User manual Vesper 1.6 April 2004

Introduction

The large number of measurements made by continuous yield monitoring, mobile electrical conductivity systems, kinematic GPS and other 'on-the-go' field sensors have created large data sets (more than 1000 points) within a single field. In most geostatistical software, spatial interpolation requires two separate steps: calculating and modelling/fitting of variogram for the whole area (data points) followed by kriging estimates for unsampled points in the area. There is a need to develop new spatial prediction software in order to accommodate the large number of data and to take into account the local spatial structure. A range of prediction options that considers the nature and quality of the original data and the end use of the mapped output is also required.

VESPER (Variogram Estimation and Spatial Prediction with ERror) is a PC-Windows program developed by the Australian Centre for Precision Agriculture (ACPA) for spatial prediction that is capable of performing kriging with local variograms (Haas, 1990). Applications of the program include generating yield maps, interpolation of digital elevation models, and assessment of topsoil salinity problems. The program also allows conventional kriging with a whole area variogram, with options for manual adjustment and fitting of the whole-area variogram. The user-friendly interface permits the creation of a field boundary and generation of an interpolation grid.

Kriging with local variograms involves:

- searching for the closest neighbourhood for each prediction site,
- estimating the variogram from the neighbourhood,
- fitting a variogram model to the data
- predicting the value and its uncertainty.

The local variogram is modelled in the program by fitting a variogram model automatically through the nonlinear least-squares method (Marquardt, 1963).

Punctual and block kriging is available as interpolation options.

This program adapts itself spatially in the presence of distinct differences in local structure over the whole field.

File requirement

Data in a text file with multiple columns (containing x, y, and data), with or without a header separated by tabs, spaces, or commas.

Example:

File 1HAXYZ.TXT

Conatins 3 columns in the file, the first two columns are the Easting & Northing (x & y) coordinates. Column 3 is the data value (Vesper can take up to 50 variables)

```
x,y,z
50.16571,38.60503,6.73180134
51.81264,38.41478,5.38031385
53.48674,37.77423,4.83549547
```

Files Input/output

VESPER ©MMII ACPA			
Run Kriging Program	ave Control File	About	Exit
Files	Kriging	Var	riogram
e: [New Volume] Directory : E:\ Vesper data	Analysis Title Kriging analysis Data Data File E:\Vesper\data\1HAXYZ.TX No. columns 3 X column 1 Y colum	(T Select Data nn 2 Data column 3	·
	Missing value -9999 Output Output directory E:\Bud Control File control Kriged Output File kriged. Report File report t Parameter File parame	fi\vesper\vesper1.6 .txt txt xt eter.txt	View Output Output File Conversion

Input File

Select a file containing the data by "double-click" the "Directory" and "File" name on the right hand side panel:

💷 d: [New Volume]	-
Directory :	
D:\	
Vesper	
📇 Data	
File Name:	
THRATZ I AT	

or by clicking the <u>u</u> button to browse for the file in your computer.

D:\Vesper\Data\1	HAXYZ.TXT	
No. columns 3		Select Data
X column 1	Y column 2	Data column 3

When a data-file is selected, the "Data file browser" window will appear prompting the number of columns in the file, the columns for x, y and data to be interpolated.

Make sure the correct no. of columns, column number for x, y, and z.

🖛 Data file	
D:\Vesper\Data\1HAXYZ.TXT	
No. columns 3	
X Column 1 Data Column 3	
Y Column 2	OK
File Preview:	
x,y,z 50.16571,38.60503,6.73180134 51.81264,38.41478,5.38031385 53.48674,37.77423,4.83549547	

Output

For output, you need to specify an "output directory", where all the output files will be saved.

Output Output directory	E:\Budi\vesper\vesper1.6	
Control File Kriged Output File	control.txt kriged.txt	View Output
Report File Parameter File	report.txt parameter.txt	Output File Conversion

"control File" is a file containing parameters for running Vesper, this is automatically generated by the program.

The output files produced by Vesper are:

- A report file will contain the parameters and messages regarding the program.
- Kriged output file will be the interpolated points.
- If "Local variogram" is used, a "parameter file" will be created containing the parameter of the variogram for each interpolation point.

