Optimization of Observation Networks

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Depends R (>= 3.0.0), tcltk, raster, sp, rgdal, gstat, GA

Description This package evaluates and optimizes long-term monitoring networks using a kriging-based genetic algorithm methodology.

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URL <https://github.com/jfisher-usgs/ObsNetwork>

BugReports <https://github.com/jfisher-usgs/ObsNetwork/issues>

ByteCompile yes

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ESRP_Boundary

*Outlines of the ESRP and Buttes***Description**

An outline of the generalized boundary of the eastern Snake River Plain (ESRP), East Butte, Middle Butte, and Big Southern Butte.

Usage

```
ESRP_Boundary
```

Format

An object of [SpatialPolygonsDataFrame-class](#) containing 4 [Polygons](#). Three of the polygons represent buttes and are set as holes in the much larger aquifer polygon. Geographic coordinates are in units of decimal degrees, and in conformance with the North American Datum of 1983 (NAD 83).

Source

Idaho Department of Water Resources ([IDWR](#)).

Examples

```
data(ESRP_Boundary)
plot(ESRP_Boundary)
summary(ESRP_Boundary)

# Commands used to construct this data object:
dsn <- system.file("extdata/ESRP_Boundary", package = "ObsNetwork")
obj <- readOGR(dsn = dsn, layer = basename(dsn))
identical(obj, ESRP_Boundary)

# Polygon slots
p <- sapply(slot(obj, "polygons"), function(i) slot(i, "Polygons"))

# Generalized boundary of the ESRP aquifer
plot(SpatialPolygons(list(Polygons(list(p[[1]]), 1)))

# Generalized boundary of the East Butte
plot(SpatialPolygons(list(Polygons(list(p[[2]]), 1))), add = TRUE)

# Generalized boundary of the Middle Butte
plot(SpatialPolygons(list(Polygons(list(p[[3]]), 1))), add = TRUE)

# Generalized boundary of the Big Southern Butte
plot(SpatialPolygons(list(Polygons(list(p[[4]]), 1))), add = TRUE)
```

ESRP_Lakes*Outlines of the ESRP Lakes*

Description

Major lakes of the eastern Snake River Plain (ESRP) and surrounding areas.

Usage

ESRP_Lakes

Format

An object of [SpatialPolygonsDataFrame-class](#) containing a set of [Polygons](#). Geographic coordinates are in units of decimal degrees, and in conformance with the North American Datum of 1983 (NAD 83).

Source

Idaho Department of Water Resources ([IDWR](#)).

Examples

```
data(ESRP_Lakes)
plot(ESRP_Lakes)
```

ESRP_NED*Topographic Information on the ESRP*

Description

The eastern Snake River Plain (ESRP) is a geologic feature located in the state of Idaho. This data set gives topographic information for the ESRP and vicinity on a 500 by 500 meter grid. The west, east, north, and south bounding coordinates are about -115.4, -111.4, 44.5, and 42.2 decimal degrees, respectively.

Usage

ESRP_NED

Format

An object of [SpatialGridDataFrame-class](#) with 323,724 points (coordinates) and a single data attribute, var2, the land-surface elevation. Geographic coordinates are in units of meters, in conformance with the North American Datum of 1927 (NAD 27), and placed in a Albers Equal-Area Conic projection; standard parallels 42.83, 44.16; central meridian -113.00, false easting 200,000 meters; false northing 0.

Source

The National Elevation Dataset (**NED**) 1-arc-second raster. Dataset resampled to 10 arc-seconds using a cubic convolution assignment. All other data processing is shown in ‘Examples’ section.

References

Gesch, D.B., 2007, The National Elevation Dataset, in Maune, D., ed., Digital Elevation Model Technologies and Applications: The DEM Users Manual, 2nd Edition: Bethesda, Maryland, American Society for Photogrammetry and Remote Sensing, p. 99-118.

Gesch, D., Oimoen, M., Greenlee, S., Nelson, C., Steuck, M., and Tyler, D., 2002, The National Elevation Dataset: Photogrammetric Engineering and Remote Sensing, v. 68, no. 1, p. 5-11.

