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# **GENCAB** Version 13

## using Microsoft EXCEL®



**Optimizing With Genetic Algorithms & Simplex** 

## **User's Manual**

#### FOREWORD

The software *GENCAB BASIC* version 4 includes some of the *GENCAB* version 13 features. It is not the subject of a specific user manual.

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The Programming Protection Agency (A.P.P.) references *GENCAB* at the I.D.D.N. (Inter Deposit Digital Number) index, with the following reference:

IDDN.FR.001.070019.00.R.P.2000.000.20600

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OPERATING LICENCE AGREEMENT

## 1 GENCAB Software

## **1.1 General Presentation**

*GENCAB* is a generic optimizing software implementing developments which are among the latest in operational research and artificial intelligence.

Based on a hybrid optimizing method with Genetic Algorithms and non-linear Simplex, it enables to optimize (real, integer or binary) parameters of any function, with possible constraints, without stopping at the first local optimum found.

GENCAB

Senetic algorithms

Differential Evolution

& Simplex

Selections and settings

Subscience

<

Its general principle is described in diagram below:

The user defines the function to be optimized on a spreadsheet folio from different parameters. The function may be directly entered in spreadsheet cells, may use macro-functions or be implemented using a link between sheet and existing softwares. Constraints between parameters or cells of the sheet can be also defined.

Then, the software automatically searches the optimal parameter configuration which maximizes or minimizes the function result; this result being likely to be located in any sheet cell.

*GENCAB* requires no especial knowledge in mathematics and may be used in any engineering field. It is delivered in a setting configuration of its algorithms which enables to efficiently process highly different functions.

However, the user may modify at his discretion the different setting parameters to consider more efficiently specificities of functions to be processed. The understanding of algorithms being used is therefore required, and such algorithms are described in Chapter 3.

*GENCAB* allows to adjust probabilistic models by using maximum likelihood method, using uncensored or censored data (right, left or interval). It considers acceleration factors (Arrhenius, Basquin, Cox, etc..) to process heterogeneous data from different environments and conditions of use.

## **1.2 Installing GENCAB on Hard Disk**

Please follow instructions shown in manual.

## 1.3 Starting GENCAB

In EXCEL, open GENCAB.XLA file.

Software's functionalities are then accessible using menu "Optimisation", spreadsheet functionalities remaining always available.

( · · · ·	-) =						
Accueil	Insertion Mise	en pag	e Formules	Données	Révision	Affichage	Optimisation
UHelp / Teachware	<ul> <li>Parameters</li> <li>Constraints</li> <li>Processing</li> <li>Optimisation</li> </ul>	이 Alg	sessment tial Population gorithm Option upplement	Adjustment Statistics			
A1	+ (*	fx					
A	В	С	D	E	F	G	Н
1							

Banner on Excel versions after 2007

<b>X</b>	GENCAB	V.11 -	Classeur 2							
:	Eichier	<u>E</u> dition	<u>A</u> ffichage	Insertion	Forma <u>t</u>	<u>O</u> utils	<u>D</u> onnées	Fe <u>n</u> être	Opt	imisation <u>?</u>
	💕 🔒	👌 🔒	🖪 🖪   '	ABC 🛍 🛛	K 🖬 f	L - 🛷	<b>19 -</b> (21	- 🕃		Help / Teachware
	A1	•	fx							Other menus
	A		В	C		D	E			Parameters
2										Constraints
3										Assessment
4										Algorithm Option
5										Initial Population
7										Adjustement
8										Processing
9						•	nrior to 2	007		

Menu on Excel versions prior to 2007

A help and a teachware are proposed in the menu.

## 2 Teachware

The teachware presents optimization by means of various boards and many demonstrations.



## 2.1 Principle of optimization



## 2.2 Types of problems and methods of resolution





## 2.3 Simplex and Genetic Algorithms













## 2.4 Coupling with method of evaluation or simulation



Units	MTTF ON (heure)	Nb	Kind of redondancy	Stock of spares	Cost unit (Euros)	MDT (hour)	TAT (hour)	Operational availability	Cost (Euros)	
Engine az/el	100000	2	série	1	4500	28	2400	0,9972	13500	
Coders	100000	2	série	1	1500	28	2400	0,9972	4500	Markovian
Transmitter/receiving	2007		Passive 1/2	0	15104	28	1000	0,8433	30208	Treatments
Calculator of piloting	2040		Passive 1/1	3	4158	25	800	0,9674	16633	(SUPERCAB tool
A TTC STATION					the constant			0,8111	64841	
	30	£ 16			10	6		100 C		
Computer of Archive	33000	1	série	0	4500	29	115	0,9965	4942	Configuration of 2
Computer of production	2439		Passive 2/4	1	2158	30	432	0,9866	11074	real or integers
Supervision PC	10000		Active 1/3	1	500	28	427	0,9972	2287	parameters (in
Mirror Disc	50000	2	série	0	4000	28	334	0,9989	8333	blue)
B - USER CENTER		a - 41	N		40	11 AS		0,9793	26636	Diue)
Antenna	33000	1	série		4500	<u> </u>	1000	0.9706	4500	
Transmitter/receiving	2201	1	série	3	6007	40	345	0.9814	24354	
Supervision PC	127000	1	série	3	500	40	417	0,9997	2292	
C - Emergency Center		1 100			1			0,9522	31146	
TOTAL EVETEN.							A*B+C	0.0000	433033	
TOTAL SYSTEM:							A B+C	0,9902	122622	



