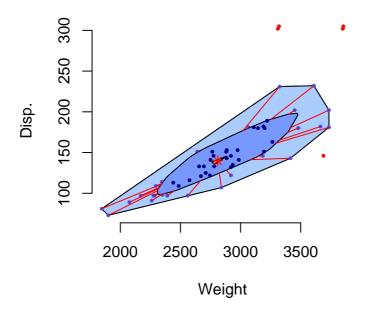
## A rough R Impementation of the Bagplot

File: bagplot.rev in: /home/wiwi/pwolf/R/work/bagplot

Version: 31<sup>th</sup> August, 2007



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In this paper we describe a rough implementation of the bagplot. The first section shows some examples. Section 2 compares our bagplot function to the solution of Rousseeuw, Ruts, and Tukey (1999). Then the arguments, the help page of the function bagplot and some links are listed. In section 4 you find the definition of the function. In the appendix further examples for testing are given and some old code chunks are listed.

1  $\langle version \ of \ bagplot \ 1 \rangle \equiv$ 

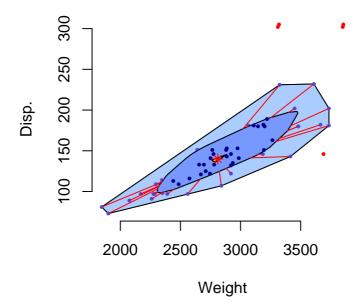
## 2007/08/31 peter wolf ##

## 1 Examples

## 1.1 Example: car data (Chambers / Hastie 1992)

The first example is a bagplot of the famous car data of Chambers and Hastie. In the code chunk the data set is assigned to cardata and bagplot() is called with some parameters that are described later in this paper.

```
2  \( \langle \text{cardata 2} \) \( \text{define bagplot 29} \)
    library(rpart); cardata<-car.test.frame[,6:7]; par(mfrow=c(1,1))
    bagplot(cardata,verbose=FALSE,factor=3,show.baghull=TRUE,dkmethod=2,
    show.loophull=TRUE,precision=1)$center
    #title("car data Chambers/Hastie 1992")</pre>
```



The Tukey median of our bagplot function is (2810.431, 139.879). Splus computes a slightly different point: (2806.63, 139.513). In difference to Rousseeuw et al. our bagplot as well as the bagplot of Splus classified the data point of Nissan Van 4 as outlier. To get the Splus results you have to download bagplot\*, the car data and ...

```
Splus CHAPTER bagplot.f
Splus make
Splus ...
> dyn.open("S.so"); source("bagplot.s") #; postscript("hello.ps")
> bagplot(cardata[,1],cardata[,2]) #; dev.off()
```

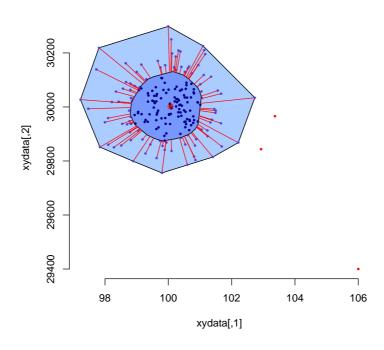
For R have a look at: http://www.statistik.tuwien.ac.at/public/filz/students/edavis/ws0607/skriptum/page134.html

## 1.2 The normal case

```
A bagplot of an rnorm sample with one heavy outlier is shown by the following code chunk.

(rnorm 3) =
(define bagplot 29)
seed<-222; n<-200
(define rnorm data data, seed: seed, size: n 76)
datan<-rbind(data,c(106,294)); datan[,2]<-datan[,2]*100
bagplot(datan,factor=3,create.plot=TRUE,approx.limit=300,
show.outlier=TRUE,show.looppoints=TRUE,show.bagpoints=TRUE,
show.whiskers=TRUE,show.loophull=TRUE,show.baghull=TRUE,
verbose=FALSE)
title(paste("seed: ",seed,"/ n: ",n))
```

seed: 222 / n: 200



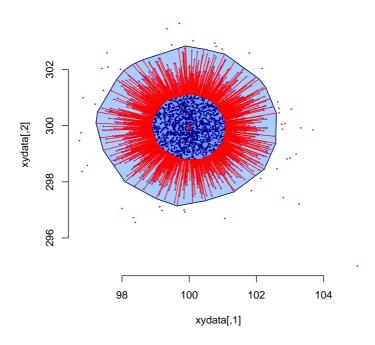
## 1.3 Large data sets

4

What about very large data sets? The algorithm computes some of the quantities of the bagplot on base of a sample if there are more then approx.limit data points.

```
⟨large 4⟩ ≡
seed<-174; n<-3000
⟨define rnorm data data, seed: seed, size: n 76⟩
datan<-rbind(data,c(105,295))
bagplot(datan,factor=2.5,create.plot=TRUE,approx.limit=1000,
    cex=0.2,show.outlier=TRUE,show.looppoints=TRUE,
    show.bagpoints=TRUE,dkmethod=2,show.loophull=TRUE,
    show.baghull=TRUE,verbose=FALSE,debug.plots="no")
title(paste("seed:",seed,"/n:",n))</pre>
```

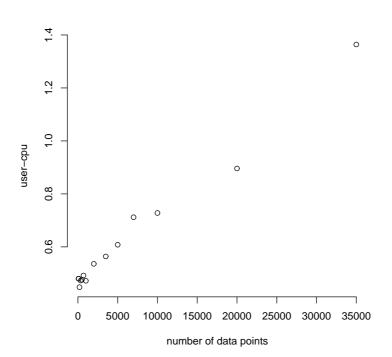
#### seed: 174 / n: 3000



#### 1.4 Size of data set

The time for computation increases with the number of observations. To illustrate the run times we measure the times necessary for rnorm data sets of different sizes and plot the results.

```
5
      \langle rnorm, different \ sizes \ 5 \rangle \equiv
       (define bagplot 29)
       nn<-c(50,70,100,200,350); nn<-c(nn,10*nn,100*nn);nn<-nn[-1]
       result<-1:length(nn)
       for(j in seq(along=nn)){
         seed<-111; set.seed(seed); n<-nn[j]</pre>
         xy<-cbind(rnorm(n),rnorm(n))</pre>
         result[j]<-system.time(</pre>
           bagplot(xy,factor=3,create.plot=FALSE,approx.limit=300,
            show.outlier=TRUE,show.looppoints=TRUE,show.bagpoints=TRUE,
            show.whiskers=TRUE,show.loophull=TRUE,show.baghull=TRUE,
            verbose=FALSE)
            )[1]
       plot(nn,result,bty="n",ylab="user-cpu",xlab="number of data points")
       names(result)<-nn; result</pre>
```

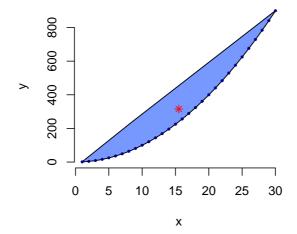


Wed Aug 29 11:29:35 2007

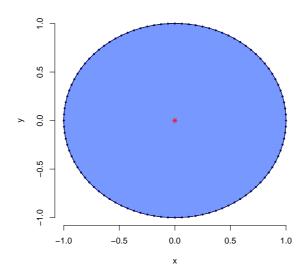
70 100 200 350 500 700 1000 2000 3500 5000 7000 10000 20000 35000
0.480 0.480 0.448 0.473 0.476 0.492 0.472 0.536 0.564 0.608 0.712 0.728 0.896 1.364

## 1.5 "Depth-One" data sets

It is very interesting to test extrem cases. What happens if the depths of all points are one?  $\langle \textit{quadratic 6} \rangle \equiv \\ \langle \textit{define} \ \texttt{bagplot} \ 29 \rangle \\ \texttt{bagplot} \ (\texttt{x=1:30}) \ \texttt{,y=(1:30)} \ \texttt{,verbose=FALSE}, \texttt{dkmethod=2})$ 



7  $\langle circle 7 \rangle \equiv \langle define \ bagplot \ 29 \rangle$  n < -100; bagplot(x = cos((1:n)/n \* 2 \* pi), y = sin((1:n)/n \* 2 \* pi),precision = 1, verbose = FALSE, dkmethod = 2, debug.plot = FALSE)\$center

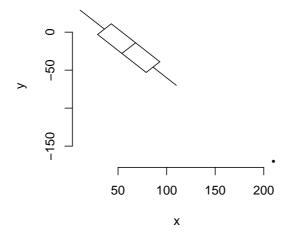


## 1.6 Degenerated data sets

8

What happens if all the data points lie in a one dimensional subspace?  $\langle onedim~8 \rangle \equiv$ 

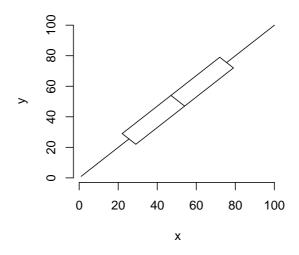
bagplot(x=10+c(1:100,200),y=30-c(1:100,200),verbose=FALSE)



Here is a second one dim data set.

9  $\langle one \ dim \ test \ 9 \rangle \equiv$ 

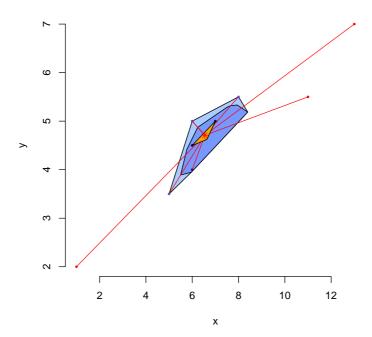
bagplot(x=(1:100),y=(1:100),verbose=FALSE)



#### 1.7 Data set from the mail of M. Maechler

The data set of M. Maechler is discussed within R-help. Decide of yourself if our bagplot is acceptable. Maybe this doesn't matter because mostly a data set is *in regular position* (Rousseeuw, Ruts 1998) and there are no identical coordinates. But it may happen, e.g. in the car data set there are two points that are identical.

M. Maechler wrote in a reply concerning a bagplot question that the correct Tukey median is (6.75, 4.875) and not (6.544480, 4.708483) that is computed by our bagplot procedure.

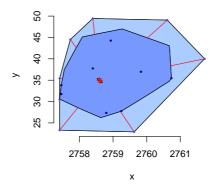


## 1.8 Data sets of Wouter Meuleman, running in an error with version 09/2005

An old bagplot version runs into errors with following data set. During the computation of \( \frac{find}{\text{ hull.bag}} \) 65\( \rangle \) some NaN values occured.

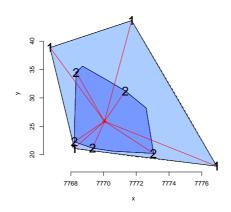
12

```
⟨data set 2 of Wouter Meuleman 12⟩ ≡
    a<-gsub("\n"," ",c("3 2759.626 22.90411 6 2757.461 31.75789 13 2758.931 44.25797
    15 2757.411 30.47785 16 2761.720 40.01067 18 2759.827 36.97118 19 2758.398 49.43611
    21 2757.411 23.30404 26 2757.461 33.81379 27 2758.398 37.75841 28 2759.244 27.74002
    32 2757.411 35.40853 34 2760.734 35.47206 38 2760.612 49.05950 39 2757.730 44.51406
    40 2758.798 27.33595"))
    a<-unlist(strsplit(paste(a,collapse="")," "))
    a<-as.numeric(a[a!=""]); a<-matrix(a,ncol=3,byrow=TRUE)
    ⟨define bagplot 29⟩
    bagplot(a[,2],a[,3],verbose=FALSE)</pre>
```



On 2006/02/17 some lines of code have been changed to remove the NaN values.

```
\(\langle \text{data set 1 of Wouter Meuleman 13} \) \(\text{ = a<-gsub("\n"," ",c("1 7766.734 38.86814 2 7768.329 34.50661 3 7769.335 21.14797 4 7768.221 21.08619 5 7776.913 17.97344 6 7768.221 22.27727 8 7771.719 43.62978 9 7773.056 20.22909 12 7771.334 31.22399"))
\(\text{ a<-unlist(strsplit(paste(a,collapse="")," "))} \)
\(\text{ a<-as.numeric(a[a!=""])} \)
\(\text{ a<-matrix(a,ncol=3,byrow=TRUE)} \)
\(\langle \text{ define bagplot 29} \)
\(\text{ bagplot(a[,2],a[,3],verbose=TRUE,dkmethod=2)} \)
```

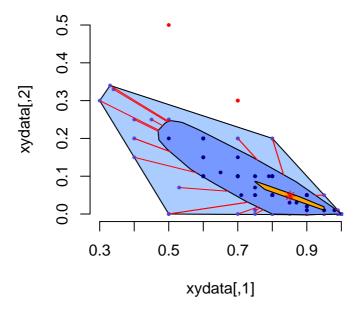


## The following data set was proposed by Ben Greiner in January 2007.

 $\langle test: data \ set \ of \ Ben \ Greiner \ 14 \rangle \equiv \langle define \ bagplot \ 29 \rangle$ 