Examples

```
data(ESRP_NED)
image(ESRP_NED)
summary(ESRP_NED)

# Commands used to construct this data object:
f <- system.file("extdata/ESRP_NED.tif", package = "ObsNetwork")
grd <- rgdal::readGDAL(f, band = 1)
names(grd) <- "var2"
summary(grd)
grd.attr <- as.data.frame(slot(grd, "grid"))
summary(grd.attr)

# Transform coordinates to meters; Albers Equal-Area Conic projection; NAD27
projargs <- paste("+proj=aea +lat_1=42.83333333333333 +lat_2=44.16666666666666",
                  "+lat_0=41.5 +lon_0=-113 +x_0=200000 +y_0=0 +ellps=clrk66",
                  "+datum=NAD27 +units=m +no_defs")
pts <- suppressWarnings(spTransform(grd, CRS(projargs)))
class(pts)

# Resample data using reduced grid size of 500 by 500 meters
dx <- 500
dy <- 500
xlim <- c(10000, 328000)
ylim <- c(81200, 335700)
cellcentre.offset <- c(min(xlim) + dx / 2, min(ylim) + dy / 2)
cellsize <- c(dx, dy)
cells.dim <- c(diff(range(xlim)) / dx, diff(range(ylim)) / dy)
newdata <- GridTopology(cellcentre.offset = cellcentre.offset,
                       cellsize = cellsize, cells.dim = cells.dim)
newdata <- SpatialGrid(newdata, proj4string = CRS(projargs))
coordnames(newdata) <- c("x", "y")

# Inverse distance weighting interpolation; computationally demanding
obj <- gstat::idw(var2 ~ 1, pts, newdata, idp = 2.0, maxdist = 250)
obj$var1.var <- NULL
names(obj) <- "var2"

# Compare with available data set
identical(obj, ESRP_NED)
```

ESRP_NWIS

*Water-Level Data Set for the ESRP Aquifer***Description**

A summary of water-level elevation measurements from wells located in the eastern Snake River Plain (ESRP) aquifer, Idaho.

Usage

ESRP_NWIS

Format

An object of [SpatialPointsDataFrame-class](#) with 335 points (coordinates). Geographic coordinates are in units of decimal degrees, and in conformance with the North American Datum of 1983 (NAD 83). This data set has the following variables:

site.no Unique numerical identifier for each well site, for example **435339112444601**.

var1 Median water-level elevation for calendar year 2008, in meters above the North American Vertical Datum of 1988 (NAVD 88).

var1.acy Mean measurement accuracy of water-level elevations, in meters, for calendar year 2008.

var1.sd Standard deviation of water-level elevations, in meters, for entire period of record; duration varies for each well site.

var2 Land-surface reference point elevation, in meters above the NAVD 88.

map.no Numeric identifier used to locate well sites on map.

network.nm Identifier for water-level monitoring network. For this data set "State" is used to identify wells in the 2008 Federal-State Cooperative water-level monitoring network (166 wells), and "INL" for wells in the 2008 U.S. Geological Survey-Idaho National Laboratory water-level monitoring network (171 wells). Wells coded as "State, INL" belong to both monitoring networks.

nrec.por Number of records in the entire period of record.

nrec Number of records in calendar year 2008.

alt.acy.va Accuracy of land-surface reference point elevation, in meters.

lev.acy.va Mean water-level measurement accuracy, in meters, for calendar year 2008.

coord.acy.va Latitude/longitude coordinate accuracy, in arc-seconds.

coord.meth.cd Method used to determine horizontal datum.

alt.meth.cd Method used to determine land-surface datum.

lev.meth.cd All methods used to determine water levels; comma separated.

site.nm Local well identifier, for example "07N 31E 34BDD1 USGS 25".

Source

The National Water Information System ([NWIS](#)); accessed January 2013 using [RNWIS](#) (version 0.1-8). The software [VERTCON](#) (version 2.1) was used to convert National Geodetic Vertical Datum of 1929 (NGVD 29) heights to NAVD 88. The final data table was constructed using the [ReadNWISData](#) pre-processing function.

Examples

```
data(ESRP_NWIS)
plot(coordinates(ESRP_NWIS))
str(ESRP_NWIS)
```

ESRP_Rivers	<i>Traces of the ESRP Rivers</i>
-------------	----------------------------------

Description

Major rivers of the eastern Snake River Plain (ESRP) and surrounding areas.