## 2.5 Taking into account of the constraints



## 2.6 Adjustment of probabilistic models





DACT_6d.XLS			
Acceleration			
Acceleration factors (A Assumption: Stress changes	Sec. 1	ale of the reliability curve	R
ARRHENIUS (temperature) Fa = exp(l		o(Ea/K[1/T <sub>N</sub> - 1/T <sub>A</sub> ])	$AF = T_N / T_A$
REVERSE POWER (voltage, load)		$Fa = (V_A I V_N)^P$	Nominal
BASQUIN (fatigue / mechanical load)		$Fa = (C_A/C_N)^p$	TA TN time
LOG LINEAR		$Fa = exp(b[S_A - S_N])$	TA TN Accelerated time
Eyring (temperature + other st	ress)	$Fa = exp(Ea/K[1/T_N - 1/T_A]) (S_{1A}/S_{1N})^m (S_2)$	<sub>2A</sub> /S <sub>2N</sub> ) <sup>n</sup>
NORRIS LANDZBERG (thermal	cycling)	$Fa = exp(Ea/K[1/T_N - 1/T_A]) \left(f_A/f_N\right)^m (\DeltaT_A/\DeltaT$	N <sup>n</sup>
PECK (temperature + moisture)		$Fa = \exp(Ea/K[1/T_N - 1/T_A]) \ (H_A/H_N)^m$	
Cox model			
Assumption: The failure rate	is affected	by covariates Xi based on values βi	
$\lambda(t) = \lambda_0(t) \exp(\sum \beta_i X_i)$	$\mathbf{R}(\mathbf{t}) = \mathbf{R}_{0}$	(t) $\exp(\Sigma \beta i X_i)$ if $X_i$ independent of time	
Return to previous menu			
0			

DIDACT\_6f

### **Confidence interval**

#### Contains the estimated value of the parameter with the probability $\beta$ (confidence) = 1 - $\alpha$ (risk)

The confidence interval is said: - exact if based on the distribution of a known probability law

- Approximate if based on the approximation of a law by another
  - asymptotique if based on asymptotic theorems of convergence.

 $\boldsymbol{\beta}$  is then reached when the sample size goes to infinity with no real control of the convergence speed

The Fisher information is used to calculate such intervals after adjustment by the maximum likelihood

From the log likelihood it is written:

$$I_{n}(\theta) = -\mathbb{E}\left(\frac{\partial^{2} Ln L(X, \theta)}{\partial \theta^{2}}\right) \qquad F = I_{n}(\theta) = \begin{pmatrix} -\frac{\partial^{2} Ln L(X, \theta)}{\partial \theta_{1}^{2}} & -\frac{\partial^{2} Ln L(X, \theta)}{\partial \theta_{1} \partial \theta_{2}} & -\frac{\partial^{2} Ln L(X, \theta)}{\partial \theta_{1} \partial \theta_{3}} \\ -\frac{\partial^{2} Ln L(X, \theta)}{\partial \theta_{2} \partial \theta_{1}} & -\frac{\partial^{2} Ln L(X, \theta)}{\partial \theta_{2} \partial \theta_{1}} & -\frac{\partial^{2} Ln L(X, \theta)}{\partial \theta_{3} \partial \theta_{3}} \\ -\frac{\partial^{2} Ln L(X, \theta)}{\partial \theta_{3} \partial \theta_{1}} & -\frac{\partial^{2} Ln L(X, \theta)}{\partial \theta_{3} \partial \theta_{3}} & -\frac{\partial^{2} Ln L(X, \theta)}{\partial \theta_{3} \partial \theta_{3}} \end{pmatrix}$$

. . X

The inverse of the Fisher matrix is the matrix of variance-covariance

The square root of the diagonal elements of the variance-covariance matrix is the standard deviation of each parameter Confidence intervals can then be calculated by considering the normal laws

Similarly the variance of a function (eg quantile) is expressed as follows:  $\sigma_{\hat{g}_*}^2(\theta) = \nabla g(\theta)^T I_n^{-1}(\theta) \nabla g(\theta)$ 

with  $\nabla g(\theta)$  and  $\nabla g(\theta)^T = \left(\frac{\partial g(\theta)}{\partial \theta_1}; \dots; \frac{\partial g(\theta)}{\partial \theta_m}\right)$  the gradient and transpose of g and  $I_n^{-1}(\theta)$  the inverse of the Fisher matrix

Models of aging:	1111 22	
	Weibull law	
	Bertholon model	
	3-phase model	
Acceleration models:		
	Arrhenius model	
	Basquin model	
	COX model	
Maintenance models:		
	RP process	
	NHPP process	
	GRP1 process	GRP2 process
	Jack model 1	Jack model 2
Probability laws of extreme values:	20 20	54 
	GEV law	

## **3** Application

After the entry of a function by the user on the spreadsheet and the definition of the type and range of parameters to optimize, the tool allows::

- . assess function according to one or two variables (curves 2D or 3D)
- . search the optimum.