14

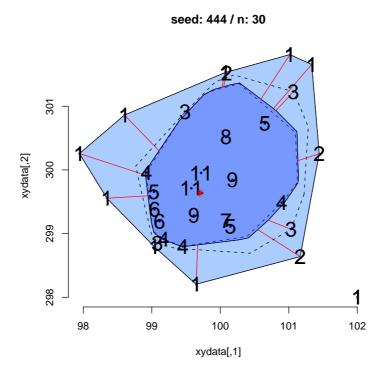
greiner.data<-cbind(c( 1,1,1,0.7,0.8,0.98,0.9,0.85,1,1,0.7,1,0.65, 0.8, 0.5, 0.7, 0.95, 0.7, 0.8, 0.8, 0.75, 1, 0.95, 0.7, 0.95, 0.8, 0.75, 0.7, 0.85, 0.8, 0.8, 1, 0.5, 0.9, 0.7, 0.8, 0.6, 0.9, 0.98, 1, 0.5, 0.45, 0.95, 1, 0.9, 0.9,0.7, 1, 1, 0.7, 1, 0.4, 0.9, 0.85, 0.75, 1, 0.5, 0.9, 0.4, 0.95, 0.8, 0.95, 0.99,1,0.34,0.6,1,0.9,0.6,0.7,0.8,0.7,0.95,1,0.6,0.99,0.85,0.78,0.8,1, 0.4, 1, 0.33, 0.99, 0.6, 0.8, 0.85, 0.75, 0.9, 0.9, 1, 0.9, 1, 0.8, 1, 0.9, 1, 0.71,0.4, 0.8, 1, 0.7, 1, 0.8, 1, 0.6, 0.6, 1, 0.6, 1, 1, 0.7, 0.85, 1, 0.8, 1, 0.95, 0.8,0.9, 0.8, 0.6, 0.85, 1, 0.9, 0.9, 0.8, 1, 1, 0.6, 0.9, 1, 1, 0.5, 0.75, 0.53, 0.8,0.7, 0.3, 0.8, 0.9, 0.7, 0.8, 0.6, 0.9, 0.8, 0.6, 1, 0.6, 1, 1, 0.9, 0.8, 0.7,0.7, 0.79, 0.8, 0.6, 0.9, 0.6, 0.8, 0.6, 0.7, 0.8, 0.99, 0.9, 0.75), c(0,0,0,0.1,0,0.01,0,0.05,0,0.0.1,0,0.11,0.1,0,0.1,0,0.3,0,0.07,0,0.01,0.1,0,0.05,0.05,0.3,0.05,0.1,0,0,0.25,0,0.1,0.05,0.2,0.05,0.01,0,0.25,0.25,0.05,0,0.05,0.02,0.1,0,0,0.1,0,0.25,0.03,0.05,0.1,0,0.2,0.01,0.2,0,0.1,0.01,0,0,0.33,0.1,0,0.05,0.15,0.1,0.1,0.1,0.01,0, 0.1, 0, 0.05, 0.07, 0.1, 0, 0.15, 0, 0.34, 0, 0.15, 0.1, 0.03, 0, 0, 0.05, 0, 0.05,0,0.2,0,0.01,0,0.05,0.2,0.05,0,0.15,0,0.05,0,0.2,0.2,0.2,0,0.2,0,0.2,0.05, 0.05, 0.05, 0.01, 0.05, 0.05, 0.1, 0.05, 0.05, 0.05, 0.05, 0.05, 0.05, 0.05, 0.15,0.05,0,0,0,0.05,0.07,0.05,0.1,0.3,0.05,0,0.1,0.1,0.2,0.02,0.05,0.2, 0.2, 0, 0.1, 0, 0, 0.05, 0.05, 0.1, 0.2, 0.1, 0, 0.5, 0, 0, 0.1, 0, 0.05, 0, 0.05, 0, 00.01, 0.05, 0.1, 0.03, 0, 0, 0, 0, 0, 0.1, 0.05, 0.1, 0.05, 0.1, 0, 0.2, 0.2, 0, 0.01, 0, 0.1)bagplot(greiner.data)



## 1.9 Bagplot with additional graphical supplements

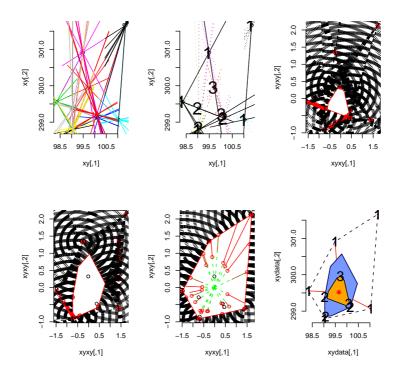
15

Verbose computation of bagplot of a sample of 100 rnorm points and an outlier is performed by the following code chunk. With the verbose option the h-depths of the data points are shown in the plot and some of the intermediate results are printed during the the computation.



## 1.10 Debugging plots with additional elements

Here is an example of plots generated with option debug.plots="all". This option has been helpful during debugging and now the plots can be classified as R art.



# 2 Bagplots by an alternative approach, proposed by Rousseeuw, Ruts and Tukey

As mentioned above there is a solution using a fortran procedure for generating bagplots, see:

http://www.statistik.tuwien.ac.at/public/filz/students/edavis/ws0607/skriptum/page134.html.

To get the procedure work you have to perform the following steps:

- fetch the fortran code by downloading
  - \$ get ftp://ftp.win.ua.ac.be/pub/software/agoras/newfiles/bagplot.tar.gz
     this link has been found on the web page: http://www.agoras.ua.ac.be/Locdept.htm
- unzip and unpack the tar.gz-file

```
$ gunzip bagplot.tar.gz; tar -xvf bagplot.tar
```

- $\bullet$  translate the fortran program <code>bagplot.f</code> and generate the object file <code>bagplot.so</code>
  - \$ R CMD SHLIB -o bagplot.so bagplot.f
- download bagplot-R-function

```
$ get http://www.statistik.tuwien.ac.at/public/filz/students/edavis/
ws0607/skriptum/bagplot.R
```

• start R and load so-file

```
17 \langle *17 \rangle \equiv  dyn.load("Tukey/bagplot.so")
```

• source bagplot function; to avoid conflicts in the names we change the name of the bagplot function of Rousseeuw, Ruts, and Tukey to BAGPLOT.

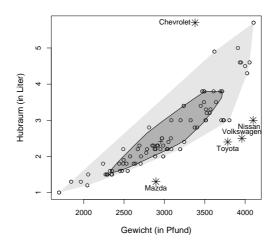
Here are the arguments of BAGPLOT():

```
Wed Aug 29 15:19:43 2007
function (x, y, plotinbag = T, plotoutbag = T, ident = T, drawfence = F,
    drawloop = T, truncxmin = NULL, truncxmax = NULL, truncymin = NULL,
    truncymax = NULL, xlab = "x", ylab = "y", ...)
```

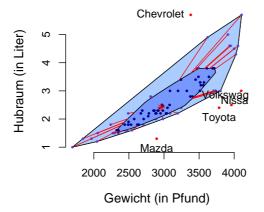
compute an example bagplot.

Here is the numerical result

[1] The coordinates of the Tukey median are ( 2954.84 , 2.40962 ). and the bagplot:



A reconstruction of this plot can be done by our bagplot function. For a suitable loop you have to set factor=2.8.



We find the center:

Tue Aug 28 19:06:10 2007
[1] 2958.051384 2.413979

The difference may be caused by numerical difficulties.

**Test of data set of Martin Maechler.** As a second example we check the bagplot functions by the data set of Martin Maecher.

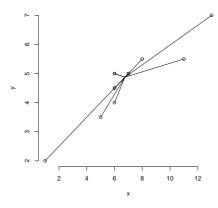
 $\langle BAGPLOT\ of\ data\ set\ of\ Martin\ Maechler\ 21 \rangle \equiv \langle assing\ data\ set\ of\ Martin\ Maechler\ to\ x0\ and\ y0\ 11 \rangle$  BAGPLOT ( x0 , y0 )

We get the numerical result ...

21

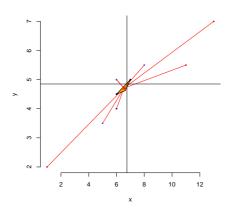
22

[1] The coordinates of the Tukey median are ( 6.75 , 4.875 ). and the following plot



Our procedure will compute slightly different results:

\(\lambda bagplot of data set of Martin Maechler to x0 and y0 11\rangle \)
\(\chi assing data set of Martin Maechler to x0 and y0 11\rangle \)
\(\chi assing data set of Martin Maechler to x0 and y0 11\rangle \)
\(\chi assing data set of Martin Maechler to x0 and y0 11\rangle \)
\(\chi assing data set of Martin Maechler to x0 and y0 11\rangle \)
\(\chi assing data set of Martin Maechler to x0 and y0 11\rangle \)
\(\chi assing data set of Martin Maechler to x0 and y0 11\rangle \)
\(\chi assing data set of Martin Maechler to x0 and y0 11\rangle \)
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\(\chi assing data set of Martin Maechler to x0 and y0 11\rangle \)
\(\chi assing data set of Martin Maechler to x0 and y0 11\rangle \)
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\(\chi assing data set of Martin Maechler to x0 and y0 11\rangle \)
\(\chi assing data set of Martin Maechler to x0 and y0 11\rangle \)
\(\chi assing data set of Martin Maechler to x0 and y0 11\rangle \)
\(\chi assing data set of Martin Maechler to x0 and y0 11\rangle \)
\(\chi assing data set of Martin Maechler to x0 and y0 11\rangle \)
\(\chi assing data set of Martin Maechler to x0 and y0 11\rangle \)
\(\chi assing data set of Martin Maechler to x0 and y0 11\rangle \)
\(\chi assing data set of Martin Maechler to x0 and y0 11\rangle \



The two lines mark the Tukey median computed by BAGPLOT. Our median is:

```
[1] 6.544480 4.708483
```

Now we check the stability of the functions by exchanging the variables.

```
23 \langle BAGPLOT \text{ of data set of Martin Maechler, exchanged variables 23} \rangle \equiv \langle assing \text{ data set of Martin Maechler to } \times 0 \text{ and } y \text{ 0 } 11 \rangle
BAGPLOT (y0, x0)
```

```
[1] The coordinates of the Tukey median are ( 4.84231 , 6.68461 ).
```

#### There is a difference! The relative difference is:

```
24 \langle BAGPLOT \ of \ data \ set \ of \ Martin \ Maechler, \ relative \ difference \ 24 \rangle \equiv abs((c(6.75,4.875)-c(4.84231,6.68461))/c(6.75,4.875))
```

```
[1] 0.2826207 0.3712021
```

#### How will our function master the test?

```
25 \langle bagplot\ of\ data\ set\ of\ Martin\ Maechler,\ exchanged\ variables\ 25 \rangle \equiv center.ex<-bagplot(y0,x0,show.baghull=FALSE,show.loophull=FALSE,create.plot=TRUE,show.whiskers=TRUE,factor=3,dkmethod=2,precision=1)$center
```

```
[1] 4.708846 6.540282
```

The relative difference is approximately 0.07%. If we increase the precision by precision=5 the difference is reduced as we like it:

```
26 ⟨bagplot of data set of Martin Maechler, difference if precision is increased 26⟩ ≡
center <-bagplot(x0,y0,create.plot=FALSE,factor=3,precision=6)$center
center.ex<-bagplot(y0,x0,create.plot=FALSE,factor=3,precision=6)$center
print(center)
abs(center-center.ex[2:1])/center
```

The results seems to be identical for we get:

```
[1] 6.541650 4.708349 [1] 0 0
```

By analyzing the scatterplot we find that the area of the points with h-depth 4 is a triangle. The corners of this triangle are: (6, 4.5), (7,5) and (6.625, 14.125). The center of its gravity is equal to the mean of the three points and we get the Tukey median (6.541666, 4.7083333). Our bagplot function finds a result that is very near to the one computed by hand.

**Memory faults.** There are some other problems with the implementation via the fortran procedure because we got some memory faults during testing BAGPLOT. These errors killed the R process and some of the computed result got lost. But it was not difficult to reconstruct them ... by relax.

# 3 Arguments and output of bagplot, the help page and some links

A summary of the arguments can be found by args().