Usage

```
ESRP_Rivers
```

Format

An object of [SpatialLinesDataFrame-class](#) containing a set of [Lines](#). Geographic coordinates are in units of decimal degrees, and in conformance with the North American Datum of 1983 (NAD 83).

Source

Idaho Department of Water Resources ([IDWR](#)).

Examples

```
data(ESRP_Rivers)
plot(ESRP_Rivers)
```

INL_Boundary	<i>Outline of the Idaho National Laboratory</i>
--------------	---

Description

The political boundary of the Idaho National Laboratory ([INL](#)).

Usage

```
INL_Boundary
```

Format

An object of [SpatialPolygonsDataFrame-class](#) containing 1 [Polygon](#). Geographic coordinates are in units of decimal degrees, and in conformance with the North American Datum of 1983 (NAD 83).

Source

[U.S. Geological Survey-INL Project Office](#).

Examples

```
data(INL_Boundary)
plot(INL_Boundary)
```

OpenGraphicsDevice	<i>Open Graphics Device</i>
--------------------	-----------------------------

Description

This function starts the device driver for producing graphics.

Usage

```
OpenGraphicsDevice(file, type = "windows", w = 7, h = 7, p = 12,
  res = 300, win.title = "Save As")
```

Arguments

file	character; the path of a file for writing (optional).
type	character; the name of a graphics driver, either "postscript", "pdf", "png", or the default "windows".
w, h	numeric; the (nominal) width and height of the canvas of the plotting window in inches. Default is 7 and 7, respectively.
p	numeric; the default point size of plotted text, its default is 12.
res	numeric; the nominal resolution in points per inch (ppi) which will be recorded in the Portable Network Graphics (PNG) file, its default is 300 ppi to set the size of text and line widths.
win.title	character; a string to display as the title of the dialog box, only used if file is not specified.

Details

A "postscript" graphics device produces an Encapsulated PostScript (eps) file and is recommended for figures of publication quality.

Value

A plot device is opened.

Author(s)

J.C. Fisher

See Also

[postscript](#), [pdf](#), [png](#), [windows](#)

Examples

```
OpenGraphicsDevice(type = "windows")
plot(1:3)
dev.off()
```

```
OpenGraphicsDevice(type = "pdf")
plot(1:3)
dev.off()
```

OptimizeNetwork

Optimize Observation Network

Description

Determine sites to exclude from an existing observation network because they provide little or no beneficial added information. A kriging-based genetic algorithm (GA) is used to solve the multi-objective optimization problem.

Usage

```
OptimizeNetwork(pts, grd, ply, network.nm, nsites, model, formula, nmax = Inf,
  xlim = bbox(grd)[1, ], ylim = bbox(grd)[2, ], grd.fact = 1,
  obj.weights = c(1, 1, 1, 1), penalty.constant = 1E6,
  maxabort = 10, popSize = 50, pcrossover = 0.8, pmutation = 0.1,
  elitism = base::max(1, round(popSize * 0.05)),
  maxiter = 100, run = maxiter, suggestions = NULL, ...)
```

Arguments

pts	SpatialPointsDataFrame; data at observation sites. Required data frame variables include: <code>site.no</code> , a unique site number; <code>var1</code> , the dependent variable (such as, the water-level elevation); <code>var1.acy</code> , the mean measurement error of the dependent variable; <code>var1.sd</code> , the standard deviation of the dependent variable. An optional <code>network.nm</code> variable may be included to identify a sites observation network(s). Sites belonging to multiple networks are specified using comma separation. Note that duplicate site numbers and (or) spatial coordinates are not permitted.
grd	SpatialGridDataFrame; interpolation grid. For kriging with external drift (KED) a data frame variable <code>var2</code> , the independent variable (such as, land-surface elevation), is required.
ply	SpatialPolygonsDataFrame; a polygon used to crop the raster grid (optional).
network.nm	character; vector of observation network names. Only sites belonging to this network will be included in the analysis; this argument is optional, in its absence all sites are assumed to belong to a single network (that is, all sites are used).
nsites	integer; number of sites to remove from the observation network.
model	variogramModel; variogram model of dependent variable defined by a call to vgm .
formula	formula; defines the dependent variable as a linear model of the independent variables.