These features described below are illustrated by the following example entered in a spreadsheet cell :

$$f(x,y,z) = \sin(x + y) * \sin(x - z) / (1 + (x^2 + y^2 + z^2)^{1/2})$$

with x, y, z real, comprised between 10 and +10.

```
"=SIN(Var1+Var2)*SIN(Var1-Var3)/(1+(Var1^2+Var2^2+Var3^2)^0,5)"
```

The expression "#NAME?" is obtained if parameters have not been initialized.

## 3.1 Parameters initializing

The command "**Parameters**" of menu "**Optimisation**" allows to display the following dialog box in which the user enters the characteristics of function parameters to optimize.

PARAMETERS 🔀
Number of parameters 4
Predefined names
To provide a table
Parameter : x Type : © Real © Integer © Binary
Min Value Max value
-10 10
Next OK Cancel

The scrolling menu at the top right allows to enter the parameters number ( $\leq 150$ ).

The list of parameters appears in a second scrolling menu. For any of them, the user specifies the type (real, integer or binary) with maximum and minimum limits of variation range. Except for the binary case, such limits should be imperatively informed.

The variable name "Va\_i" is default, but can be modified directly in the box. Equivalence is then defined between the new and old names ( $x \approx Va_1$  for example).

The button Predefined names allows to select the names of previously defined parameters on the selected sheet using the following dialog box.

Predefined names 🛛 🔀
Select the pedefined parameters to vary
x x
Z
Then press the button below

The button **To provide a table** allows to get a entry table, as indicated below.

	A	В	С	D	E	F	G	H	
1	Parameter	Name	Type (R, Ior B)	Min value	Max value				
2	Va_1	X	R	-10	10				
3	Va_2	у	R	-10	10				
4	Va_3	z	R	-10	10	-	Take into ac	count the	
5	Va_4						parame		
6							F		
7									
8									

The taking into account of the information entered in the table by the user is carried out by an action on the button located on the corresponding sheet.

The button allows to validate the characteristics of the selected parameter. The dialog box then displays the characteristics of the parameter following in the list, if they were beforehand defined, or preserves those of the precedent in order to facilitate the initialisation

of parameters having the same characteristics. A parameter can be also selected directly in the list by using the scroll box.

On completion of this initialization phase, the names of parameters "Va\_1", "Va\_2"  $\dots$  "Va\_n", and their possible equivalence, are automatically defined in spreadsheet and their value is drawn randomly in the corresponding range. Names of limits "max\_vari" and "min\_vari" are also defined in sheet.

## **3.2 Entering the constraints**

Command "**Constraints**" of menu "**Optimisation**" allows to display the following dialog box used to enter constraints between parameters or cells of the sheet.

	CON	ISTRAI	VTS		
List :	y >= 2 x+y >	2-x = R9C8			
Term 1 :				Term 2 :	
x+y		>=		\$H\$9	<b>1</b>
REF Va_1	^ ~	<= = >=	<b>^</b>	REF Va_1	<ul> <li></li> <li></li> </ul>
	Add			Delete	
		End	ł		

The constraints considered are of type:  $A \ge B$ , A = B,  $A \le B$  or A Integer, in which A and B are cells references or combinations of parameters.

Three scrolling menus facilitate the definition of the constraints. The name of parameters beforehand defined in the worksheet can be immediately entered and, in position "REF", simple a clic of the mouse allows to enter the reference of the selected cell.

Button Add and Delete make it possible to record the constraint in progress or to delete a beforehand definite constraint, selected in the corresponding list.

## 3.3 Assessment

Command "Assessment" of menu "Optimisation" initiates the display of the following dialog box helping assess the function typed on spreadsheet folio for a given configuration of parameters, or draw variation graphs according to one or two parameters.

ASSESSMENT
Cell : 👔 🔩
Parameter x x
Type : Real
Value Abscissa1 Min : -10 Max : 10
2D/3D Graph
Abscissa 1 Nb values : 41
Min V : -10 Max V : 10
Abscissa 2 Nb values :
Min V : Max V :
Continue OK Cancel

The box "Cell" allows to enter the address of the cell of the sheet which includes the result of the function to evaluate (automatic entering by the use of the mouse).

Any parameter can be selected in the same way as in the dialog box "**Type of parameter**" so as to give it an especial value (comprised between its limits). This value will be immediately considered in spreadsheet folio following validation.

Options **Abscissa 1** and **Abscissa 2** allow opting for one or two parameters to be considered as variables in a graph with two or three dimensions that will be automatically generated by the software following validation.

The user may then define a number of values equidistant from the selected parameter (11 by default) located in a subassembly of the variation range (entire range by default) to be subject to an assessment.

The function being previously taken as an example, thereby reaches the graphs thereafter at one dimension according to x or two dimensions according to x and y.



Graph of function  $f(x,y,z) = \sin(x + y) * \sin(x - z) / (1 + (x^2 + y^2 + z^2)^{1/2})$  according to x



*Graph of function*  $f(x,y,z) = sin(x + y) * sin(x - z) / (1 + (x^2 + y^2 + z^2)^{1/2} according to x and y$ 



The same function with the constraint  $y \ge 2 - x$ 

## 3.4 Processing

Command **"Processing"** of menu **"Optimisation"** generates the display of the following dialog box which helps performing the optimizing of function to be processed.