The output of bagplot is a list of the relevant quantities of the constructed bagplot. To identify singular points, use identify(). Here is a short description of the return values:

```
center
                Tukey median
hull.loop
                set of points of polygon that defines the loop
hull.baq
                set of points of polygon that defines the bag
hull.center region of points with maximal ldepth
pxy.outlier outlier
pxy.outer outer points
pxy.bag points in bag hdepth location depth of data points in xy
is.one.dim is TRUE if data set is one dimensional
prdata
               result of PCA
random.seed random.seed that is set by bagplot
xydata
                data set
                sample of data set
```

The help page is defined as a code chunk.

```
\langle define\ help\ of\ \texttt{bagplot}\ 28 \rangle \equiv
 \name{bagplot}
 \alias{bagplot}
 \alias{compute.bagplot}
 \alias{plot.bagplot}
 \title{ bagplot, a bivariate boxplot }
 \description{
   \code{compute.bagplot()} computes an object
   describing a bagplot of a bivariate data set.
   \code{plot.bagplot()} plots a bagplot object.
   \code{bagplot()} computes and plots a bagplot.
 \usage{
bagplot(x, y, factor = 3, na.rm = FALSE, approx.limit = 300,
        show.outlier = TRUE, show.whiskers = TRUE,
        show.looppoints = TRUE, show.bagpoints = TRUE,
        show.loophull = TRUE, show.baghull = TRUE,
        create.plot = TRUE, add = FALSE, pch = 16, cex = 0.4,
        dkmethod = 2, precision = 1, verbose = FALSE,
        debug.plots = "no", col.loophull="#aaccff",
```

```
col.looppoints="#3355ff", col.baghull="#7799ff",
       col.bagpoints="#000088", transparency=FALSE, ...
compute.bagplot(x, y, factor = 3, na.rm = FALSE, approx.limit = 300,
       dkmethod=2,precision=1,verbose=FALSE,debug.plots="no")
plot.bagplot(x,
       show.outlier = TRUE, show.whiskers = TRUE,
       show.looppoints = TRUE, show.bagpoints = TRUE,
       show.loophull = TRUE, show.baghull = TRUE,
       add = FALSE, pch = 16, cex = 0.4, verbose = FALSE,
       col.loophull="#aaccff", col.looppoints="#3355ff",
       col.baghull="#7799ff", col.bagpoints="#000088",
       transparency=FALSE,...)
\arguments{
  \forall x \in \{x\} \{ x \text{ values of a data set} \}
     in \code{bagplot}: an object of class \code{bagplot}
     computed by \code{compute.bagplot} }
  \left( y \right)  y values of the data set }
  \item{factor}{ factor defining the loop }
  \item{na.rm}{ if TRUE 'NA' values are removed otherwise exchanged by mean}
  \item{approx.limit}{ if the number of data points exceeds
          \code{approx.limit} a sample is used to compute
          some of the quantities; default: 300 }
  \item{show.outlier}{ if TRUE outlier are shown }
  \item{show.whiskers}{ if TRUE whiskers are shown }
  \item{show.looppoints}{ if TRUE loop points are plottet }
  \item{show.bagpoints}{ if TRUE bag points are plottet }
  \item{show.loophull}{ if TRUE the loop is plotted }
  \item{show.baghull}{ if TRUE the bag is plotted }
  \item{create.plot}{ if FALSE no plot is created }
  \item{add}{ if TRUE the bagplot is added to an existing plot }
  \left( \operatorname{pch} \right) \ sets the plotting character \left( \operatorname{pch} \right) \
  \item{cex}{ sets characters size}
  \item{dkmethod}{ 1 or 2, there are two method of
     approximating the bag, method 1 is very rough }
  \operatorname{default}: 1
  \item{verbose}{ automatic commenting of calculations
  \item{debug.plots}{ if TRUE additional plots describing
                      intermediate results are constructed }
  \item{col.loophull}{ color of loop hull }
  \item{col.looppoints}{ color of the points of the loop }
  \item{col.baghull}{ color of bag hull }
  \item{col.bagpoints}{ color of the points of the bag }
  \item{transparency}{ see section details }
  \item{\dots}{ additional graphical parameters }
\details{
A bagplot is a bivariate generalization of the well known
boxplot. It has been proposed by Rousseeuw, Ruts, and Tukey.
In the bivariate case the box of the boxplot changes to a
convex polygon, the bag of bagplot. In the bag are 50 percent
of all points. The fence separates points within the fence from
points outside. It is computed by increasing the
```

```
the bag. The loop is defined as the convex hull containing
all points inside the fence.
If all points are on a straight line you get a classical
boxplot.
\code{bagplot()} plots bagplots that are very similar
to the one described in Rousseeuw et al.
Remarks:
The two dimensional median is approximated.
For large data sets the error will be very small.
On the other hand it is not very wise to make a (graphical)
summary of e.g. 10 bivariate data points.
In case you want to plot multiple (overlapping) bagplots,
you may want plots that are semi-transparent. For this
you can use the \code{transparency} flag.
If \code{transparency==TRUE} the alpha layer is set to '99' (hex).
This causes the bagplots to appear semi-transparent,
but ONLY if the output device is PDF and opened using:
\code{pdf(file="filename.pdf", version="1.4")}.
For this reason, the default is \code{transparency==FALSE}.
This feature as well as the arguments
to specify different colors has been proposed by Wouter Meuleman.
\value{
  \code{compute.bagplot} returns an object of class
  \code{bagplot} that could be plotted by
  \code{plot.bagplot()}.
\references{ P. J. Rousseeuw, I. Ruts, J. W. Tukey (1999):
    The bagplot: a bivariate boxplot, The American
    Statistician, vol. 53, no. 4, 382--387 }
\author{ Peter Wolf }
\note{
  Version of bagplot: 08/2007 }
\seealso{ \code{\link[graphics]{boxplot}} }
\examples{
  # example: 100 random points and one outlier
  dat<-cbind(rnorm(100)+100,rnorm(100)+300)
  dat<-rbind(dat,c(105,295))</pre>
  bagplot(dat,factor=2.5,create.plot=TRUE,approx.limit=300,
     show.outlier=TRUE, show.looppoints=TRUE,
     show.bagpoints=TRUE,dkmethod=2,
     show.whiskers=TRUE, show.loophull=TRUE,
     show.baghull=TRUE, verbose=FALSE)
  # example of Rousseeuw et al., see R-package rpart
  cardata <- structure(as.integer( c(2560,2345,1845,2260,2440,</pre>
   2285, 2275, 2350, 2295, 1900, 2390, 2075, 2330, 3320, 2885,
   3310, 2695, 2170, 2710, 2775, 2840, 2485, 2670, 2640, 2655,
   3065, 2750, 2920, 2780, 2745, 3110, 2920, 2645, 2575, 2935,
   2920, 2985, 3265, 2880, 2975, 3450, 3145, 3190, 3610, 2885,
   3480, 3200, 2765, 3220, 3480, 3325, 3855, 3850, 3195, 3735,
   3665, 3735, 3415, 3185, 3690, 97, 114, 81, 91, 113, 97, 97,
   98, 109, 73, 97, 89, 109, 305, 153, 302, 133, 97, 125, 146,
   107, 109, 121, 151, 133, 181, 141, 132, 133, 122, 181, 146,
   151, 116, 135, 122, 141, 163, 151, 153, 202, 180, 182, 232,
   143, 180, 180, 151, 189, 180, 231, 305, 302, 151, 202, 182,
   181, 143, 146, 146)), .Dim = as.integer(c(60, 2)),
   .Dimnames = list(NULL, c("Weight", "Disp.")))
```

#### Here are some important links:

```
http://www.cim.mcgill.ca/~lsimard/Pattern/TheBag.htm
http://www.math.yorku.ca/SCS/Gallery/bright-ideas.html
http://maven.smith.edu/~streinu/Research/LocDepth/algorithm.html
http://www.agoras.ua.ac.be/abstract/Bagbiv97.htm
http://www.agoras.ua.ac.be/Locdept.htm
http://article.gmane.org/gmane.comp.lang.r.general/25235
http://finzi.psych.upenn.edu/R/Rhelp02a/archive/45106.html
http://delivery.acm.org/10.1145/370000/365565/
p690-miller.pdf?key1=365565&key2=9093786211&coll=GUIDE&
d1=GUIDE&CFID=53086693&CFTOKEN=38519152
http://www.cs.tufts.edu/research/geometry/half_space/
http://www.statistik.tuwien.ac.at/public/filz/students/edavis/
ws0607/skriptum/page134.html
```

## 4 The definition of bagplot

29

The function bagplot is a container that calls the two functions compute.bagplot and plot.bagplot. The first one generates an object of class bagplot and the second one is called by the generic plot function.

```
\langle define \ bagplot \ 29 \rangle \equiv
 \langle define compute.bagplot 30 \rangle
 (define plot.bagplot 69)
bagplot<-function(x,y,</pre>
    factor=3, # expanding factor for bag to get the loop
    {\tt na.rm=FALSE}, {\tt \#} should 'NAs' values be removed or exchanged
    approx.limit=300, # limit
    show.outlier=TRUE, # if TRUE outlier are shown
    show.whiskers=TRUE, # if TRUE whiskers are shown
    show.looppoints=TRUE, # if TRUE points in loop are shown
    show.bagpoints=TRUE, # if TRUE points in bag are shown
    show.loophull=TRUE, # if TRUE loop is shown
    show.baghull=TRUE, # if TRUE bag is shown
    create.plot=TRUE, # if TRUE a plot is created
    add=FALSE, # if TRUE graphical elements are added to actual plot
    pch=16,cex=.4, # some graphical parameters
    dkmethod=2, # in 1:2; there are two methods for approximating the bag
    precision=1, # controls precision of computation
    verbose=FALSE,debug.plots="no", # tools for debugging
    col.loophull="#aaccff", # Alternatives: #ccffaa, #ffaacc
    col.looppoints="#3355ff", # Alternatives: #55ff33, #ff3355
    col.baghull="#7799ff", # Alternatives: #99ff77, #ff7799
    col.bagpoints="#000088", # Alternatives: #008800, #880000
    transparency=FALSE, ... # to define further parameters of plot
 ) {
```

```
⟨version of bagplot 1⟩
         bo<-compute.bagplot(x=x,y=y,factor=factor,na.rm=na.rm,
                approx.limit=approx.limit,dkmethod=dkmethod,
                precision=precision,verbose=verbose,debug.plots=debug.plots)
         if(create.plot){
           plot(bo,
             show.outlier=show.outlier,
             show.whiskers=show.whiskers,
             show.looppoints=show.looppoints,
            show.bagpoints=show.bagpoints,
             show.loophull=show.loophull,
             show.baghull=show.baghull,
            add=add,pch=pch,cex=cex,...,
            verbose=verbose,
            col.loophull=col.loophull,
            col.looppoints=col.looppoints,
            col.baghull=col.baghull,
             col.bagpoints=col.bagpoints,
             transparency=transparency
         invisible(bo)
      compute.bagplot computes the relevant values to allow plot.bagplot to draw
      the bagplot.
30
      \langle define compute.bagplot 30 \rangle \equiv
       compute.bagplot<-function(x,y,
          factor=3, # expanding factor for bag to get the loop
          na.rm=FALSE, # should NAs removed or exchanged
          approx.limit=300, # limit
          dkmethod=2, # in 1:2; method 2 is recommended
          precision=1, # controls precision of computation
          verbose=FALSE,debug.plots="no" # tools for debugging
          \langle version \ of \ bagplot \ 1 \rangle
          (body of compute.bagplot 31)
```

## 4.1 The body of compute.bagplot

Here you see the main steps of the construction of a bagplot.

```
31 \langle body\ of\ compute.\ bagplot\ 31 \rangle \equiv \langle init\ 33 \rangle
\langle check\ and\ handle\ linear\ case\ 46 \rangle
\langle standardize\ data\ and\ compute.\ xyxy,\ xym,\ xysd\ 47 \rangle
\langle compute\ angles\ between\ points\ 48 \rangle
\langle compute\ hdepths\ 49 \rangle
\langle find\ k\ 50 \rangle
\langle compute\ hdepths\ of\ test\ points\ to\ find\ center\ 51 \rangle
if (\ dkmethod==1)\ \{
\langle method\ one:\ find\ hulls\ of\ D_k\ and\ D_{k-1}\ 55 \rangle
\} else\{
\langle method\ two:\ find\ hulls\ of\ D_k\ and\ D_{k-1}\ 56 \rangle
```

```
}
\langle find value of lambda 64 \\
\langle find hull.bag 65 \\
\langle find hull.loop 66 \\
\langle find points outside of bag but inside loop 67 \\
\langle find hull of loop 68 \\
\langle output result 32 \\
\end{align*
```