<code>nmax</code>	numeric; for local kriging, the number of nearest sites that should be used for a kriging prediction or simulation, where nearest is defined in terms of the space of the spatial locations. By default, all sites are used.
<code>xlim</code>	numeric; vector of length 2 giving left and right limits for the x-axis, used to crop the interpolation grid.
<code>ylim</code>	numeric; vector of length 2 giving lower and upper limits for the y-axis, used to crop the interpolation grid.
<code>grd.fact</code>	integer; aggregation factor for the interpolation grid, <code>grd</code> .
<code>obj.weights</code>	numeric; vector of length 4 giving the weights for each objective in the multi-objective optimization problem, see ‘details’ section below.
<code>penalty.constant</code>	numeric; constant in the penalty function, its value needs to be greater than the largest possible fitness value.
<code>maxabort</code>	integer; maximum number of times an invalid child chromosome can be aborted during crossover.
<code>popSize</code>	integer; population size.
<code>pcrossover</code>	numeric; probability of crossover between pairs of chromosomes.
<code>pmutation</code>	numeric; probability of mutation in a parent chromosome.
<code>elitism</code>	integer; number of chromosomes to survive into the next generation. By default is about 5 percent of the population size.
<code>maxiter</code>	integer; maximum number of iterations to run before the GA search is halted.
<code>run</code>	integer; number of consecutive generations without any improvement in the “best” fitness value before the GA is stopped.
<code>suggestions</code>	matrix; initial population.
<code>...</code>	additional arguments to be passed to ga .

Details

A solution to the multi-objective optimization problem is found by minimizing the aggregate objective function, the weighted linear sum of 4 objectives. The objectives are given as:

1. Mean standard error at points in interpolation grid.
2. Root-mean-square error, difference between predicted and measured values, at removed sites.
3. Mean standard deviation, variability of measurement over time, at removed sites.
4. Mean measurement error, at remaining sites.

The “best” solution found will depend on the relative values of the weights specified in `obj.weights`. For example, if a higher weight is specified for the mean standard error, the solution will be one that favors a smaller mean standard error over a small root-mean squared error, mean standard deviation, and mean measurement error. Setting a weight equal to zero will remove an objective from the multi-objective function.

Spatial data is transformed to the map projection and datum of the raster data set in `grd`.

The optimization problem is solved using a GA with integer chromosomes; site identifiers are represented as binary strings using **Gray** encoding. The initial population is randomly generated with valid chromosomes; that is, sites are not repeated within a single chromosome. The GA uses linear-rank selection, single-point crossover, and uniform random mutation.

Value

Returns a list with components:

<code>call</code>	character; function call with all specified arguments
<code>pts.rm</code>	<code>SpatialPointsDataFrame</code> ; a subset of <code>pts</code> with row length equal to <code>nsites</code> . Includes data records for those sites identified by the GA for removal from the observation network(s).
<code>is.net</code>	logical; vector of length equal to the number of rows in <code>pts</code> specifying sites belonging to the reduced network.
<code>is.rm</code>	logical; vector of length equal to the number of rows in <code>pts</code> specifying sites to remove from the network.
<code>obj.values</code>	matrix; objective values at each iteration of the GA. This matrix has <code>maxiter</code> rows and 5 columns (that is, the 4 objective values and their sum).
<code>niter</code>	integer; number of completed iterations.
<code>nrep.ans</code>	integer; number of iterations the “best” solution was repeated.
<code>proc.time</code>	<code>proc_time</code> ; CPU time for running the GA, in seconds.
<code>ncalls.penalty</code>	integer; vector giving the number of calls to the penalty function at each iteration of the GA.
<code>kr</code>	<code>SpatialGridDataFrame</code> ; a data frame containing the coordinates of <code>grd</code> cropped to the axis limits and polygon. Data attributes based on block kriging of the reduced network include: predictions, <code>var1.pred</code> ; prediction variances, <code>var1.var</code> ; and prediction standard errors, <code>var1.se</code> . Differences between the original and reduced network predictions are specified in the <code>var1.diff</code> attribute.
<code>rmsd</code>	numeric; root-mean-square-deviation between the kriged surfaces using the original and reduced networks.
<code>local.error</code>	numeric; percent local error between the kriged surfaces using the original and reduced networks.
<code>obj.space</code>	matrix; range of objective values in solution space.
<code>ga.ans</code>	<code>ga</code> ; returned value of ga .
<code>start.time</code>	<code>POSIXct</code> ; system time at start of GA run.
<code>diff.time</code>	numeric; vector of time differences since start of GA run, specified for each iteration in the GA, in hours.