Processing	? 🔀		
Searching : C Maximum Cell : \$D\$14 (Minimum)	<u>.</u>		
Iteration Number : 100	+		
Other stopping criteria : Value reached : Processing Duration : (hou	ur)		
<ul> <li>Initialize the treatment again</li> <li>Display successive results</li> </ul>			
Display final population			
Algorithm			
- CCCC + exploration - CCCC + operation			
Adjustment of origin	ent		
OK Cance	el		

User specifies whether the search regards the minimum or the maximum and defines a number of processing loops as a criterion to stop the search.

It may also use two other criteria to stop:

- . reaching a better result than an a-priori defined value,
- . outstripping a certain processing duration (in hours).

The box "Cell" makes it possible to enter the address of the cell of the sheet which includes the result of the function to optimize (automatic entering by the use of the mouse).

The option **"Initialize the treatment again"** allows not memorizing the best result possibly obtained previously.

The option **''Display successive results''** helps displaying the best result obtained all over the processing.

The option **"Display final population"** allows to display the features of population obtained at end of processing (see general presentation of Genetic Algorithms in Chapter 3.1). This population can be changed by the user and serve as an entrance to a new processing by using the button on the sheet.

The option **"Adjustment of origin"** helps finding out the proposed processing-algorithm setting configuration when starting up the software.

This configuration may be totally modified by the user using command "Algorithm" of menu or partly modified using two 5-position cursors of this dialog box.

The first one allows working on the algorithm's exploration level and the second one on the operation level (multiplication or division by 2 or 4 of size of chromosome population or the number of simplex steps with respect to current state).

Without using the command "Algorithm" of the menu, a cursor with 8 positions of this same dialog box makes it possible to modify the factor of penalty affecting the results in the event of going beyond of possible constraints.

The button "Adjustment" makes it possible to reach directly the command "Algorithm" without passing by the menu.

Al over the processing, the software specifies in the status bar (in screen's lower section) the number of processing loop in progress, the duration of a loop, the number of function assessments performed during each loop and the duration of an assessment (higher than 1 second).

As the optimum is not necessarily reached at end of processing, the user may repeat the latter while maintaining the best result obtained so far.

The maximum of function  $f(x,y,z) = \sin(x + y) * \sin(x - z) / (1 + (x^2 + y^2 + z^2)^{1/2})$ , assumed as an example, is thereby obtained following a few processing loops :

Var1	-0,920822364
Var2	-0,460411148
Var3	0,460411163
Result	0,453288276

#### **Remark:**

The stochastically optimizing methods, such Genetic Algorithms, allow searching the global optimum of a function without guaranty to find it.

### 3.5 Adjustment of probabilistic models

The "**Adjustment**" command of the "**optimization**" menu involves the display of the next dialog box that lets you adjust probabilistic models by using maximum likelihood method.

The action on the button "?" direct access to the relevant pages of the tutorial.

ADJUSTMENT OF PI	ROBABILITY LAWS
TYPE:	ALL
	ALL  DISCRETE LIFETIME
LAW:	WEIBULL (3 parameters)
	UNIFORM WEIBULL (2 parameters) WEIBULL (3 parameters)
ACCELERATION:	COX (4 covariates)
	COX (2 covariates) COX (3 covariates) COX (4 covariates)
DATA:	MIXED
	LEFT CENSORED BY INTERVAL MIXED
?	OK Cancel

Using scrolling menus, the user chooses a probability distribution, associated with a possible acceleration law. It also indicates whether the data are censored.

ADJUSTMENT OF PROBABILITY LAWS	DIDACT_6e,xls
	A B C D E F G
LAW: WEIBULL (3 parameters)	Data
	2 Variables Covariates
ACCELERATION: COX (4 covariates)	4 Uncensored Vibration Temperature Humidity Voltage
	5 179,2791826 6,40371295 5,22567292 5,47114148 4,2200641
	6   132,0542817   1,37225828 8,9684504 0,63561055 8,56077354
	7 139,77468 5,33805629 8,43710525 7,4309377 6,05760648
	8         197,4168841         8,09989585         4,5263122         2,00298611         5,57875688
DATA (reference cell ranges):	9 116,8181384 2,28987103 5,06350116 6,64105115 8,24920163
	10         263,0522503         1,18001895         7,63933023         9,52733156         7,44203647           11         114,4149417         6,38098824         9,31278344         3,0277913         3,76224915
	11         114,4149417         6,38098824         9,31278344         3,0277913         3,76224915           12         167,318034         5,80553312         8,22097096         9,29319392         4,04751645
VARIABLES COVARIATES (S1)	13 259,6113718 4,75381278 7,55341497 3,62456306 0,53033128
	14 260.8421858 5.74310232 4.14670173 6.41068366 8.41086383
Name (optional): \$D\$4:\$G\$4	15 224,1624933 6,80047632 0,39902288 2,5384142 7,50601538
	16 265,5863312 8,21779903 3,45599234 8,953271 9,04612992
	17   139,9950471   9,8828465   5,08777068   8,67899555   4,31709275
	18         56,12214851         9,30389698         1,81022024         7,84242158         1,92271056
	19         186,750662         8,33096545         3,87746267         5,29644941         4,55208294
Uncensored: \$B\$5:\$B\$2 💽 \$D\$5:\$G\$2 💽	20         276,8848494         7,93384861         6,04787236         7,11551121         3,90573525
totottotto [ ] [ totottate [ ]	21
	22         Right censored           23         1197,615901         5,8790855         1,90940971         8,22257495         0,94114134
Right censoring: \$B\$23:\$B\$ 🚺 \$D\$23:\$G\$ 🚺	23         1197,615901         5,8790855         1,90940971         8,22257495         0,94114134           24         1671,909902         1,11544159         0,66606671         6,62016793         0,65515268
Left censoring: \$B\$27:\$B\$ 💽 \$D\$27:\$G\$ 💽	26 Left censored
	27 213,9904292 3,85433877 1,38000104 0,64655334 5,97821683
Interval (event during the censorship):	28 29,63636076 7,6734911 1,54191078 8,34130463 0,00851492
Incorvar (event daning the consorship).	29         28,29091689         0,95703071         5,91453191         7,13282496         8,25996805
Beginning censorship: dedagade	30
	31 Censorship interval (failure in the interval)
End censorship:	32 Beginnings 33 [273 2980707]
End censorship: \$B\$37:\$B\$	34 31,24720534
	34 37,247,20334 7,17447451 4,88385475 8,37561694 3,06759532
	36 Ends 3,3595418 0,16492899 9,65902911 6,41718174
OK Cancel	37 [1273,298071]
	38 1031,247205
	39