### 4.2 Output of bagplot

The following table of output values of bagplot is copy from section 2:

```
Tukey median
center
hull.loop
                set of points of polygon that defines the loop
                set of points of polygon that defines the bag
hull.bag
hull.center region of points with maximal ldepth
pxy.outlier outlier
pxy.outer
               outer points
pxy.bag points in bag location depth of data points in xy
is.one.dim is TRUE if data set is one dimensional
              result of PCA
prdata
random.seed random.seed that is set by bagplot
xydata
                data set
                sample of data set
ху
```

These elements are return as a list.

```
32
      \langle output \ result \ 32 \rangle \equiv
       res<-list(
        center=center,
        hull.center=hull.center,
        hull.bag=hull.bag,
        hull.loop=hull.loop,
        pxy.bag=pxy.bag,
        pxy.outer=if(length(pxy.outer)>0) pxy.outer else NULL,
        pxy.outlier=if(length(pxy.outlier)>0) pxy.outlier else NULL,
        hdepths=hdepth,
        is.one.dim=is.one.dim,
        prdata=prdata,
        random.seed=random.seed,
        xy=xy,xydata=xydata
       if(verbose) res<-c(res,list(exp.dk=exp.dk,exp.dk.1=exp.dk.1,hdepth=hdepth))</pre>
       class(res)<-"bagplot"
       return(res)
```

#### **4.3 Initilization of bapplot**

Points with identical coordinates may result in numerical problem. Therefore, some noise may be added to the data – for this feature the comment signs have to be deleted.

```
33 \langle init \, 33 \rangle \equiv # define some functions
```

```
⟨define function win 34⟩
⟨define function out.of.polygon 35⟩
(define function cut.z.pg 36)
⟨define function find.cut.z.pg 37⟩
⟨define function hdepth.of.points 39⟩
(define function expand.hull 40)
⟨define function cut.p.sl.p.sl 38⟩
(define function pos. to.pg 45)
(define find.polygon.center 54)
# check input
xydata < -if(missing(y)) x else cbind(x,y)
if(is.data.frame(xydata)) xydata<-as.matrix(xydata)</pre>
if(any(is.na(xydata))){
  if(na.rm){ xydata<-xydata[!apply(is.na(xydata),1,any),,drop=FALSE]</pre>
    print("Warning: NA elements have been removed!!")
  }else{
    xy.means<-colMeans(xydata,na.rm=TRUE)
    for(j in 1:ncol(xydata)) xydata[is.na(xydata[,j]),j]<-xy.means[j]</pre>
    print("Warning: NA elements have been set to mean values!!")
if(nrow(xydata)<3) {print("not enough data points"); return()}</pre>
# select sample in case of a very large data set
very.large.data.set<-nrow(xydata)>approx.limit
set.seed(random.seed<-13)
if(very.large.data.set){
  ind<-sample(seq(nrow(xydata)),size=approx.limit)</pre>
  xy<-xydata[ind,]
} else xy<-xydata
n<-nrow(xy)
points.in.bag<-floor(n/2)</pre>
# if jittering is needed
# the following two lines can be activated
\#xy<-xy+cbind(rnorm(n,0,.0001*sd(xy[,1])),
               rnorm(n,0,.0001*sd(xy[,2])))
if(verbose) cat("end of initialization")
```

#### 4.4 Some local functions to find intersection points

win: After a lot of experiments the function atan2 is found to compute the gradient in fastest way.

```
34 \langle define\ function\ win\ 34 \rangle \equiv win <-function(dx,dy) \{ atan2(y=dy,x=dx) \}
```

**out.of.polygon:** The function out.of.polygon checks if the points of xy are within the polygon pg (return value FALSE) or not (return value TRUE).

```
S<-matrix(colMeans(xy),1,2)
dxy<-cbind(S[1]-pg[,1],S[2]-pg[,2])
S.in.pg<-all(limit<apply(dxy*pgn,1,sum))
if(!all(limit<apply(dxy*pgn,1,sum))){
   pg<-pg[n:1,]; pgn<--pgn[n:1,]
}
in.pg<-rep(TRUE,m)
for(j in 1:n){
   dxy<-xy-matrix(pg[j,],m,2,byrow=TRUE)
   in.pg<-in.pg & limit<(dxy**pgn[j,])
}
return(!in.pg)</pre>
```

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This version of out.of.polygon is based on the following algorithm:

- compute the orthogonal vectors of the sides of the polygon pointing to the interior
- 2. compute the vectors which starts in the corners of the polygon and ends in a point to be tested
- 3. check if all the angles between the pairs of associated vectors lie between  $-\pi/2$  and  $\pi/2$  which is equivalent to get positive signs of the inner products of the associated vectors only.

For more than 2000 test points the new version is 100 times faster than the old one.

**cut.z.pg:** cut.z.pg finds the intersection points of lines defined by p1x, p1y, p2x, p2y and lines that contains zx, zy and origin.

```
\langle define function cut.z.pg 36 \rangle \equiv
cut.z.pg<-function(zx,zy,plx,ply,p2x,p2y){</pre>
   a2 < -(p2y-p1y)/(p2x-p1x); a1 < -zy/zx
   sx<-(p1y-a2*p1x)/(a1-a2); sy<-a1*sx
   sxy<-cbind(sx,sy)</pre>
   h<-any(is.nan(sxy)) | | any(is.na(sxy)) | | any(Inf==abs(sxy))
   if(h){
   if(!exists("verbose")) verbose<-FALSE</pre>
     if(verbose) cat("special")
     # points on line defined by line segment
     h<-0==(a1-a2) \& sign(zx)==sign(p1x)
        sx<-ifelse(h,plx,sx); sy<-ifelse(h,ply,sy)</pre>
     h<-0==(a1-a2) \& sign(zx)!=sign(p1x)
        sx<-ifelse(h,p2x,sx); sy<-ifelse(h,p2y,sy)</pre>
     # line segment vertical
         & center NOT ON line segment
     h<-p1x==p2x & zx!=p1x & p1x!=0
        sx<-ifelse(h,plx,sx); sy<-ifelse(h,zy*plx/zx,sy)</pre>
         & center ON line segment
     h<-p1x==p2x & zx!=p1x & p1x==0
        sx<-ifelse(h,plx,sx); sy<-ifelse(h,0,sy)</pre>
        & center ON line segment & point on line
     h \leftarrow p1x = p2x \& zx = p1x \& p1x = 0 \& sign(zy) = sign(p1y)
        sx<-ifelse(h,plx,sx); sy<-ifelse(h,ply,sy)</pre>
     h \leftarrow p1x = p2x \& zx = p1x \& p1x = 0 \& sign(zy)! = sign(p1y)
        sx<-ifelse(h,plx,sx); sy<-ifelse(h,p2y,sy)</pre>
     # points identical to end points of line segment
     h<-zx==plx & zy==ply; sx<-ifelse(h,plx,sx); sy<-ifelse(h,ply,sy)
     h < zx = p2x \& zy = p2y; sx < -ifelse(h,p2x,sx); sy < -ifelse(h,p2y,sy)
```

```
# point of z is center
h<-zx==0 & zy==0; sx<-ifelse(h,0,sx); sy<-ifelse(h,0,sy)
sxy<-cbind(sx,sy)
} # end of special cases
#if(verbose) { print(rbind(a1,a2));print(cbind(zx,zy,plx,ply,p2x,p2y,sxy))}
if(!exists("debug.plots")) debug.plots<-"no"
if(debug.plots=="all") {
    segments(sxy[,1],sxy[,2],zx,zy,col="red")
    segments(0,0,sxy[,1],sxy[,2],type="l",col="green",lty=2)
    points(sxy,col="red")
}
return(sxy)
}</pre>
```

**find.cut.z.pg:** find.cut.z.pg finds the intersection points of the lines defined by z and center center and polygon pg.

```
37
      \langle define function find.cut.z.pg 37 \rangle \equiv
       find.cut.z.pg<-function(z,pg,center=c(0,0),debug.plots="no"){</pre>
         if(!is.matrix(z)) z<-rbind(z)</pre>
         if(1==nrow(pg)) return(matrix(center,nrow(z),2,TRUE))
         n.pg<-nrow(pg); n.z<-nrow(z)</pre>
         # center z and pg
         z<-cbind(z[,1]-center[1],z[,2]-center[2])</pre>
         pgo<-pg; pg<-cbind(pg[,1]-center[1],pg[,2]-center[2])</pre>
         if(!exists("debug.plots")) debug.plots<-"no"</pre>
         if(debug.plots=="all"){
                   plot(rbind(z,pg,0),bty="n"); points(z,pch="p")
                   lines(c(pg[,1],pg[1,1]),c(pg[,2],pg[1,2]))}
         # find angles of pg und z
         apg<-win(pg[,1],pg[,2])
         apg[is.nan(apg)]<-0; a<-order(apg); apg<-apg[a]; pg<-pg[a,]</pre>
         az < -win(z[,1],z[,2])
         # find line segments
         segm.no<-apply((outer(apg,az,"<")),2,sum)</pre>
         segm.no<-ifelse(segm.no==0,n.pg,segm.no)</pre>
         next.no<-1+(segm.no %% length(apg))</pre>
         # compute cut points
         cuts<-cut.z.pg(z[,1],z[,2],pg[segm.no,1],pg[segm.no,2],
                                       pg[next.no,1],pg[next.no,2])
         # rescale
         cuts<-cbind(cuts[,1]+center[1],cuts[,2]+center[2])</pre>
         return(cuts)
```

**cut.p.sl.p.sl:** cut.p.sl.p.sl finds the intersection point of two lines. Both lines are described by a point and its slope. Remember:

```
y = y_1 + m_1(x - x_1)
```

If both slopes are identical an inf-value will be returned.

```
38 \langle define\ function\ cut.p.sl.p.sl38 \rangle \equiv cut.p.sl.p.sl<-function(xy1,m1,xy2,m2){ sx<-(xy2[2]-m2*xy2[1]-xy1[2]+m1*xy1[1])/(m1-m2)
```

```
sy<-xy1[2]-m1*xy1[1]+m1*sx
if(!is.nan(sy)) return( c(sx,sy) )
if(abs(m1)==Inf) return( c(xy1[1],xy2[2]+m2*(xy1[1]-xy2[1])) )
if(abs(m2)==Inf) return( c(xy2[1],xy1[2]+m1*(xy2[1]-xy1[1])) )
}</pre>
```

## 4.5 A function to compute the h-depths of data points

**hdepth.of.points:** hdepth.of.points computes the h-depths of test points tp. local variable ident stores the number of identical points. Algorithmical aspects of finding the h-depth are later discussed in: \( \langle \find \text{kkk-hull: pg 57} \rangle \)

```
define function hdepth.of.points 39 >=
  hdepth.of.points<-function(tp,n) {
    n.tp<-nrow(tp)
    tphdepth<-rep(0,n.tp); dpi<-2*pi-0.000001
    minusplus<-c(rep(-1,n),rep(1,n))
    for(j in 1:n.tp) {
       dx<-tp[j,1]-xy[,1]; dy<-tp[j,2]-xy[,2]
       a<-win(dx,dy)+pi; h<-a<10;a<-a[h]; ident<-sum(!h)
       init<-sum(a < pi); a.shift<-(a+pi) %% dpi
       minusplus<-c(rep(-1,length(a)),rep(1,length(a))) ## 070824
       h<-cumsum(minusplus[order(c(a,a.shift))])
       tphdepth[j]<-init+min(h)+1 # +1 because of the point itself!!
       # tphdepth[j]<-init+min(h)+ident; cat("SUMME",ident)
    }
    tphdepth
}</pre>
```

## 4.6 A function to expand the hull

39

**expand.hull:** expand.hull expands polygon pk without changing the depth of its points. k is the depth and resolution is the number of points to be checked during expandation.

```
40 \langle define\ function\ expand.hull\ 40 \rangle \equiv \\ expand.hull <-function\ (pg,k)\ \{ \\ \langle find\ end\ points\ of\ line\ segments:\ center \to pg \to pg0\ 41 \rangle \\ \langle search\ for\ points\ with\ critical\ hdepth\ 42 \rangle \\ \langle find\ additional\ points\ between\ the\ line\ segments\ 43 \rangle \\ \langle compute\ hull\ pg.new\ 44 \rangle \\ \}
```

At first we search the intersection points of the hull of the data set with the lines beginning in the center and running through the points of pg. Then test points on the segments defined by these intersection points and the points of pg will be generated by using a vector lam.

```
41 \langle find\ end\ points\ of\ line\ segments:\ center \to pg \to pg0\ 41 \rangle \equiv resolution <-floor(20*precision) pg0 <-xy[hdepth==1,] pg0 <-pg0[chull(pg0[,1],pg0[,2]),] end.points <-find.cut.z.pg(pg,pg0,center=center,debug.plots=debug.plots) lam <-((0:resolution)^1)/resolution^1
```

The test is performed in two stages. In the interval from start point to end point resolution test points are tested concerning their h-depth. The critical interval is divided again to find a better limit.