🖛 VESPER ©MMII ACPA	R		
Run Kriging Program	Save Control File	About	Exit
Files	Kriging		Variogram
Method C Punctual kriging C Block kriging	Block Kriging Block size x 10 y 10	Rectangle Inter Distance betwee O Interpolate O Define limit	polation en interpolation 1 data from min to max
Search Radius Calculate radius Set radius 100	Neighborhood for interpolation Min no. data (min 4) 90 Max no. data (max 300)	x 0 y 0	max 0 0
non-negative weight	hu) 🔽 lognormal kriging	Generate Grid	boundary ate Boundary
	quadratic trend	C Define Grid	File

Defining interpolation grid

Interpolation grid can be specified in one of the following options:

- When the field has a rectangle shape, specify the interpolation distance in the "Rectangle interpolation".
- When the field has an irregular shape, you can define or create a boundary, and interpolate only in the boundary area.
- When you have a file containing a pre-defined grid you can specify the name of the file.

Rectangle interpolation

When the field has a rectangle shape, just simply specify the "distance between interpolation":

Rectar	ngle Interpolat	ion
Distand	e between in	terpolation
		1
C. Lat.	1 1 1 1 1	
te inte	erpolate data l	rom min to max
 Inte Del 	erpolate data i fine limit	rom min to max
C Del	erpolate data i fine limit min	rom min to max max
C Del	fine limit min	max

Defining A Field Boundary

When the field has an irregular shape, you need to create a boundary:

Gene	erate Grid	
CD	efine field boundary	
	Generate Boundary	1
-		

Click "Generate Boundary" Button



The "Boundary Definition" window will appear showing the data points in the x, y coordinates.

Click the right mouse button once to activate the drawing tool.

Click the left mouse button on the vertices of the field's boundary in clockwise or counter-clockwise direction,

To finish, click the right mouse button again.

Save the boundary in a file, this file can be used again.

Click the button to generate a regular grid.

The "Grid Generator" window will appear and define the name of grid distance and the program will generate a square grid into an ASCII text file with x, y coordinates

🗰 Grid Generator		×	
Boundary File	D:\vesper\data\bour	ndary.txt 🔰	
Grid File		>	
Distance between	5		
		GO	
		Cancel	

Specifying a grid file

If you wish to interpolate into certain coordinates, select the "Define Grid File" button. The grid file should be an ASCII text file with x, y coordinates arranged in 2 columns

Kriging parameter

Method	Block Kriging
Punctual kriging	Block size x 10
Block kriging	y 10
Search Radius	Neighborhood for interpolation
Calculate radius	Min no. data (min 4) 90
Set radius	Max no. data (max 300) 100
non-negative weight sigma2 (data uncertainty) 0.0	lognormal kriging

Method

The Kriging Tab menu provide options for kriging: Punctual or Block kriging.

For theory on kriging, see Webster & Oliver (2002).

For block kriging, you need to specify the "block size", which should have the same unit as your spatial coordinates.

R. Webster, M.A. Oliver, 2002. Geostatistics for Environmental Statistics. John Wiley & Sons, New York.

Neighbourhood number

Define the minimum & maximum number of neighbourhood points you wish to use for kriging For kriging with local variograms, minimum 100 data points are recommended as the variogram will be calculated from the neighbourhood points.

Search Radius

Set the radius of the search neighbourhood, where the minimum no. of neighbourhood can be found If "calculate radius" is selected, the search radius will be calculated based on the density of the data

Other kriging parameters

Lognormal kriging

For data that has a lognormal distribution, lognormal kriging will transform the data into log scale and perform appropriate calculation of prediction & variance of prediction.

Non-negative weight

Negative kriging weights applied to "extreme" values can lead to kriging estimates outside the range of the observed data. This feature may cause problems such as non-physical estimates (negative probabilities, probabilities greater than one, negative porosities, or negative thicknesses or concentration). In these situations one would like an estimator that ensures no negative weights (Deutsch, 1996).

Data uncertainty

sigma2 is σ^2 that defines the variance or data uncertainty

Variogram Modelling

The "Variogram" tab provides the option for the variogram parameters

VESPER ©MMII ACPA			
Run Kriging Program	Save Control File	About	Exit
Files	Kriging		Variogram
Variogram calculation C Local variogram C Global variogram	Variogram model Exponentia Weighting No. of pairs	Gra	aphics Plot variogram Plot map of interpolation
Fit Variogram			
Compute Variogram No. of lags 30 C Define parameters	Lag tolerance 50 (%)	define m	nax distance
Nugget 0 Gradient 1	C1 1 C2 1	A1 10 A2 1	

Variogram computation

Variogram computation		
C Compute Variogram		define max distance
No. of lags 30	Lag tolerance 50	
Define parameters	(**)	,
CO	C1	A1
Alfa 1	C2 1	A2 1

Specify "No. of Lags" (number of lags) you wish to compute for the variogram, you can also define the maximum distance for the variogram computation.

e.g. if the no. of lags is 20 and maximum distance is 400 m, the variance will be calculated for every 20 m increments:

0 - 20, 21-40, ..., 381-400.