The action on the OK button causes the display of a new dialog box in which the user indicates, using the mouse, the address of data previously entered in a spreadsheet, as in this example above.

If an acceleration law other than the Cox model was selected, the address of the reference values of the covariates must also be entered in the dialog box. The data will first be converted to the reference conditions by using an acceleration factor.

The action on the OK button causes the generation of a worksheet, as below, and then launches the processing.

diust	tment	t Ma	aximum	Likelihood	1			
		-						
COX (4 cov	ariates)				I	Probability law:		parameters)
: 0,316544289 : 0,414148664						Bêta: Sigma:		
-0,02163038							-72,0439899	
: 0,299876195	]							LN Likelihood :
					Uncensore	<i>a</i> *		
Covariates					UNCENSUIE		LN K	(uncensored) :
Vibration	Temperature	Humidity	Voltage	Acceleration				. ,
				factor	Variable			) <u>Densité : f(ti</u> )
6,403712954	5,225672922	5,471141482	4,220064097	208,1831328	179,2791826	0,004636967	0,639649513	0,002966034
1,372258284	8,968450401	0,635610548	8,560773539	814,0941107	132,0542817	0,012974911	0,362268473	0,004700401
5,338056288		7,430937696	6,057606478	934,2509651	139,77468	0,015806049	0,277006763	0,004378382
8,09989585	4,526312203 E.062E01161	2,002986115	5,578756875	431,882244	197,4168841	0,010760172	0,328992601	0,003540017
2,289871029	5,063501161 7,639330235	6,641051146 9,527331557	8,249201632 7,442036467	172,7730008 260,5921336	116,8181384 263.0522503	0,002430651 0,009218441	0,838605997	0,002038358 0,002820124
6,380988244	· ·	3,027791305	3,762249153	1032,211538	263,0522503	0,009218441	0,305922065	0,002820124
5,805533117	8,220970962	9,293193917	4,047516453	520,6880153	167,318034	0,010722881	0,373768688	0,004007877
4,75381278	7,553414966	3,62456306	0,530331282	111,4595859	259,6113718	0,003877978	0,610703923	0,002368296
5,743102319	4,14670173	6,410683664	8,410863834	371,9835248	260,8421858	0,013019629	0,18979986	0,002471124
6,800476323	· ·	2.5384142	7,506015377	91,2748435	224,1624933	0.002647859	0,740281133	0.00196016
8,217799033	3,455992337	8,953270998	9,046129923	700,3977313	265,5863312	0,025078545	0,038907577	0,000975745
9,8828465	5,087770685	8,678995547	4,317092754	568,1102257	139,9950471	0,009627612	0,457153878	0.0044013
9,303896976	1,810220244	7,842421576	1,922710562	60,44515025	56,12214851	0,000455884	0,977845972	0,000445785
8,330965452	· ·	5,29644941	4,552082941	243,0975099	186,750662	0,005675814	0,569383172	0,003231713
7,933848614	6,047872361	7,115511207	3,905735248	417,1552967	276,8848494	0,015748653	0,121604435	0,001915106
					Right cens	ored		
Covariates	_				Right cens	ored	LN K (rig	ght censored) :
Covariates Vibration	Temperature	Humidity	Voltage	Acceleration	-			
Vibration				factor	Yariable		<u> B(ti) = 1-F(ti</u> )	
Vibration 5,879085502	1,909409711	8,22257495	0,941141337	factor 15,738956	<b>∀ariable</b> 1197,615901		<b>R(ti) = 1-F(ti</b> )	
Vibration				factor	Yariable 1197,615901 1671,909902	]	<u> B(ti) = 1-F(ti</u> )	
Vibration 5,879085502	1,909409711	8,22257495	0,941141337	factor 15,738956	<b>∀ariable</b> 1197,615901	]	<b>R(ti) = 1-F(ti)</b> 0,099405926 0,514797147	
Vibration 5,879085502 1,115441592	1,909409711	8,22257495	0,941141337	factor 15,738956 1,978235469 Acceleration	Variable 1197,615901 1671,909902 Left censo	] sed	<b>R(ti) = 1-F(ti)</b> 0,099405926 0,514797147 LN K (I	) eft censored) :
Vibration 5,879085502 1,115441592 Covariates Vibration	1,909409711 0,66606671 Temperature	8,22257495 6,620167928 Humidity	0,941141337 0,655152678 Voltage	factor 15,738956 1,978235469 Acceleration factor	Variable 1197,615901 1671,909902 Left censor Variable	] sed	R(ti) = 1-F(ti) 0,099405926 0,514797147 LN K (I B(ti) = 1-F(ti)	) eft censored) : )F(ti)
Vibration 5,879085502 1,115441592 Covariates Vibration 3,85433877	1,909409711 0,66606671 Temperature 1,380001044	8,22257495 6,620167928 Humidity 0,646553342	0,941141337 0,655152678 Voltage 5,978216832	factor 15,738956 1,978235469 Acceleration factor 35,52846621	Variable           1197,615301           1671,909302           Left censor           Variable           213,9304232	] sed	<b>B(ti) = 1-F(ti)</b> 0,099405926 0,514797147 LN K (1 <b>B(ti) = 1-F(ti)</b> 0,898651627	eft censored) : <b>F(ti)</b> 0,101348373
Vibration 5,879085502 1,115441592 Covariates Vibration 3,85433877 7,673491096	1,909409711 0,66606671 Temperature 1,380001044 1,541910777	8,22257495 6,620167928 Humidity 0,646553342 8,341304629	0,941141337 0,655152678 Voltage 5,978216832 0,008514923	factor 15,738956 1,978235469 Acceleration factor 35,52846621 17,98805516	Variable 1197,615301 1671,903902 Left censor Variable 213,9304292 29,63636076	] sed	B(ti) = 1-F(ti) 0,039405926 0,514797147 LN K (1 B(ti) = 1-F(ti) 0,898651627 0,996361402	eft censored) : <b>F(ti)</b> 0,003638598