42  $\langle search \ for \ points \ with \ critical \ hdepth \ 42 \rangle \equiv$ pg.new<-pg for(i in 1:nrow(pg)){ tp<-cbind(pg[i,1]+lam\*(end.points[i,1]-pg[i,1]),</pre> pg[i,2]+lam\*(end.points[i,2]-pg[i,2]))hd.tp<-hdepth.of.points(tp,nrow(xy))</pre> ind<-max(sum(hd.tp>=k),1) if(ind<length(hd.tp)){ # hd.tp[ind]>k && tp<-cbind(tp[ind,1]+lam\*(tp[ind+1,1]-tp[ind,1]),</pre> tp[ind,2]+lam\*(tp[ind+1,2]-tp[ind,2])) hd.tp<-hdepth.of.points(tp,nrow(xy))</pre> ind < -max(sum(hd.tp >= k), 1)pg.new[i,]<-tp[ind,] } pg.new<-pg.new[chull(pg.new[,1],pg.new[,2]),] # cat("depth pg.new", hdepth.of.points(pg.new,n))

Between the spurts we interpolated additional directions and find additional limits by the same procedure.

```
43
      (find additional points between the line segments 43) \equiv
       pg.add<-0.5*(pg.new+rbind(pg.new[-1,],pg.new[1,]))
       # end.points<-find.cut.z.pg(pg,pg0,center=center)</pre>
       end.points<-find.cut.z.pg(pg.add,pg0,center=center) ## 070824
       for(i in 1:nrow(pq.add)){
         tp<-cbind(pg.add[i,1]+lam*(end.points[i,1]-pg.add[i,1]),</pre>
                    pg.add[i,2]+lam*(end.points[i,2]-pg.add[i,2]))
         hd.tp<-hdepth.of.points(tp,nrow(xy))
         ind < -max(sum(hd.tp >= k), 1)
         if(ind<length(hd.tp)){ # hd.tp[ind]>k &&
           tp<-cbind(tp[ind,1]+lam*(tp[ind+1,1]-tp[ind,1]),</pre>
                      tp[ind,2]+lam*(tp[ind+1,2]-tp[ind,2]))
           hd.tp<-hdepth.of.points(tp,nrow(xy))</pre>
           ind<-max(sum(hd.tp>=k),1)
         }
         pg.add[i,]<-tp[ind,]
       # cat("depth pg.add", hdepth.of.points(pg.add,n))
```

Finally the hull of the limits is computed and our numerical solution of  $hull(d_k)$ . pg.new is the output of expand.hull.

```
⟨compute hull pg.new 44⟩ ≡
pg.new<-rbind(pg.new,pg.add)
pg.new<-pg.new[chull(pg.new[,1],pg.new[,2]),]</pre>
```

44

# 4.7 A function to find the position of points respectively to a polygon

**pos.to.pg:** pos.to.pg finds the position of points z relative to a polygon pg If a point is below the polygon "lower" is returned otherwise "upper".

#### 4.8 Check if data set is one dimensional

Now the local functions are ready for usage. To detect a data set being one dimensional we apply prcomp(). In the one dimensional case we construct a boxplot by hand.

#### 4.9 Standardize data and compute h-depths of points

For numerical reasons we standardize the data set: xyxy. Some computations takes place on the standardized copy xyxy of xy.

```
47 ⟨standardize data and compute: xyxy, xym, xysd 47⟩ ≡ xym<-apply(xy,2,mean); xysd<-apply(xy,2,sd) xyxy<-cbind((xy[,1]-xym[1])/xysd[1],(xy[,2]-xym[2])/xysd[2])
```

48

For each data point we compute the directions to all the points and determine the angles of the directions. This information helps us to find the h-depths of the points. For friends of complexity: the angles between all pair of points are computed in  $O(n^2 \log n)$  time because of sorting the columns of a  $(n \times n)$ -matrix. The angle between identical points is coded by entry 1000.

```
p<-xy[j,]; dy<-dx*tan(alpha[,j])
  segments(p[1]-dx,p[2]-dy,p[1]+dx,p[2]+dy,col=j)
  text(p[1]-xdelta*.02,p[2],j,col=j)
}

if(verbose) print("end of computation of angles")</pre>
```

We compute the h-depths in  $O(n^2\log(n))$ . The NaN angles are extracted because they indicate points with identical coordinates. For each point we find the h-depth by the following algorithm: At first we count the number of angles of the actual point within interval  $[0,\pi)$ . This is equivalent to the number of points above the actual point. Then we rotate the y=0-line counterclockwise and increment the initial counter if an additional point emerges and we decrement the counter if a point / angle leaves the halve plain.

The median is defined as the gravity center of all points with maximal h-depth. As usually some problems were induced by equality of angles. One reaction was to add some shift to compare with slightly modified  $\pi$ -values.

```
\langle compute\ hdepths\ 49 \rangle \equiv
hdepth<-rep(0,n); dpi<-2*pi-0.000001; mypi<-pi-0.000001
minusplus<-c(rep(-1,m),rep(1,m))</pre>
 for(j in 1:n) {
   a < -alpha[,j] + pi; h < -a < 10; a < -a[h]; init < -sum(a < mypi) # hallo
   a.shift<-(a+pi) %% dpi
   minusplus<-c(rep(-1,length(a)),rep(1,length(a))) ## 070824
   h<-cumsum(minusplus[order(c(a,a.shift))])
   hdepth[j]<-init+min(h)+1 # or do we have to count identical points?
 \# hdepth[j] < -init + min(h) + sum(xy[j,1] = xy[,1] & xy[j,2] = xy[,2])
if(verbose){print("end of computation of hdepth:"); print(hdepth)}
 ## quick look inside, just for a check
 if(debug.plots=="all"){
   plot(xy,bty="n")
   xdelta<-abs(diff(range(xy[,1]))); dx<-xdelta*.1</pre>
   for(j in 1:n) {
     a<-alpha[,j]+pi; a<-a[a<10]; init<-sum(a < pi)</pre>
     a.shift<-(a+pi) %% dpi
     minusplus<-c(rep(-1,length(a)),rep(1,length(a))) ## 070824
     h<-cumsum(minusplus[ao<-(order(c(a,a.shift)))])
     no<-which((init+min(h)) == (init+h))[1]</pre>
     p<-xy[j,]; dy<-dx*tan(alpha[,j])</pre>
     segments(p[1]-dx,p[2]-dy,p[1]+dx,p[2]+dy,col=j,lty=3)
     dy<-dx*tan(c(sort(a),sort(a))[no])</pre>
     segments(p[1]-5*dx,p[2]-5*dy,p[1]+5*dx,p[2]+5*dy,col="black")
     text(p[1]-xdelta*.02,p[2],hdepth[j],col=1,cex=2.5)
 }
```

We determine the h-depth k so that the following condition holds: (the number of points of h-depth greater or equal k is lower or equal to the number of data points staying in the bag) and (the number of points of h-depth greater equal k-1 is greater n/2):

```
\#D_k \leq \text{points in the bag:} n/2 < \#D_{k-1}.
50 \langle \mathit{find} \, k \, 50 \rangle \equiv \text{hd.table} \langle \text{cort}(\text{hdepth}) \rangle
d.k < -\text{cbind}(dk = \text{rev}(\text{cumsum}(\text{rev}(\text{hd.table}))),
k = \text{as.numeric}(\text{names}(\text{hd.table})))
```

```
k.1<-sum(points.in.bag<d.k[,1])

# if(nrow(d.k)>1){ # version 09/2005, error in data set 1 of Meuleman
if(nrow(d.k)>k.1){ # instead of >2 now >k.1 # 070827
    k<-d.k[k.1+1,2]
} else {
    k<-d.k[k.1,2]
}
if(verbose){cat("numbers of members of dk:"); print(hd.table)}
if(verbose){cat("end of computation of k, k=",k)}</pre>
```

#### 4.10 Find the center of the data set

The two dimensional median is the center of gravity of the polygon of the points (not data points) with maximal h-depths.

We check some inner test points to find the maximal h-depth. Then we look for the boundery of the area of points with this h-depth.

This procedure has been tested with the Ben Greiner data using: \(\lambda test: data set of \) Ben Greiner 14\(\rangle\)

```
51
       \langle compute\ hdepths\ of\ test\ points\ to\ find\ center\ 51 \rangle \equiv
        center<-apply(xy[which(hdepth==max(hdepth)),,drop=FALSE],2,mean)</pre>
        hull.center<-NULL
        if(5<nrow(xy)&&length(hd.table)>2){
           n.p < -floor(c(32,16,8)[1+(n>50)+(n>200)]*precision)
           h<-cands<-xy[rev(order(hdepth))[1:6],]
           cands<-cands[chull(cands[,1],cands[,2]),]; n.c<-nrow(cands)</pre>
           if(is.null(n.c))cands<-h</pre>
           (check some points to find the maximal h-depth 52)
           (find the polygon of points of maximal h-depth 53)
           if(verbose){cat("hull.center",hull.center); print(table(tphdepth)) }
        if(verbose) cat("center depth:",hdepth.of.points(rbind(center),n)-1)
        if(verbose){print("end of computation of center"); print(center)}
52
       \langle check \ some \ points \ to \ find \ the \ maximal \ h-depth \ 52 
angle \equiv
        xyextr<-rbind(apply(cands,2,min),apply(cands,2,max))</pre>
        xydel<-2*(xyextr[2,]-xyextr[1,])/n.p</pre>
        h1<-seq(xyextr[1,1],xyextr[2,1],length=n.p)</pre>
        h2<-seq(xyextr[1,2],xyextr[2,2],length=n.p)</pre>
        tp<-cbind(matrix(h1,n.p,n.p)[1:n.p^2],</pre>
                    matrix(h2,n.p,n.p,TRUE)[1:n.p^2])
        tphdepth < -max(hdepth.of.points(tp,n))-1
       For finding the area of maximal h-depth we use an algorithm that has been im-
       plemented for finding the bag, see below. (find kkk-hull: pg 57)
53
       \langle find\ the\ polygon\ of\ points\ of\ maximal\ h-depth\ 53 \rangle \equiv
        \langle initialize \text{ angles, ang } 60 \rangle
        kkk<-tphdepth
        if(verbose){cat("max-hdepth found:"); print(kkk)}
        (find kkk-hull: pg 57)
```

hull.center<-cbind(pg[,1]\*xysd[1]+xym[1],pg[,2]\*xysd[2]+xym[2])

center<-find.polygon.center(hull.center)</pre>

A function to compute the center of gravity of a polygon. The function find.polygon.center determines the center of gravity of a polygon.

```
\langle define \ find.polygon.center \ 54 \rangle \equiv
 find.polygon.center<-function(xy){</pre>
   ## if(missing(xy))\{n<-50:x<-rnorm(n):y<-rnorm(n):xy<-cbind(x,y)\}
   ## xy<-xy[chull(xy),]
   if(length(xy)==2) return(xy[1:2])
   ## partition polygon into triangles
   n<-length(xy[,1]); mxy<-colMeans(xy)</pre>
   xy2<-rbind(xy[-1,],xy[1,]); xy3<-cbind(rep(mxy[1],n),mxy[2])
   ## determine areas and centers of gravity of triangles
   S < -(xy + xy2 + xy3)/3
   F2 < -abs((xy[,1]-xy3[,1])*(xy2[,2]-xy3[,2])-
         (xy[,2]-xy3[,2])*(xy2[,1]-xy3[,1]))
   ## compute center of gravity of polygon
   lambda<-F2/sum(F2)
   SP<-colSums(cbind(S[,1]*lambda,S[,2]*lambda))</pre>
   return(SP)
```

We compute the convex hull of  $D_k$ : polygon pdk and the hull of  $D_{k-1}$ : polygon pdk . 1.

pdk represents inner polygon and pdk. 1 outer one.