Lag tolerance is the tolerance value for particular distance to be put in a "lag"

For example 50% of lag tolerance means that a distance of 18 has a tolerance of 9 to 27 and will be put into lags of: 0-20 and 21-40.

Lag tolerance serve to smooth the variogram values, similar to a moving average.

Local/Global variogram

Global variogram refers to calculating a variogram for the whole area. And kriging uses this whole area variogram for prediction. Local variogram is intended for field with high data density, where "local" variogram was calculated for each interpolation point.



Variogram model



SPHERICAL

if (h < A1) then rho = 1- 1.5 h/A1 + 0.5 * (h/A1)³ else rho = 0 endif gamma = C0 + C1 * (1- rho)

EXPONENTIAL

rho = exp(-h/A1)gamma = C0+ C1 * (1 - rho)

GAUSSIAN

rho = $exp(-(h/A1)^2)$ gamma = C0+ C1 * (1 - rho)

LINEAR WITH SILL

if(h < A1) then rho = 1- (h/A1) else rho = 0 end if gamma = C0+ C1 * (1 - rho)

STABLE

 $rho = exp[-(h/A1)^{alfa}]$ gamma = C0+ C1 * (1 - rho) (0<alfa<2)

GENERALISED CAUCHY

rho = $(1 + (h/A1)^2)^{-alfa}$ gamma = C0+ C1 * (1 - rho) (alfa>0)

MATERN

rho = 1/[2^(SMOOTH-1) * Γ(SMOOTH)] * (h/A1)^{SMOOTH} * Bess_{SMOOTH}(h/A1) gamma= C0 + C1*(1 -rho) where Γ (...) is Gamma function, Bess_{SMOOTH}(...) is the modified Bessel function of the third kind of order smooth. (0<SMOOTH<2) Matern is a general model that is flexible and can be used to approximate functio

Matern is a general model that is flexible and can be used to approximate function behaving as exponential (smooth = 0.5), power, or Whittle (Bessel function) model (smooth = 1).

DOUBLE_SPHERICAL

if (h < A2) then $rho1 = 1-1.5*h/A1+0.5*(h/A1)^{3}$ $rho2 = 1-1.5*h/A2+0.5*(h/A2)^{3}$ if (h > A1) then rho1=0end if else rho1 = 0 rho2 = 0end if gamma = C0+C1*(1-rho1)+C2*(1-rho2)

DOUBLE_EXPONENTIAL

rho1 = exp(-h/A1) rho2 = exp(-h/A2) $gamma = C0+C1^{(1-rho1)}+C2^{(1-rho2)}$

For local variogram, most crop yield data can be fitted with spherical and exponential model. The recommended model for local variogram is the exponential model, Gaussian model is not recommended as it can produce unstable kriging equation.



Spherical, exponential, Gaussian and linear model with C0=0, C1=1, and A1=1



Generalised Cauchy and Stable model with C0=0, C1=1, and A1=1



Matern model with C0=0, C1=1, and A1=1 with various value for smooth (υ) parameter.

Calculating variogram & Fitting a model

To fit a global variogram, click "Fit Variogram" Button and the "Variogram model" window will appear:



Calculating the Variogram

The variogram (semivariance) is calculated from:

$$\hat{\gamma}(h) = \frac{1}{N(h)} \sum_{i=1}^{N(h)} \left[z(x_i) - z(x_i + h) \right]^2$$

Select the data-file or by clicking the <u>understand</u> button, or you can select the data from different columns by clicking the "Select Data" button.

Specify "No. Lags" (number of lags) you wish to compute for the variogram and you can also define the maximum distance for the variogram.

e.g. if the no. of lags is 20 and maximum distance is 400 m, the variance will be calculated for every 20 m increments:

0 - 20, 21-40, ..., 381-400.

Lag tolerance is the tolerance value for particular distance to be put in a "lag"

For example 50% of lag tolerance means that a distance of 18 has a tolerance of 9 to 27 and will be put into lags of: 0-20 and 21-40.

Lag tolerance serve to smooth the variogram values, similar to a moving average.

Click "Calculate Variogram" to calculate the variogram.

The graph will show the calculated variogram. The dots are the calculated value, and the blue line is the current estimate of the model.

The colour represents the number of pairs for variance estimate at each lag.

The colour ranges from pink (smallest no. pairs) to blue (highest no. pairs) as indicated by the legend on the bottom right hand-side.