The status of the objective values after each iteration of the GA is plotted.

Author(s)

J.C. Fisher

References

Scrucca, Luca, 2013, GA: a package for genetic algorithms in R, Journal of Statistical Software, v. 53, no. 4, 37 p.

See Also

[WriteGAResults](#), [krige](#), [ga](#)

Examples

```
data(ESRP_NED)
data(ESRP_NWIS)
data(ESRP_Boundary)

# Formula and variogram
fo <- var1 ~ x + y
model <- vgm(psill = 1948.533, model = "Sph", nugget = 0, range = 153891.038)

# Optimize combined "State" and "INL" networks
xlim <- c(10000, 328000)
ylim <- c(81200, 335700)
ans <- OptimizeNetwork(ESRP_NWIS, ESRP_NED, ESRP_Boundary,
  network.nm = c("State", "INL"), nsites = 20,
  model = model, formula = fo, grd.fact = 5,
  obj.weights = c(100, 1, 1, 1), popSize = 20,
  maxiter = 3)
PlotRaster(ans$kr, "var1.pred", ESRP_NWIS,
  pal = colorRampPalette(c("#F02311", "#F7FDFA", "#107FC9")),
  main = "Predictions", net.idxs = which(ans$is.net),
  rm.idxs = which(ans$is.rm), xlim = xlim, ylim = ylim)
PlotRaster(ans$kr, "var1.se", ESRP_NWIS,
  pal = terrain.colors, main = "Standard errors",
  net.idxs = which(ans$is.net), rm.idxs = which(ans$is.rm),
  xlim = xlim, ylim = ylim)

# Optimize "INL" network
xlim <- c(178000, 257500)
ylim <- c(202000, 272000)
ans <- OptimizeNetwork(ESRP_NWIS, ESRP_NED, ESRP_Boundary,
  network.nm = "INL", nsites = 20, model = model,
  formula = fo, xlim = xlim, ylim = ylim, grd.fact = 5,
  obj.weights = c(100, 1, 1, 1), maxiter = 3)
PlotRaster(ans$kr, "var1.diff", ESRP_NWIS, pal = jet.colors,
  main = "Prediction Differences", net.idxs = which(ans$is.net),
  rm.idxs = which(ans$is.rm), xlim = xlim, ylim = ylim)

# Restart GA using previous "best" solution
ans <- OptimizeNetwork(ESRP_NWIS, ESRP_NED, ESRP_Boundary,
  network.nm = "INL", nsites = 20, model = model,
  formula = fo, xlim = xlim, ylim = ylim,
  grd.fact = 5, obj.weights = c(100, 1, 1, 1),
  maxiter = 3, suggestions = ans$ga.ans@population)
```

PlotBubble

Create a Bubble Plot of Spatial Data

Description

Bubble plot for spatial data with attributes. This is a wrapper around [bubble](#) in the **sp** package.

Usage

```
PlotBubble(pts, zcol, ply, xlim = bbox(ply)[1, ], ylim = bbox(ply)[2, ],
```

```
main = "", gr.type = "windows", gr.file = NULL,
projargs = proj4string(pts))
```

Arguments

<code>pts</code>	SpatialPointsDataFrame; data at observation sites.
<code>zcol</code>	character; z-variable column name in attribute table of <code>pts</code> .
<code>ply</code>	SpatialPolygonsDataFrame; polygon to include in layout.
<code>xlim</code>	numeric; vector of length 2 giving left and right limits for the x-axis.
<code>ylim</code>	numeric; vector of length 2 giving lower and upper limits for the y-axis.
<code>main</code>	character; main plot title to be placed on top.
<code>gr.type</code>	character; the name of a graphics driver, either "postscript", "pdf", "png", or the default "windows".
<code>gr.file</code>	character; the path of a file for writing the graphics, only used if <code>gr.type</code> is not "windows".
<code>projargs</code>	character; projection arguments; the arguments must be entered exactly as in the PROJ.4 documentation.

Value

Returns (or plots) the bubble plot. Values plotted in the key include the five quantiles: minimum, 25th percentile, median, 75th percentile, and maximum.