Vibration 5,879085502 1,115441592 Covariates Vibration 3,85433877	1,909409711 0,66606671 Temperature 1,380001044 1,541910777	8,22257495 6,620167928 Humidity 0,646553342	0,941141337 0,655152678 Voltage 5,978216832	factor 15,738956 1,978235469 Acceleration factor 35,52846621	Variable           1197,615301           1671,909302           Left censor           Variable           213,9304232	] sed	<b>B(ti) = 1-F(ti)</b> 0,099405926 0,514797147 LN K (1 <b>B(ti) = 1-F(ti)</b> 0,898651627	eft censored) : <b>F(ti)</b> 0,101348373
Vibration 5,879085502 1,115441592 Vibration 3,85433877 7,673491096 0,957030709	1,909409711 0,66606671 Temperature 1,380001044 1,541910777	8,22257495 6,620167928 Humidity 0,646553342 8,341304629	0,941141337 0,655152678 Voltage 5,978216832 0,008514923	factor 15,738956 1,978235469 Acceleration factor 35,52846621 17,98805516	Variable           1197,615301           1671,909902           Left censor           Variable           213,9304292           29,63636076           28,29031689           Censorship	sed j pinterval	R(i) = 1-F(i) 0,099405926 0,514797147 LN K (I R(i) = 1-F(i) 0,898651627 0,996361402 0,969170391	eft censored) : <b>F(ti)</b> 0,003638598 0,030829609
Vibration 5,879085502 1,115441592 Covariates Vibration 3,85433877 7,673491096 0,957030709 Covariates	1,909409711 0,66606671 Temperature 1,380001044 1,541910777 5,914531905	8,22257495 6,620167928 Humidity 0,646553342 8,341304629 7,132824959	0,941141337 0,655152678 Voltage 5,978216832 0,008514923 8,259968048	factor 15,73956 1,978235469 Acceleration factor 35,52846621 17,98805516 159,9914204	Variable           1197,615301           1671,3039302           Leff censor           Variable           213,9304232           29,63636076           28,29391689	sed j pinterval	R(i) = 1-F(i) 0,099405926 0,514797147 LN K (I R(i) = 1-F(i) 0,898651627 0,996361402 0,969170391	eft censored) : <b>F(ti)</b> 0,003638598
Vibration 5,879085502 1,115441592 Vibration 3,85433877 7,673491096 0,957030709	1,909409711 0,66606671 Temperature 1,380001044 1,541910777	8,22257495 6,620167928 Humidity 0,646553342 8,341304629	0,941141337 0,655152678 Voltage 5,978216832 0,008514923	factor 15,73956 1,978235469 Acceleration <u>factor</u> 25,52846621 17,98805516 159,9914204 Acceleration	Variable           1197,615901           1671,909902           Left censor           Variable           213,9304292           29,63636076           28,29091689           Censorship           Beginnings	yred b interval	R(ti) = 1-F(ti) 0,039405326 0,514797147 LN K (1 0,838651627 0,396351402 0,396351402 0,39631402 0,39631402 0,39631402 0,39631402 LN K (censor	eft censored) : <b>F(ti)</b> 0,003638538 0,030823609 0,030823609 rship interval) :
Vibration 5,873085502 1,115441592 Covariates Vibration 3,85433877 7,673491096 0,957030709 Covariates Vibration	1,909409711 0,66606671 Temperature 1,380001044 1,541910777 5,914531905 Temperature	8,22257495 6,620167928 Humidity 0,646553342 8,341304629 7,132824959 Humidity	0.941141337 0.655152678 Voltage 5.978216832 0.008514923 8.259968048 Voltage	factor 15,738956 1,978235469 Acceleration 735,52846621 17,98805516 159,9914204 Acceleration factor	Variable           1197,615901           1671,909902           Left censor           Variable           213,9304292           29,63636076           28,29091689           Censorship Beginnings           Variable	yred b interval	R(ii) = 1-F(ii) 0,039405926 0,514797147 LN K (I R(ii) = 1-F(ii) 0,898651627 0,996361402 0,969170391 LN K (censol R(ii) = 1-F(ii)	eft censored) : <b>F(ti)</b> 0,003638598 0,030829609 rship interval) : <b>F(ti)-F(ti)</b>
Vibration 5,879085502 1,115441592 Covariates Vibration 3,85433877 7,673491096 0,957030709 Covariates	1,909409711 0,66606671 Temperature 1,380001044 1,541910777 5,914531905	8,22257495 6,620167928 Humidity 0,646553342 8,341304629 7,132824959	0,941141337 0,655152678 Voltage 5,978216832 0,008514923 8,259968048	factor 15,73956 1,978235469 Acceleration <u>factor</u> 25,52846621 17,98805516 159,9914204 Acceleration	Variable           1197,615901           1671,909902           Left censor           Variable           213,9304292           29,63636076           28,29091689           Censorship           Beginnings	yred b interval	R(ti) = 1-F(ti) 0,039405326 0,514797147 LN K (1 0,838651627 0,396351402 0,396351402 0,39631402 0,39631402 0,39631402 0,39631402 LN K (censor	eft censored) : <b>F(ti)</b> 0,003638538 0,030823609 0,030823609 rship interval) :
Vibration 5,879085502 1,115441592 Covariates Vibration 3,85433877 7,673491096 0,957030709 Covariates Vibration 7,17447451 3,359541796	1,909409711 0,66606671 Temperature 1,380001044 1,541910777 5,914531905 Temperature 4,883854746	8,22257495 6,620167928 Humidity 0,646553342 8,341304629 7,132824959 Humidity 8,37561694	0,941141337 0,655152678 Voltage 5,978216832 0,008514923 8,259368048 Voltage 3,067595325	factor 15,73956 1,978235469 Acceleration factor 35,52846621 17,98905516 159,9914204 Acceleration factor 153,3023197	Variable           1197,615301           1671,909902           Left censor           Variable           213,9304292           29,63636076           28,29031689           Censorship           Beginnings           Variable           273,2980707           31,24720534	yred b interval	R(ti) = 1-F(ti) 0,099405926 0,514797147 LN K (ti) 0,89851627 0,98651627 0,98651627 0,969170391 LN K (censol R(ti) = 1-F(ti) 0,470614016	eft censored) : (101348373 0,003638598 0,030829609 rship interval) : (1017) (101