Weight for Fitting Variogram

Variogram model is fitted to the data by using weighted nonlinear least-squares method (Jian et al., 1996), minimising:

$$R = \sum_{i=1}^{n} w_i \left[\hat{\gamma}(h_i) - \hat{\gamma}^*(h_i) \right]^2$$

User can specify the type of weighting for *w*:

Unity (no weighting)

No. of pairs, no. of pairs calculated from semivariance N(h)

1/std.dev, the standard deviation of the average of semivariance for particular lag.

No_pairs/std_dev, combination of no. of pairs & std. deviation of the semivarainace estimate.



Fitting Variogram Model

The parameters of the model can be changed using the sliding bar next to each Select the model you wish to fit.

Click the "GO" button to fit the model to the current variogram using non-linear least squares The program will iterate to find the best parameters to fit the model to the data

The graph will show the calculated & fitted variogram.

The goodness of fit can be assessed by the SSE (sum of squared error) or AIC (Akaike Information Critereon). The lowest AIC pertains to the best model (Webster and McBratney, 1989).

AIC is defined as:

 $AIC = -2 \ln(\text{maximum likelihood}) + 2 (\text{number of parameters}),$

and is estimated by:

 $AIC = n \ln (R) + 2 p$

where R is the sum of squares of residuals, and p is the number of parameters.

The "Reset" Button redraws the variogram model with specified parameters. Parameters can be locked or fixed by checking the square button next to the parameter's value The "Save" button saves the variogram values and fitted parameters.

Running Vesper

When the following parameters have been specified:

- Input/output files
- Interpolation grid
- Kriging parameters
- Variogram parameters

We can run the kriging program.

Click Run Kriging Program button.



When the program has finished, it will display map of the interpolation and also the uncertainty (standard error) of prediction.

Understanding the Output

Vesper will produced a Kriged output file in the form of ASCII text: The file consist of 5 columns, e.g:

No.	х	Y	Predicted	sd_Pred
1	50.166	114.598	5.36046	0.21458
2	52.166	114.598	5.35444	0.16915
3	54.166	114.598	5.41664	0.16490

The first column is the number or order of the grid

x, and y is the coordinates, predicted and sd_Pred is the predicted and standard deviation of the predicted value.

When Vesper fail to interpolate a point, it will give a value of -9999.

The text file can be converted into other forms of text file or ASCII grid, by using the "Output File Conversion" tool:

Output directory	D:\Vesper\Data	
Control File	control.txt	— View Output
Kriged Output File	kriged.txt	
Report File	report.txt	Output File Conversion

Converting the output to ASCII grid file

🔛 Vesper Output File Conversion		
Output directory F:\Vesper		
Vesper Output File kriged.txt		
Text File Converted file kriged_output.txt	Convert	
End of field Comma Cospace Tab Find the field Find the fie	ber values	
ASCII Grid		
For regular spaced grid output (as generated by Vesper Gridder), the output file from Vesper can be converted into a gridfile readable in Surfer or Importable in ARC View/GIS		
Kriged grid file kriged.	grd	
Std. dev of kriged grid file sd_kriged	d.grd	
ARC View/ GIS ASCII Raster Grid Surfer GRD file	Convert	

First, specify the output directory, and the name of the output file produced by Vesper.

The output file can be converted into standard ASCII file with comma, tab or space delimited.

Text File Converted file	kriged	d_output.txt	Convert
End of field C Comma C Tab	C Space	 Include head Include row r Include missi 	ler number ng values

If the output is in a regular grid, the output file can be converted into ASCII raster grid file readily imported in program Surfer or ARC GIS.

-ASCII Grid		
For regular spaced grid output (as generated by Vesper Gridder), the output file from Vesper can be converted into a gridfile readable in Surfer or Importable in ARC View/GIS		
Kriged grid file	kriged.grd	
Std. dev of kriged grid file	sd_kriged.grd	
ABC View/ GIS ASCIL Baster Grid		
C Surfer GRD file	Convert	

Importing ASCII grid in Surfer

ASCII grid format for surfer contains the following header DSAA No_Colums No_Rows XMIN XMAX YMIN YMAX ZMIN ZMAX And followed by Data matrix

The grid file converted using Vesper can be plot directly in Surfer, by choosing the option in "Map" menu.



Importing ASCII grid in ARCView/ GIS

For Arc View/GIS, the ASCII grid file needs the following header, e.g.: NCOLS 1000 NROWS 512 XLLCORNER 1 YLLCORNER 1 CELLSIZE 1 NODATA_VALUE -9999 This is followed by the data matrix.