Author(s)

J.C. Fisher

See Also

[bubble](#), [OpenGraphicsDevice](#)

Examples

```
data(ESRP_NWIS)
data(ESRP_Boundary)
data(ESRP_NED)

PlotBubble(ESRP_NWIS, "var1.acy", ESRP_Boundary,
  main = "Measurment error")
PlotBubble(ESRP_NWIS, "var1.sd", ESRP_Boundary,
  xlim = c(178000, 257500), ylim = c(202000, 272000),
  main = "Standard deviation", projargs = proj4string(ESRP_NED))
```

PlotRaster

*Create a Filled Contour Plot of Spatial Data***Description**

Raster plot for spatial data with attributes.

Usage

```
PlotRaster(grd, zcol, pts, ply, net.idx, rm.idx, xlim, ylim, at,
           pal = heat.colors, contour = FALSE, label.contours = FALSE,
           label.pts = FALSE, main = "", gr.type = "windows",
           gr.file = NULL, width = 7, height = NA, lo = list(),
           ll.lines = FALSE)
```

Arguments

grd	SpatialGridDataFrame; raster data.
zcol	character; z-variable column name or number in attribute table of grd.
pts	SpatialPointsDataFrame; point coordinates to include in layout.
ply	SpatialPolygonsDataFrame; a polygon defining the spatial domain of the raster data; data outside this domain is excluded. Polygon is included in the layout.
net.idx	integer; vector of row indexes in pts, point coordinates at these sites are drawn as circle symbols with white backgrounds. All other circle symbols are drawn with gray backgrounds.
rm.idx	integer; vector of row indexes in pts, point symbols at these sites are drawn as crosses.
xlim	numeric; vector of length 2 giving left and right limits for the x-axis.
ylim	numeric; vector of length 2 giving lower and upper limits for the y-axis.
at	numeric; vector giving breakpoints along the range of z (including upper and lower limits).
pal	function; a color palette to be used to assign colors in the plot.
contour	logical; add contour lines to plot, default is FALSE.
label.contours	logical; label contour lines, default is FALSE.
label.pts	character or logical; attribute in pts specifying the labels to place at point coordinates. If TRUE, points are labeled with index numbers.
main	character; main plot title to be placed on top.
gr.type	character; the name of a graphics driver, either "postscript", "pdf", "png", or the default "windows".
gr.file	character; the path of a file for writing the graphics, only used if gr.type is not "windows".
width, height	numeric; the (nominal) width and height of the canvas of the plotting window in inches.
lo	list; a list with more layout items, see sp.layout argument in spplot .
ll.lines	logical; plot long-lat grid over projected data, default is FALSE.

Details

Spatial data is transformed to the map projection and datum of the raster data set, grd.

Value

Returns (or plots) the raster plot.

Author(s)

J.C. Fisher

See Also

[spplot](#)

Examples

```
data(ESRP_NED)
data(ESRP_NWIS)
data(ESRP_Boundary)
data(ESRP_Lakes)
data(ESRP_Rivers)
data(INL_Boundary)

# Plot topography
PlotRaster(ESRP_NED, "var2")

# Set axis limits, add points and long-lat grid to plot layout
pts <- ESRP_NWIS[ESRP_NWIS$network.nm == "State", ]
xlim <- c(10000, 328000)
ylim <- c(81200, 335700)
PlotRaster(ESRP_NED, "var2", pts, ESRP_Boundary, xlim = xlim, ylim = ylim,
           pal = terrain.colors, label.pts = "map.no", ll.lines = TRUE)

# Plot hill shade, add lakes, river, and INL boundary to the plot layout
slp <- terrain(raster(ESRP_NED), opt = "slope")
asp <- terrain(raster(ESRP_NED), opt = "aspect")
grd <- as(hillShade(slp, asp, 40, 270), "SpatialGridDataFrame")
zlim <- range(grd[[1]], na.rm = TRUE)
at <- seq(zlim[1], zlim[2], length.out = 50)
pal <- function(n) grey(0:50 / 50)[1:n]
lo <- list()
lo[[1]] <- list("sp.polygons", ESRP_Lakes, col = "#1B70E0", fill = "#BAE4E5",
              first = FALSE)
lo[[2]] <- list("sp.lines", ESRP_Rivers, col = "#1B70E0", first = FALSE)
lo[[3]] <- list("sp.polygons", INL_Boundary, col = "#000000", first = FALSE)
PlotRaster(grd, 1, xlim = xlim, ylim = ylim, at = at, pal = pal, lo = lo)

# Set new axis limits
pts <- ESRP_NWIS[ESRP_NWIS$network.nm == "INL", ]
xlim <- c(178000, 257500)
ylim <- c(202000, 272000)
PlotRaster(ESRP_NED, "var2", pts, ESRP_Boundary, xlim = xlim, ylim = ylim,
           pal = terrain.colors, ll.lines = TRUE, contour = TRUE)
```