Vibration 5,879085502 1,115441532 Covariates Vibration 3,85433877 7,673491036 0,957030709 Covariates Vibration 7,17447451 3,359541796 Covariates	1,909409711 0,66606671 Temperature 1,380001044 1,541910777 5,914531905 Temperature 4,883854746 0,16492899	8,22257495 6,620167928 Humidity 0,646553342 8,341304629 7,132824959 Humidity 8,37561694 9,659029114	0,941141337 0,655152678 Voltage 5,978216832 0,008514923 8,259968048 Voltage 3,067595325 6,417181738	factor 15,738956 1,978235469 Acceleration factor 35,52846621 17,98805516 153,9914204 Acceleration factor 153,3023197 17,23910752	Variable           1197,615301           1671,909902           Left censor           Variable           213,9304232           29,63636076           28,29091689           Censorship           Beginnings           Variable           273,2980707	yred b interval	R(ti) = 1-F(ti) 0,099405926 0,514797147 LN K (ti) 0,89851627 0,98651627 0,98651627 0,969170391 LN K (censol R(ti) = 1-F(ti) 0,470614016	eft censored) : (101348373 0,003638598 0,030829609 rship interval) : (1017) (101
Vibration 5,879085502 1,115441592 Covariates Vibration 3,85433877 7,673491096 0,957030709 Covariates Vibration 7,17447451 3,359541796	1,909409711 0,66606671 Temperature 1,380001044 1,541910777 5,914531905 Temperature 4,883854746	8,22257495 6,620167928 Humidity 0,646553342 8,341304629 7,132824959 Humidity 8,37561694	0,941141337 0,655152678 Voltage 5,978216832 0,008514923 8,259368048 Voltage 3,067595325	factor 15,73956 1,978235469 Acceleration factor 35,52846621 17,98805516 159,9914204 Acceleration factor 153,3023197 17,23910752 Acceleration	Variable           1197,615301           1671,309302           Left censor           Variable           213,9304232           223,6336076           28,23936076           28,23931689           Censorship Beginnings           Variable           273,2380707           31,24720534           Ends	yred         	R(ti) = 1-F(ti) 0,039405926 0,514797147 LN K (I 0,898651627 0,986361402 0,969170391 LN K (censol R(ti) = 1-F(ti) 0,470614016 0,396366368	eft censored) : <b>F(ti)</b> 0,01348373 0,003638598 0,030829609 (0,308609 (0,308609 (0,3089609 (0,308609 (0,308609 (0
Vibration 5,879085502 1,115441592 Covariates Vibration 3,85433877 7,673491096 0,957030709 Covariates Vibration 7,17447451 3,359541796 Covariates Vibration	1,909409711 0,66606671 Temperature 1,380001044 1,541910777 5,914531905 Temperature 4,883854746 0,16492899	8,22257495 6,620167928 Humidity 0,646553342 8,341304629 7,132824959 Humidity 8,37561694 9,659029114 Humidity	0,941141337 0,655152678 Voltage 5,978216832 0,008514923 8,259968048 Voltage 3,067595325 6,417181738 Voltage	factor 15,738956 1,978235469 Acceleration 735,52846621 17,98805516 159,9914204 Acceleration Factor 153,3023197 17,23910752 Acceleration factor	Variable           1197,615901           1671,909902           Left censor           Variable           213,9304292           29,63636076           28,29091689           Censorship           Beginnings           Variable           273,2980707           31,24720534           Ends           Variable	yred         	R(ii) = 1-F(ii) 0,039405326 0,514797147 LN K (I 0,88651627 0,936361402 0,969170391 LN K (censor R(ii) = 1-F(ii) 0,470614016 0,396366968 R(ij) = 1-F(ij)	eft censored) : <b>F(ti)</b> 0,01348373 0,003638598 0,030829609 (0,308609 (0,308609 (0,3089609 (0,308609 (0,308609 (0
Vibration 5,879085502 1,115441532 Covariates Vibration 3,85433877 7,673491036 0,957030709 Covariates Vibration 7,17447451 3,359541796 Covariates	1,909409711 0,66606671 Temperature 1,380001044 1,541910777 5,914531905 Temperature 4,883854746 0,16492899	8,22257495 6,620167928 Humidity 0,646553342 8,341304629 7,132824959 Humidity 8,37561694 9,659029114	0,941141337 0,655152678 Voltage 5,978216832 0,008514923 8,259968048 Voltage 3,067595325 6,417181738	factor 15,73956 1,978235469 Acceleration factor 35,52846621 17,98805516 159,9914204 Acceleration factor 153,3023197 17,23910752 Acceleration	Variable           1197,615301           1671,309302           Left censor           Variable           213,9304232           223,6336076           28,23936076           28,23931689           Censorship Beginnings           Variable           273,2380707           31,24720534           Ends	yred         	R(ti) = 1-F(ti) 0,039405926 0,514797147 LN K (I 0,898651627 0,986361402 0,969170391 LN K (censol R(ti) = 1-F(ti) 0,470614016 0,396366368	eft censored) : <b>F(ti)</b> 0,01348373 0,003638598 0,030829609 (0,308609 (0,308609 (0,3089609 (0,308609 (0,308609 (0