54

55

Then polygon pdk and pdk.1 are enlarged without changing its h-depth: exp.dk, exp.dk.1-

```
\langle method\ one: find\ hulls\ of\ D_k\ and\ D_{k-1}\ 55 \rangle \equiv
 # inner hull of bag
 xyi<-xy[hdepth>=k,,drop=FALSE]
 pdk<-xyi[chull(xyi[,1],xyi[,2]),,drop=FALSE]</pre>
 # outer hull of bag
 xyo<-xy[hdepth>=(k-1),,drop=FALSE]
 pdk.1<-xyo[chull(xyo[,1],xyo[,2]),,drop=FALSE]</pre>
 if(verbose)cat("hull computed:")
 #; if(verbose){print(pdk); print(pdk.1) }
 if(debug.plots=="all"){
   plot(xy,bty="n")
   h<-rbind(pdk,pdk[1,]); lines(h,col="red",lty=2)
   h<-rbind(pdk.1,pdk.1[1,]);lines(h,col="blue",lty=3)
   points(center[1],center[2],pch=8,col="red")
 exp.dk<-expand.hull(pdk,k)</pre>
 exp.dk.1 < -expand.hull(exp.dk,k-1) # pdk.1,k-1,20)
```

The new approach to find the hull works as follows:

For a given k we move lines with different slopes from outside of the cloud to the center and stop if k points are crossed. To keep things simple we rotate the data points so that we have only move a vertical line.

- 1. define directions / angles for hdepth search
- 2. standardize data set to get appropiate directions
- 3. computation of  $D_k$  polygon and restandardization
- 4. computation of  $D_{k-1}$  polygon and restandardization

```
We determine the hulls on the base of the standardized data xyxy.
```

```
\langle \textit{method two: find hulls of } D_k \textit{ and } D_{k-1} 56 \rangle \equiv \\ \langle \textit{initialize} \textit{ angles, ang } 60 \rangle \\ \# \textit{ standardization of data set xyxy is used } \\ kkk < -k \\ \langle \textit{find kkk-hull: pg } 57 \rangle \\ \exp. dk < -\text{cbind(pg[,1]*xysd[1]+xym[1],pg[,2]*xysd[2]+xym[2])} \\ \text{if(kkk>1) } kkk < -kkk-1 \\ \langle \textit{find kkk-hull: pg } 57 \rangle \\ \exp. dk.1 < -\text{cbind(pg[,1]*xysd[1]+xym[1],pg[,2]*xysd[2]+xym[2])} \\ \end{cases}
```

The polygon for h-depth kkk is constructed in a loop. In each step we consider one direction / angle.

```
⟨find kkk-hull: pg 57⟩ ≡
  ⟨initialize loop of directions 59⟩
  for(ia in seq(angles)[-1]){
    ⟨body of loop of directions 58⟩
}
⟨combination of lower and upper polygon 61⟩
```

56

57

58

At first we search the limiting points for every direction by rotating the data set and then we determine the quantiles  $x_{k/n}$  and  $x_{(n+1-k)/n}$ . With this points we construct a upper polygon pg and a lower one pg1 that limit the hull we are looking for. To update a polygon we have to find the line segments of the polygon that are cut by the lines of slope a through the limiting points as well as the intersection points.

```
\langle body \ of \ loop \ of \ directions \ 58 \rangle \equiv
 # determine critical points pnew and pnewl of direction a
 ### cat("ia",ia)
a<-angles[ia]; angtan<-ang[ia]; xyt<-xyxy%*%c(cos(a),-sin(a)); xyto<-order(xyt)</pre>
ind.k <-xyto[kkk]; ind.kk<-xyto[n+1-kkk]; pnew<-xyxy[ind.k,]; pnewl<-xyxy[ind.kk,]</pre>
 if(debug.plots=="all") points(pnew[1],pnew[2],col="red")
 # new limiting lines are defined by pnew / pnewl and slope a
 # find segment of polygon that is cut by new limiting line and cut
 pg.no<-sum(pg[,1]<pnew[1])
    cutp<-c(pnew[1],pg[pg.no,2]+pg[pg.no,3]*(pnew[1]-pg[pg.no,1]))
    pg.nol<-sum(pgl[,1]>=pnewl[1])
    cutpl<-c(pnewl[1],pgl[pg.nol,2]+pgl[pg.nol,3]*(pnewl[1]-pgl[pg.nol,1]))</pre>
 }else{
           ### cat("normal case")
    pg.inter<-pg[,2]-angtan*pg[,1]; pnew.inter<-pnew[2]-angtan*pnew[1]
    pg.no<-sum(pg.inter<pnew.inter)</pre>
     cutp<-cut.p.sl.p.sl(pnew,ang[ia],pg[pg.no,1:2],pg[pg.no,3])</pre>
    pg.interl<-pgl[,2]-angtan*pgl[,1]; pnew.interl<-pnewl[2]-angtan*pnewl[1]
    pg.nol<-sum(pg.interl>pnew.interl)
    cutpl<-cut.p.sl.p.sl(pnewl,angtan,pgl[pg.nol,1:2],pgl[pg.nol,3])</pre>
 # update pg, pgl
pg<-rbind(pg[1:pg.no,],c(cutp,angtan),c(cutp[1]+dxy, cutp[2]+angtan*dxy,NA))
pgl<-rbind(pgl[1:pg.nol,],c(cutpl,angtan),c(cutpl[1]-dxy, cutpl[2]-angtan*dxy,NA))
 (debug: plot within for loop 62)
```

To initialize the loop we construct the first polygons (upper one: pg, lower one: pg1) by vertical lines. dxdy is a step that is larger than the range of the standardized data set.

```
59 \langle initialize\ loop\ of\ directions\ 59 \rangle \equiv ia<-1;\ a<-angles[ia];\ xyt<-xyxy%*%c(cos(a),-sin(a));\ xyto<-order(xyt) # initial for upper part
```

```
ind.k <-xyto[kkk]; cutp<-c(xyxy[ind.k,1],-10)
dxy<-diff(range(xyxy))
pg<-rbind(c(cutp[1],-dxy,Inf),c(cutp[1],dxy,NA))
# initial for lower part
ind.kk<-xyto[n+1-kkk]; cutpl<-c(xyxy[ind.kk,1],10)
pgl<-rbind(c(cutpl[1],dxy,Inf),c(cutpl[1],-dxy,NA))
(debug: plot ini 63)</pre>
```

It is necessary to initialize the angles of the directions. If the data set is very large we will check fewer directions than in case of a small data set. If the data set is small the choice of the angles may be improved by using the observed angles defined by the slopes of lines running through the pairs of the points.

```
60 \langle initialize \, angles, \, ang \, 60 \rangle \equiv
# define direction for hdepth search
num<-floor(c(417,351,171,85,67,43)[sum(n>c(1,50,100,150,200,250))]*precision)
num.h<-floor(num/2); angles<-seq(0,pi,length=num.h)
ang<-tan(pi/2-angles)
```

The combination of the polygons is a little bit complicated because sometimes at the right and at left margin an additional intersection point has to be computed and integrated. 1 in front of a variable name indicates the left margin whereas the right one is coded by r. Letter 1 (u) at the end of a name is short for lower and upper.

```
upper.
61
      \langle combination \ of \ lower \ and \ upper \ polygon \ 61 \rangle \equiv
       ## plot(xyxy[,1:2],xlim=c(-.5,+.5),ylim=c(-.5,.50))
       ## lines(pg,type="b",col="red")
       ## lines(pgl,type="b",col="blue")
       # remove first and last points and multiple points
       limit<-le-10
       pg<-pg[c(TRUE,(abs(diff(pg[,1]))>limit)|(abs(diff(pg[,2]))>limit)),]
       pgl<-pgl[c(TRUE,(abs(diff(pgl[,1]))>limit)|(abs(diff(pgl[,2]))>limit)),]
       pg<-pg[-nrow(pg),][-1,,drop=FALSE]
       pgl<-pgl[-nrow(pgl),][-1,,drop=FALSE]</pre>
       # determine position according to the other polygon
          cat("relative position: lower polygon")
       indl<-pos.to.pg(pgl,pg)</pre>
          print(cbind(signif(pgl,3),indl))
          cat("relative position: upper polygon")
       indu<-pos.to.pg(pg,pgl,TRUE)</pre>
         print(cbind(signif(pg,3),indu))
       sr<-sl<-NULL
       # right region
       if(indu[(npg<-nrow(pg))]=="lower" & indl[1]=="higher"){</pre>
         # cat("in if of right region: the upper polynom is somewhere lower")
         \# checking from the right: last point of lower polygon that is NOT ok
         rnuml<-which(indl=="lower")[1]-1</pre>
         # checking from the left: last point of upper polygon that is ok
         rnumu<-npg+1-which(rev(indu=="higher"))[1]</pre>
         # special case all points of lower polygon are upper
         if(is.na(rnuml)) rnuml<-sum(pg[rnumu,1]<pgl[,1])</pre>
         # special case all points of upper polygon are lower
         if(is.na(rnumu)) rnumu<-sum(pg[,1]<pgl[rnuml,1])</pre>
         xyl<-pgl[rnuml,]; xyu<-pg[rnumu,]</pre>
         ## cat("right"); print(rnuml); print(xyl)
         ## cat("right"); print(rnumu); print(xyu)
         sr<-cut.p.sl.p.sl(xyl[1:2],xyl[3],xyu[1:2],xyu[3])</pre>
       # left region
```

```
if(indl[(npgl<-nrow(pgl)))]=="higher"&indu[1]=="lower"){</pre>
         # cat("in if of left region: the upper polynom is somewhere lower")
         # checking from the right: last point of lower polygon that is ok
         lnuml<-npgl+1-which(rev(indl=="lower"))[1]</pre>
         # checking from the left: last point of upper polygon that is NOT ok
         lnumu<-which(indu=="higher")[1]-1</pre>
         # special case all points of lower polygon are upper
         if(is.na(lnuml)) lnuml<-sum(pg[lnumu,1]<pgl[,1])</pre>
         # special case all points of upper polygon are lower
         if(is.na(lnumu)) lnumu<-sum(pg[,1]<pgl[lnuml,1])</pre>
         xyl<-pgl[lnuml,]; xyu<-pg[lnumu,]</pre>
         ## cat("left"); print(lnuml); print(xyl)
         ## cat("left"); print(lnumu); print(xyu)
         sl<-cut.p.sl.p.sl(xyl[1:2],xyl[3],xyu[1:2],xyu[3])
       pg<-rbind(pg [indu=="higher",1:2,drop=FALSE],sr,
                 pgl[indl=="lower", 1:2,drop=FALSE],sl)
         ## print(pg)
       if(debug.plots=="all") lines(rbind(pg,pg[1,]),col="red")
       pg<-pg[chull(pg[,1],pg[,2]),]
62
      \langle debug: plot within for loop 62 \rangle \equiv
       #### cat("angtan",angtan,"pg.no",pg.no,"pkt:",pnew)
       # if(ia==stopp) lines(pg,type="b",col="green")
       if(debug.plots=="all"){
         points(pnew[1],pnew[2],col="red")
         hx < -xyxy[ind.k,c(1,1)]; hy < -xyxy[ind.k,c(2,2)]
         segments(hx, hy, c(10, -10), hy+ang[ia]*(c(10, -10)-hx), lty=2)
         text(hx+rnorm(1,,.1),hy+rnorm(1,,.1),ia)
       # print(pg)
       # if(ia==stopp) lines(pgl,type="b",col="green")
         points(cutpl[1],cutpl[2],col="red")
         hx < -xyxy[ind.kk,c(1,1)]; hy < -xyxy[ind.kk,c(2,2)]
         segments(hx, hy, c(10, -10), hy+ang[ia]*(c(10, -10)-hx), lty=2)
         text(hx+rnorm(1,,.1),hy+rnorm(1,,.1),ia)
       # print(pgl)
63
      \langle debug: plot ini 63 \rangle \equiv
       if(debug.plots=="all"){ plot(xyxy,type="p",bty="n")
       # text(xy,,1:n,col="blue")
       \# hx<-xy[ind.k,c(1,1)]; hy<-xy[ind.k,c(2,2)]
       \# segments(hx,hy,c(10,-10),hy+ang[ia]*(c(10,-10)-hx),lty=2)
       # text(hx+rnorm(1,,.1),hy+rnorm(1,,.1),ia)
```

#### 4.11 Finding of the bag

To find the bag the function expand.hull computes not an exact solution but a numerical approximation. k.1 indicates the polygon (exp.dk.1) with h-depth (k-1). k.1+1 will usually point to h-depth k (polygon: exp.dk), to the inner polygon.

In computing  $\lambda$  we follow Miller et al. (1999). They define  $\lambda$  as the relative distance from the bag to the inner contour and they compute it by  $\lambda = (50 - J)/(L - J)$ , where  $D_k$  contains J% of the original points and  $D_{k-1}$  contains L% of the original points:

```
\lambda = \frac{50 - J}{L - J} = \frac{n/2 - \#D_k}{\#D_{k-1} - \#D_k} = \frac{\text{number in bag - number in inner contour}}{\text{number in outer contour - number in inner contour}}
```

If bag and inner contour is identical then  $\lambda \leftarrow 0$ .

k.1 is the number of the rows of dk that represent points within the bag / h-depths greater n/2.