ReadNWISData

*Read USGS NWIS Data***Description**

This function reads water-level measurements exported from the U.S. Geological Survey (USGS) National Water Information System (NWIS) database and summarizes this data for a specified duration of time.

Usage

```
ReadNWISData(file, dt.lim, dt.fmt = "%Y-%m-%d %H:%M", sep = "\t")
```

Arguments

<code>file</code>	character; a path to the file to be opened.
<code>dt.lim</code>	character; vector of length 2 giving the starting and ending date-time limits. Measurements recorded during this time period are used to calculate the median water-level elevation <code>var1</code> and mean measurement accuracy <code>var1.acy</code> . Defaults to the entire period of record.
<code>dt.fmt</code>	character; a date-time format as used by strptime . Date-time values specified in <code>dt.lim</code> must be provided in this format.
<code>sep</code>	character; the field separator string. Values on each line of the file are separated by this string, its default is the tab separator.

Format

The input text file contains the names of the variables in its first line. Each subsequent line corresponds to a single water-level measurement. Measurement variables (columns in the data table) include:

SITE_NO Site number.

DEC_LONG_VA Decimal longitude.

DEC_LAT_VA Decimal latitude.

COORD_ACY_CD Latitude/longitude coordinate accuracy code (optional).

COORD_DATUM_CD Latitude/longitude (horizontal) coordinate datum code (optional).

COORD_METH_CD Code indicating the method used to determine horizontal datum (optional).

ALT_VA Gage or land-surface datum, in feet.

ALT_ACY_VA Accuracy of land-surface datum, in feet.

ALT_DATUM_CD Code indicating the geodetic or local vertical datum of the elevation datum elevation component (optional); for example, "NGVD29" or "NAVD88".

ALT_METH_CD Code indicating the method used to determine the elevation of land-surface datum (optional).

HOLE_DEPTH_VA Borehole depth, in feet (optional).

WELL_DEPTH_VA Well depth, in feet (optional).

LEV_DT Date/time when water-level measurement was recorded. The expected conversion specification format is "%Y-%m-%d %H:%M:%S"; see [strftime](#) for details.

LEV_VA Water-level measurement referenced to land-surface datum (that is, depth below land surface), in feet.

LEV_ACY_CD Water-level measurement accuracy code.

LEV_METH_CD Code indicating how the water level was measured (optional).

STATION_NM Site name (optional).

NETWORK_NM Water-level monitoring network name (optional). Sites belonging to multiple networks should be comma separated. This variable is not included in the NWIS database and it is tasked to the user to populate this field.

Details

This function is a pre-processor for **ObsNetwork**. Groundwater data can be downloaded at [NWISWeb](#).

Value

Returns an object of [SpatialPointsDataFrame-class](#) with components:

site.no	numeric; unique identifier for site.
var1	numeric; the median value of the water-level elevation, in meters, for the time period defined by dt.lim.
var1.acy	numeric; mean measurement accuracy of the water-level elevation, in meters, for the time period defined by dt.lim. This variable is calculated from the summation of alt.acy.va and lev.acy.va values.
var1.sd	numeric; standard deviation of the water-level elevation, in meters, for the entire period of record.
var2	numeric; land-surface datum, in meters.
map.no	integer; identifier (row index number) used to locate sites on map.
network.nm	character; monitoring network name.
nrec.por	integer; number of records in the entire period of record.
nrec	integer; number of records in the time period defined by dt.lim.
alt.acy.va	numeric; accuracy of land-surface datum, in meters.
lev.acy.va	numeric; mean water-level measurement accuracy, in meters, for the time period defined by dt.lim.
coord.acy.va	numeric; latitude/longitude coordinate accuracy, in arc-seconds.
coord.meth.cd	character; method used to determine horizontal datum.
alt.meth.cd	character; method used to determine elevation at land-surface datum.
lev.meth.cd	character; all methods used to determine water levels, comma separated.
site.nm	character; site name.