The grid file from Vesper need to be converted to the binary format of ARC.

In ArcView GIS 3.2 the following can be used for importing (need Spatial Analyst extension) :

ArcView GIS 3.2		
<u>File E</u> dit <u>V</u> iew <u>I</u> heme <u>Anal</u> <u>C</u> lose Close All	ysis <u>S</u> urface <u>G</u> raphics <u>Window Model H</u> elp	\?
Set Working Directory Save Project Ctrl+S Save Project As		0.28 ↔ 0.84 ‡
Extensions		
Erinc Print Setup Export		
Manage Data Sources		
Import Data Source Export Data Source ArcView Projection Utility		
Toopts		
mports files to data sources that car	I DO USOU MICHAIONICIU	

Then select:

🔍 Import Data Source	×
Select import file type:	OK
ASCII Raster	Cancel

For Arc GIS 8, use ArcToolbox and select "Import to Raster" and "ASCII to grid"



Specify the "Input ASCII file" (converted from Vesper) and the name of the "output grid" (in ARC format), select "float" for "Grid type".



Advanced application

Understanding the control file:

A control file contains all the parameters needed to run Vesper, it is in a text file with the format as follows:

\$vsl tag, don't change ivers= 161111 tag, don't change title of the analysis in single quotation mark ' ' title= 'Kriging analysis' datfil= 'D:\ vesper\data\1HAXYZ.TXT' file containing the data outdir= 'D:\ vesper\data' output directory repfil= 'report.txt' name of report file outfil= 'kriged.txt' name of kriged file name of parameter file parfil='parameter.txt' numcol = 3number of columns in the input file icol x= 1 column no. containing x value in the input file $icol_y=2$ column no. containing y value in the input file $icol_z=3$ column no. containing z value in the input file jordkrg= 1 ordinary kriging (leave as is) 1 = point kriging, 0 = block kriging jpntkrg= 1 1 = local variogram kriging, 0 = global variogram jlockrg= 0 no. of estimated grid for calculating block (leave as is) nest= 10 distance between interpolation (for rectangular grid) dstinc= 10 valmis=-9999 missing value isetint= 0 1 = set interpolation rectangle xlint=0if jsetint=1, min x for interpolation xhint= 0 if jsetint=1, max x for interpolation ylint= 0 if jsetint=1, min y for interpolation vhint= 0 if jsetint=1, min y for interpolation jsetrad= 0 1 = set radius, 0 = calculate radius radius= 100 search radius (when jsetrad=1) minpts= 40 min. no. of points for interpolation maxpts= 50 max. no. of points for interpolation siasar= 0 sigma2 isomod = 1isotropic model (leave as is) modtyp=2variogram model no. isearch= 0 isotropic search (leave as is) igeos= 0 parameter for anisotropic search (leave as is) icircs= 0 parameter for anisotropic search (leave as is) phi=0parameter for anisotropic search (leave as is) psin=0parameter for anisotropic search (leave as is) pcos=0parameter for anisotropic search (leave as is) jcomvar= 1 1=compute variogram, 0= define the variogram parameter nlag= 30 no. of lags hmax= 0 max distance, set to 0 if want to be determined automatically tolag= 50 lag tolerance iwei= 1 type of weighing for parameter estimation jigraph= 1 1=show graph of variogram, otherwise 0 jimap = 11=show map of interpolation, otherwise 0 CO=0C0 value for variogram parameter C1 = 1C1 value for variogram parameter A1= 10 A1 value for variogram parameter C2= 1 C2 value for variogram parameter A2= 1 A0 value for variogram parameter Alfa= 1 Alfa value for variogram parameter

xside= 10	Block size (in x direction) for block kriging
yside= 10	Block size (in y direction) for block kriging
lognorm= 0	1=lognormal kriging, otherwise 0
itrend= 0	1=use quadratic detrending
iconvex= 0	1=non-negative weight
igrids= 0	1= specify a grid file
gridfile="	name of the gridfile (when igrids=1)
\$end	tag don't change

Note the parameter of the control file does not need to be in the above order.

Running batch mode

Vesper can be executed in batch mode, by typing dos command in the folder containing the Vesper application:

Vesper1.6 control_file_name



When multiple runs are needed, user can create different 'control' file and prepare a batch file. For example:

We have created 4 control files and need to run it, First create a text file and write: vesper1.6 controla.txt vesper1.6 controlb.txt vesper1.6 controlc.txt vesper1.6 controld.txt Then save the file as "Vesper.bat" and run vesper.bat

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