The bag is constructed by lambda \* outer polygon + (1-lambda)\* inner polygon. In former versions it happened that some lines of h get NaN values because nrow(d.k) == 2 and k.1 == 2 (e.g. example of Wouter Meuleman). This problem doesn't occur no longer but to be sure we have an additional look at h.

#### 4.12 Computation of the loop

The loop is found by expanding hull.bag by factor factor.

Now we identify the points of the bag, the outliers and the outer points. Remark: There may be some points of h-depth (k-1) that are members of the bag. If the data set is very large we will not check whether the h-depth (k-1) points are in the bag.

```
if(sum( outside)>0)
              pkt.not.bag<-rbind(pkt.not.bag, pkt.cand[ outside,])</pre>
        }else {
          extr<-out.of.polygon(xydata,hull.bag)</pre>
                      <-xydata[!extr,]</pre>
          pxy.baq
         pkt.not.bag<-xydata[extr,,drop=FALSE]</pre>
       if(length(pkt.not.bag)>0){
          extr<-out.of.polygon(pkt.not.bag,hull.loop)</pre>
          pxy.outlier<-pkt.not.bag[extr,,drop=FALSE]</pre>
          if(0==length(pxy.outlier)) pxy.outlier<-NULL</pre>
          pxy.outer<-pkt.not.bag[!extr,,drop=FALSE]</pre>
        }else{
         pxy.outer<-pxy.outlier<-NULL
        if(verbose) cat("points of bag, outer points and outlier identified")
      The points of the hull of the loop are stored in hull.loop.
68
      \langle find hull of loop 68 \rangle \equiv
       hull.loop<-rbind(pxy.outer,hull.bag)</pre>
       hull.loop<-hull.loop[chull(hull.loop[,1],hull.loop[,2]),]</pre>
       if(verbose) cat("end of computation of loop")
```

### **4.13** The definition of plot.bagplot

69

Finally we have to draw the bagplot. This job is managed by a new plot method.

```
\langle define \ plot.bagplot \ 69 \rangle \equiv
plot.bagplot<-function(x,
    show.outlier=TRUE,# if TRUE outlier are shown
    show.whiskers=TRUE, # if TRUE whiskers are shown
    show.looppoints=TRUE, # if TRUE points in loop are shown
    show.bagpoints=TRUE, \# if TRUE points in bag are shown
    show.loophull=TRUE, # if TRUE loop is shown
    show.baghull=TRUE, # if TRUE bag is shown
    add=FALSE, # if TRUE graphical elements are added to actual plot
    pch=16,cex=.4, # to define further parameters of plot
    verbose=FALSE, # tools for debugging
    col.loophull="#aaccff", # Alternatives: #ccffaa, #ffaacc
    col.looppoints="#3355ff", # Alternatives: #55ff33, #ff3355
    col.baghull="#7799ff", # Alternatives: #99ff77, #ff7799
    col.bagpoints="#000088", # Alternatives: #008800, #880000
    transparency=FALSE,...
 ) {
  (version of bagplot 1)
  # transparency flag and color flags have been proposed by wouter
     if (transparency==TRUE) {
       col.loophull = paste(col.loophull, "99", sep="")
       col.baghull = paste(col.baghull, "99", sep="")
  ⟨define function win 34⟩
  (define function cut.z.pg 36)
  (define function find.cut.z.pg 37)
 bagplotobj<-x
  for(i in seq(along=bagplotobj))
     eval(parse(text=paste(names(bagplotobj)[i], "<-bagplotobj[[",i,"]]")))</pre>
```

```
 \begin{array}{l} \text{ if (is.one.dim) \{} \\ & \langle \textit{construct plot for one dimensional case and return 71} \rangle \\ \\ \\ \langle \textit{construct bagplot as usual 70} \rangle \\ \\ \end{array}
```

70

The following elements allows us to draw the bagplot: xydata (data set), xy (sample of data set), hdepth (location depth of data points in xy), hull.loop (points of polygon that define the loop), hull.bag (points of polygon that define the bag), hull.center (region of points with maximal ldepth), pxy.outlier (outlier), pxy.outer (outer points), pxy.bag (points in bag), center (Tukey median), is.one.dim is TRUE if data set is one dimensional, prdata result of PCA  $\langle construct\ bagplot\ as\ usual\ 70 \rangle \equiv$ 

```
if(!add) plot(xydata,type="n",pch=pch,cex=cex,bty="n",...)
if(verbose) text(xy[,1],xy[,2],paste(as.character(hdepth)),cex=2)
# loop: ------
if(show.loophull){ # fill loop
    h<-rbind(hull.loop,hull.loop[1,]); lines(h[,1],h[,2],lty=1)
   polygon(hull.loop[,1],hull.loop[,2],col=col.loophull)
if(show.looppoints && length(pxy.outer)>0){ # points in loop
   points(pxy.outer[,1],pxy.outer[,2],col=col.looppoints,pch=pch,cex=cex)
# bag: -----
if(show.baghull){ # fill bag
   h<-rbind(hull.bag,hull.bag[1,]); lines(h[,1],h[,2],lty=1)</pre>
   polygon(hull.bag[,1],hull.bag[,2],col=col.baghull)
if(show.bagpoints && length(pxy.bag)>0){ # points in bag
   points(pxy.bag[,1],pxy.bag[,2],col=col.bagpoints,pch=pch,cex=cex)
# whiskers
if(show.whiskers && length(pxy.outer)>0){
   debug.plots<-"not"
    if((n<-length(xy[,1]))<15){}
     segments(xy[,1],xy[,2],rep(center[1],n),rep(center[2],n),
              col="red")
    }else{
     pkt.cut<-find.cut.z.pg(pxy.outer,hull.bag,center=center)</pre>
     segments(pxy.outer[,1],pxy.outer[,2],pkt.cut[,1],pkt.cut[,2],
              col="red")
    }
if(show.outlier && length(pxy.outlier)>0){ # points in loop
     points(pxy.outlier[,1],pxy.outlier[,2],col="red",pch=pch,cex=cex)
# center:
if(exists("hull.center")&&length(hull.center)>2){
   h<-rbind(hull.center,hull.center[1,]); lines(h[,1],h[,2],lty=1)</pre>
   polygon(hull.center[,1],hull.center[,2],col="orange")
 points(center[1],center[2],pch=8,col="red")
if(verbose){
  h<-rbind(exp.dk,exp.dk[1,]); lines(h,col="blue",lty=2)
  h<-rbind(exp.dk.1,exp.dk.1[1,]); lines(h,col="black",lty=2)
   if(exists("tphdepth"))
      text(tp[,1],tp[,2],as.character(tphdepth),col="green")
```

```
text(xy[,1],xy[,2],paste(as.character(hdepth)),cex=2)
           points(center[1],center[2],pch=8,col="red")
        "bagplot plottet"
71
       \langle construct\ plot\ for\ one\ dimensional\ case\ and\ return\ 71 \rangle \equiv
          if(verbose) cat("data set one dimensional")
          prdata<-prdata[[2]];</pre>
          trdata<-xydata%*%prdata; ytr<-mean(trdata[,2])</pre>
          boxplotres<-boxplot(trdata[,1],plot=FALSE)</pre>
          dy<-0.1*diff(range(stats<-boxplotres$stats))</pre>
          dy<-0.05*mean(c(diff(range(xydata[,1])),</pre>
                             diff(range(xydata[,2]))))
          segtr<-rbind(cbind(stats[2:4],ytr-dy,stats[2:4],ytr+dy),</pre>
                          cbind(stats[c(2,2)],ytr+c(dy,-dy),
                                 stats[c(4,4)],ytr+c(dy,-dy)),
                          cbind(stats[c(2,4)],ytr,stats[c(1,5)],ytr))
          segm<-cbind(segtr[,1:2]%*%t(prdata),</pre>
                         segtr[,3:4]%*%t(prdata))
          if(!add) plot(xydata,type="n",bty="n",pch=16,cex=.2,...)
          extr<-c(min(segm[6,3],segm[7,3]),max(segm[6,3],segm[7,3]))
          extr < -extr + c(-1,1) * 0.000001 * diff(extr)
          xydata<-xydata[xydata[,1]<extr[1] |</pre>
                            xydata[,1]>extr[2],,drop=FALSE]
          if(0<nrow(xydata))points(xydata[,1],xydata[,2],pch=pch,cex=cex)</pre>
          segments(segm[,1],segm[,2],segm[,3],segm[,4],)
          return("one dimensional boxplot plottet")
       In case of problems some additional plottings may be helpful.
72
       \langle additional\ graphical\ comments\ if\ necessary\ 72 \rangle \equiv
        # points(exp.dk[,1],exp.dk[,2],type="b",col="red")
        # points(exp.dk[,1],exp.dk[,2],type="b",col="green")
        # points(exp.dk.1[,1],exp.dk.1[,2],type="b",col="blue")
              Some technical leftovers
       4.14.1 Definition of bagplot on start
73
       \langle start 73 \rangle \equiv
        (define bagplot 29)
       4.14.2 Extracting the R code file bagplot.R
74
       \langle some functions for generating bagplots 74 \rangle \equiv
        (define bagplot 29)
75
       \langle call \, tangleR \, to \, extract \, tangle \, function \, bagplot() \, 75 \rangle \equiv
        tangleR("bagplot.rev",expand.roots="some functions for generating bagplots",
                 expand.root.start=FALSE)
```

## 5 Appendix

## 5.1 Some further examples – usefull for testing

## 5.2 Some old code chunks for comparison

In the old version of out.of.polygon the angles between the lines that are defined by a point of [[xy] and the vertices of pg are computed. If maximal angle  $> 2\pi$  than the point is not an inner point of the polygon:

```
very Solution
(old version: define function out.of.polygon 83) =
    out.of.polygon<-function(xy,pg){
        if(nrow(pg)==1) return(pg)
        pgcenter<-apply(pg,2,mean) # not necessary
        pg<-cbind(pg,1]-pgcenter[1],xy[,2]-pgcenter[2])# not necessary
        xy<-cbind(xy[,1]-pgcenter[1],xy[,2]-pgcenter[2])# not necessary
        extr<-rep(FALSE,nrow(xy))
        for(i in seq(nrow(xy)))
        alpha<-sort(win(xy[i,1]-pg[,1],xy[i,2]-pg[,2]))%%(2*pi))
        extr[i]<-pi-max(diff(alpha)) |
             pi<(alpha[1]+2*pi-alpha[length(alpha)])
        }
        extr
}</pre>
```

This was an alternative approach to find the center but the brute force method seems to be better.