Author(s)

J.C. Fisher

See Also

[read.table](#), [as.POSIXct](#), [CRS](#)

Examples

```
# Read data from text file
file <- system.file("extdata/ESRP_NWIS.txt.gz", package = "ObsNetwork")
dt.lim <- c("2008-01-01 00:00", "2008-12-31 23:59") # 2008 calendar year
obj <- ReadNWISData(file, dt.lim)
str(obj)

# Compare with available data set
data(ESRP_NWIS)
identical(obj, ESRP_NWIS)
```

RunCrossValidation	<i>Run Cross Validation</i>
--------------------	-----------------------------

Description

Cross validation function for kriging; a wrapper around the [krige.cv](#) function in the **gstat** package. This function may be used to identify negative aspects of a kriging model, such as the worst errors or the areas with consistent bias.

Usage

```
RunCrossValidation(formula, pts, model, nfold = nrow(pts), ...,
                   projargs = proj4string(pts))
```

Arguments

formula	formula; defines the dependent variable as a linear model of independent variables.
pts	SpatialPointsDataFrame; data at observation sites.
model	variogramModel; variogram model of dependent variable defined by a call to vgm .
nfold	numeric; for local kriging, the number of nearest observations that should be used for a kriging prediction or simulation, where nearest is defined in terms of the space of the spatial locations. By default, all observations are used.
...	other arguments that will be passed to predict.gstat .
projargs	character; projection arguments; the arguments must be entered exactly as in the PROJ.4 documentation.

Value

Returns a list with components:

cv	SpatialPointsDataFrame; attributes of prediction and prediction variance of cross validated data points, observed values, residuals, zscore (residual divided by kriging standard error), and fold.
me	numeric; mean error, ideally 0.
mspe	numeric; mean squared prediction error, ideally small.
cor.op	numeric; correlation of observed and predicted, ideally 1.
cor.pr	numeric; correlation of predicted and residual, ideally 0.


```

plot(vg, model, main = "Residual variogram model (var1 ~ x + y)")

Krige(fo, model, xlim, ylim)
cv <- RunCrossValidation(fo, pts, model = model)
cat(cv$me, cv$mspe, cv$cor.op, cv$cor.pr, "\n")

### Kriging with External Drift (KED); assumes var1 forms a subdued replica of var2:
fo <- var1 ~ var2
lm.trend <- lm(fo, data = pts)
summary(lm.trend)
plot(fo, pts, main = "Correlation plot and fitted regression model")
abline(lm.trend)

vg <- variogram(fo, pts)
model <- fit.variogram(vg, vgm(psill = 4500, model = "Sph", range = 100000,
                             nugget = 0), fit.method = 1)
plot(vg, model, main = "Residual variogram model (var1 ~ var2)")
Krige(fo, model, xlim, ylim)
cv <- RunCrossValidation(fo, pts, model = model)
cat(cv$me, cv$mspe, cv$cor.op, cv$cor.pr, "\n")
PlotBubble(cv$cv, "residual", ply , xlim , ylim, main = "Residuals")

# KED in a local neighborhood:
cv <- RunCrossValidation(fo, pts, model = model, nmax = 50)
cat(cv$me, cv$mspe, cv$cor.op, cv$cor.pr, "\n")

```

WriteGAResults

Write Results of Genetic Algorithm

Description

Prints list components returned from the `OptimizeNetwork` function to a file.

Usage

```
WriteGAResults(x, file)
```

Arguments

<code>x</code>	list; object returned from OptimizeNetwork .
<code>file</code>	character; path of a file for writing (optional).

Details

Printed components of `ga` include: `call`; `obj.values`; `rmsd`; `local.error`; `niters`; `nrep.ans`; `proc.time`; `start.time`; `obj.space`; `ncalls.penalty`; `pts.rm`; and `ga.ans@suggestion`.

Value

None (invisible NULL).

Author(s)

J.C. Fisher

See Also[OptimizeNetwork](#)**Examples**

```
## Not run: WriteGAResults(ans)
```

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