40

```
lam<-matrix(rbeta(n.c*n.p.beta,.5,.5),n.p.beta,n.c)
lam<-lam/matrix(apply(lam,1,sum),n.p.beta,n.c,FALSE)
tp<-obind( lam**&cands[,1],lam**&cands[,2])
tphdepth-hdepth.of.points(tp,n)
hull.center<-tp[which(tphdepth==max(tphdepth)),,drop=FALSE]</pre>
                          center <- apply(hull.center,2,mean)
                          hull.center<-hull.center[chull(hull.center[,1],hull.center[,2]),]
                       dversion: check points on a grid to find center 85) =
    xyextr<-rbind(apply(cands,2,min),apply(cands,2,max))
    xydele-2*(xyextr[2,]-xyextr[1,]]/n.p
    hl<-seq(xyextr[1,2],xyextr[2,],length=n.p)
    h2<-seq(xyextr[1,2],xyextr[2,2],length=n.p)
    tp<-cbind(matrix(hl,n,p,n,p)[1:n,p^2])
    tphdepth<-hdepth.of,points(tp,n)
    hull.center<-tp[which(tphdepth>=(max(tphdepth))),,drop=FALSE]
    center<-apply(hull.center,2,mean)
    cands<-hull.center[chull(hull.center[,1],hull.center[,2]),,drop=FALSE]
    xyextr<-rbind(apply(cands,2,min),apply(cands,2,max))
    ## xydel<-(xyextr[2,]-xyextr[1,])/n.p
    xyextr<-rbind(xyextr[1,]-xyedt],length=n.p)
    h2<-seq(xyextr[1,2],xyextr[2,2],length=n.p)
    tp<-cbind(matrix(hl,n,p,n,p)[1:n,p^2])
         matrix(h2,n,p,n,P,TRUE)[1:n,p^2])
    tphdepth<-hdepth.of,points(tp,n)
    hull.center<-tp[which(tphdepth)=max(tphdepth)),,drop=FALSE]
    center<-apply(hull.center,2,mean)
    hull.center<-hull.center(chull(hull.center[,1],hull.center[,2]),]</pre>
                \langle old version: check points on a grid to find center 85\rangle\equiv
               \label{eq:continuity} $$ (old: experiment for finding bag 86) \equiv $$ \mbox{critical.angles.of.points} - \mbox{function(tp)} \{ $$ n.tps-nrow(tp) $$ tphdepth<-rep(0,n.tp); $$ dpi<-2*pi-0.000001 $$ $$ \mbox{critical.} $$
                    minusplus<-c(rep(-1,n),rep(1,n))
                         inusplus<-c(rep(-1,n),rep(1,n))
result<-matrix(0,n.tp,4)
for(j in 1:n.tp) {
    dx<-tp[j,1]-xy[,1]; dy<-tp[j,2]-xy[,2]
    a<-win(dx,dy)+pi; ac-a[ac10]; ac-sort(a)
    a.shift<-(a+pi) % dpi
    h<-cumsum(minusplus[order(c(a,a.shift))])
    no<-which(min(h)==h); no<-c(no[1],no[length(no)])
    no<-c(no,1+((no-2)%%n))
    print(no)</pre>
                    # print(no)
                             result[j,]<-c(a,a)[no]
                   }
}
if(debug.plots=="all"){
plot(xy,type="n")
# points(xy);
text(xy,as.character(hdepth))
h<-rbind(tp,tp[1,]); lines(h)
points(tp[1,,drop=FALSE],col="red")
dx<-3; ro<-1</pre>
                          dy<-dx*tan(result[ro,1])
                         segments(tp[ro,1]-dx,tp[ro,2]-dy,tp[ro,1]+dx,tp[ro,2]+dy,col="orange") \\ dys-dx+tan(result[ro,3]) \\ segments(tp[ro,1]-dx,tp[ro,2]-dy,tp[ro,1]+dx,tp[ro,2]+dy,col="red") \\ dys-dx+tan(result[ro,2]) \\
                            segments(tp[ro,1]-dx,tp[ro,2]-dv,tp[ro,1]+dx,tp[ro,2]+dv,col="green")
                         dv<-dx*tan(result[ro.4])
                            segments(tp[ro,1]-dx,tp[ro,2]-dy,tp[ro,1]+dx,tp[ro,2]+dy,col="blue")
                    a.pdk<-critical.angles.of.points(pdk)
                \label{eq:continuous} $$ \langle old\,version\,to\,find\,lambda\,87\rangle \equiv $$ \# old\,version\,based\,on\,polygon\,of\,data\,points\,if\,(nrow(d.k)>1)\,\{
                         lambda<-1-(points.in.bag-d.k[k.1+1,1])/(d.k[k.1,1]-d.k[k.1+1,1])
                   } else {
                          lambda<-0.5
                   }
                (old 88) ≡
                   pdk.1<-pdk.1-matrix(pcenter,nrow(pdk.1),2,bvrow=TRUE)
                   pcenter<-apply(pdk,2,mean)
pdk<-pdk-matrix(pcenter,nrow(pdk),2,byrow=TRUE)
ai<-win(pdk[,1],pdk[,2])
a<-order(ai); ai<-ai[a]; pdk<-pdk[a,,drop=FALSE]
ai<-win(pdk[,1],pdk,[,2])
ao<-win(pdk,1],pdk,[,2])</pre>
                   a<-order(ao); ao<-ao[a]; pdk.1<-pdk.1[a,,drop=FALSE] ao<-win(pdk.1[,1],pdk.1[,2]) # for display the two polygons in verbose mode we store them
                \langle old: find\ bag\ 89 
angle \equiv
                    on... junu oug 09) =
(find points of outer polygon to be shift NA)
(find points to shift on inner polygon NA)
(shift points on polygons and construct hull.bag NA)
                 Some points of the two polygon will be identical, so the subsets of points has to be moved.
                 (old: find points of outer polygon to be shift 90) = h1<-match(pdk.1[,1], pdk[,1]); h2<-match(pdk.1[,2], pdk[,2])
90
```

```
ind.pdk.1<-seq(along=h1); found<-!is.na(h1)
union.points<-pdk.1[found,2]==pdk[h1[found],2]
union.points<-ind.pdk.1[found][funion.points]
ind.o.points.to.shift<-ind.pdk.1[-union.points]</pre>
                                 outer.shift.points<-pdk.1[ind.o.points.to.shift,,drop=FALSE] if(length(ai)==1){
                                   if(length(ai)==1){
    # inner polygon and center center identical / ai==NaN
    outer.shift.points<- lambda *outer.shift.points
} else {
    for(i in seq(along-outer.shift.points[,1])){
        # get point
        xy0<-outer.shift.points[,]
        # act_outer.shift.points[,]
        # act_outer.shift.points[,]</pre>
                               xy0<-outer.shift.points[i.]
# get segment of inner polygon
indl<-sum(ai<win(xy0[1],xy0[2])); if(indl==0) indl<-length(ai)
ind2<-ind1+i; if(ind2>length(ai)) ind2<-1
xy1<-ydk[indl,]; xy2<-ydk[ind2,]
# determinate cut of inner segment and line (0,0) -> point
lam<-solve(matrix(c(xy0,xy1-xy2),2,2))**xy1
xy.cut<-lam[1]*xy0
# determinate new position of point of outer polygon
outer.shift points[i]</pre>
                                            outer.shift.points[i,]<- lambda *outer.shift.points[i,]+ (1-lambda)*xy.cut
                                          } # end of for
                                (old:find points to shift on inner polygon 91) ≡
hl<-match(pdk[,1], pdk.1[,1]); hl<-match(pdk[,2], pdk.1[,2])
ind.i.points.to.shift<-is.na(hl)&is.na(h2)
inner.shift.points<-pdk[ind.i.points.to.shift,,drop=FALSE]
for(i in seq(along=inner.shift.points[,1])){
# get point
xy0<-inner.shift.points[i,]
# get semment of outer polygon</pre>
                                  # 3-1
# get segment of outer polygon
indi<-sum(aoswin(xy0[1],xy0[2])); if(indl==0) indl<-length(ao)
ind2<-indl+1; if(ind2>length(ao)) ind2<-1
xy1<-pdk.1[ind1,]; xy2<-pdk.1[ind2,]
# determinate cut of outer segment and line (0,0) -> point
lam<-solve(matrix(c(xy0,xy1-xy2),2,2))%*%xy1
xy.cut<-lam[1]*xy0
# determinate new position of point of inner polygon
inner.shift.points[i,]<-(1-lambda)*inner.shift.points[i,]+
lambda *xy.cut</pre>
                                 if(verbose) {cat("inner polygon points have been shifted:") }
                          (old: shift points on polygons and construct hull.bag 92)
92
                               (od: snp; points on potygons and construct hull.bag 92) \( \) \( \) \( \) \( \) \( \) \( \) \( \) \( \) \( \) \( \) \( \) \( \) \( \) \( \) \( \) \( \) \( \) \( \) \( \) \( \) \( \) \( \) \( \) \( \) \( \) \( \) \( \) \( \) \( \) \( \) \( \) \( \) \( \) \( \) \( \) \( \) \( \) \( \) \( \) \( \) \( \) \( \) \( \) \( \) \( \) \( \) \( \) \( \) \( \) \( \) \( \) \( \) \( \) \( \) \( \) \( \) \( \) \( \) \( \) \( \) \( \) \( \) \( \) \( \) \( \) \( \) \( \) \( \) \( \) \( \) \( \) \( \) \( \) \( \) \( \) \( \) \( \) \( \) \( \) \( \) \( \) \( \) \( \) \( \) \( \) \( \) \( \) \( \) \( \) \( \) \( \) \( \) \( \) \( \) \( \) \( \) \( \) \( \) \( \) \( \) \( \) \( \) \( \) \( \) \( \) \( \) \( \) \( \) \( \) \( \) \( \) \( \) \( \) \( \) \( \) \( \) \( \) \( \) \( \) \( \) \( \) \( \) \( \) \( \) \( \) \( \) \( \) \( \) \( \) \( \) \( \) \( \) \( \) \( \) \( \) \( \) \( \) \( \) \( \) \( \) \( \) \( \) \( \) \( \) \( \) \( \) \( \) \( \) \( \) \( \) \( \) \( \) \( \) \( \) \( \) \( \) \( \) \( \) \( \) \( \) \( \) \( \) \( \) \( \) \( \) \( \) \( \) \( \) \( \) \( \) \( \) \( \) \( \) \( \) \( \) \( \) \( \) \( \) \( \) \( \) \( \) \( \) \( \) \( \) \( \) \( \) \( \) \( \) \( \) \( \) \( \) \( \) \( \) \( \) \( \) \( \) \( \) \( \) \( \) \( \) \( \) \( \) \( \) \( \) \( \) \( \) \( \) \( \) \( \) \( \) \( \) \( \) \( \) \( \) \( \) \( \) \( \) \( \) \( \) \( \) \( \) \( \) \( \) \( \) \( \) \( \) \( \) \( \) \( \) \( \) \( \) \( \) \( \) \( \) \( \) \( \) \( \) \( \) \( \) \( \) \( \) \( \) \( \) \( \) \( \) \( \) \( \) \( \) \( \) \( \) \( \) \( \) \( \) \( \) \( \) \( \) \( \) \( \) \( \) \( \) \( \) \( \) \( \) \( \) \( \) \( \) \( \) \( \) \( \) \( \) \( \) \( \) \( \) \( \) \( \) \( \) \( \) \( \) \( \) \( \) \( \) \( \) \( \) \( \) \( \) \( \) \( \) \( \) \( \) \( \) \( \) \( \) \( \) \( \) \( \) \( \) \( \) \( \) \( \) \( \) \( \) \( \) \( \) \( \) \( \) \( \) \( \) \( \) \( \) \( \) \( \) \( \) \( \) \( \) \( \) \( \) \( \) \( \) \( \) \( \) \( \) \( \) \( \) \( \) \( \) \( \) \( \) \( \) \( \) \( \) \( \)
93
                          (old: find value of lambda - old version 93) =
                               (val.)nu.cunic 9 lambda - ou tersion 90) =
if(nrow(d.k)>1){
  lambda<-l-(points.in.bag-d.k[k.l+l,1])/(d.k[k.l,1]-d.k[k.l+l,1])}
} else {
  lambda<-0.5</pre>
                                 vt<-find.cut.z.pg(xy,pdk,center=center)
                            vt<-find.cut.z.pg(xy,pdk,center=center)
vt.1<-find.cut.z.pg(xy,pdk,center=center)
ht-cbind(xy[,1]-center[1],xy[,2]-center[2]); 1z<-apply(h*h,1,sum)^0.5
ht-cbind(xy[,1]-center[1],xy[,2]-center[2]); 1v<-apply(h*h,1,sum)^0.5
ht-cbind(vt[,1]-center[1],vt[,2]-center[2]); 1v.1<-apply(h*h,1,sum)^0.5
lambda.i<-(1z-1v)/(lv.1-1v)
lambda.i<-(1z-1v)/(lv.1-1v)
lambda.i<-(lambda.i); is.na(lambda.i)
# lambda<-median(lambda.i)
# lambda<-median(lambda.i)
# cat("median? lambda",median(lambda.i))
if(lambda*l) lambda<-0.5
if(verbose) cat("lambda",lambda)
# segm.no]!-1
# cut.pkt[is.nan(cut.pkt)]<-z[is.nan(cut.pkt)]
# cut.pkt*Lechind(cut.pkt[,1]+center[1],cut.pkt[,2]+center[2])
# h<-is.na(cuts[,1])
# if(any(h)){cut.pkt(h,1]<-pgo[1,1];cut.pkt[h,2]<-pgo[1,2]}</pre>
                           # car data: lambda == 0.6918136
                           In this definition it follows: lambda==1 iff bag is identical with inner polygon exp.dk.
                          (dd: find value of lambda 94) =
    vt<-find.cut.2.pg(xy, exp.dk, center=center)
    vt.1<-find.cut.2.pg(xy, exp.dk, l, center=center)
    vt.1<-find.cut.2.pg(xy, exp.dk, l, center=center)
    h<-obind(xy[,1]-center[1],xy[,2]-center[2]); lz<-apply(h*h,1,sum)^0.5
    h<-obind(vt.1[,1]-center[1],vt.1[,2]-center[2]); lv.1<-apply(h*h,1,sum)^0.5
    lambda is (la la); (la lambda)</pre>
94
                                 lambda.i<-(lz-lv)/(lv.1-lv)
                                 lambda.i<-(lambda.i[!is.na(lambda.i) & ! is.nan(lambda.i)])
                                 lambda.n-[ambda.n] a [ambda.n] a [ambda.n] a [ambda.n] a [ambda.n] a [ambda.median [ambda.i] if(verbose) cat("\nmedian lambda",lambda) if(lambda<0|lambda>1) lambda<-lambda<-min(1,max(0,median(lambda.i)))
```