Processing can be restarted by the user as many times as necessary. The latter can also change the minimum and maximum limits proposed by the tool for each parameter.

At the end of processing, a dialog box proposes to estimate confidence intervals on the parameters or quantile values, by inverting the Fischer matrix. It also proposes to show the results in the form of various graphs (distribution function and Kaplan Meier curve, quantile/ quantile diagram, Weibull paper, etc.).

## **4** Algorithms

## 3.1 General Presentation

## 4.1.1 Genetic Algorithms

Developed by John Holland et al at the University of Michigan, genetic algorithms are optimizing algorithms based on natural selection and genetics mechanisms. The first of such mechanisms deals with principles of survival of best-adapted species based on Darwin postulate. The second one relies on diversity of individuals in a population of a same species that evolves over the time by crossbreeds and mutations.

The analogy between biology and genetic algorithms is shown in Figure 4.1.



Figure 4.1 - Analogy between biology and genetic algorithms

Each parameter configuration corresponds to a chromosome whose genes are parameters of different types (binary, integer, real). Such chromosomes are affected, within a population, mutation, crossbreeding, and selection ... operations considering respective performance of each single one (Figure 4.2).



Figure 4.2 - Basic principle of genetic algorithms

For every generation, a new identical-size population is created, consisting partly of best elements of previous generation and new elements generated by mutation or crossbreeding. Such operations are conducted in accordance with two objectives: reaching local optima and exploring variable space to search all optima in order, in this way, to find out the global optimum.

**Mutation** consists in introducing a noise in the gene value of a chromosome, i.e. a random deviation around such value. In this respect, mutation is an **exploration** operation of the searching space. Figure 4.3 shows an example of mutation to be applied to different types of parameters.



Figure 4.3 - Example of mutation

In this example, mutation of a chromosome, randomly drawn in population, is carried out through modification of one of its randomly selected genes. Such gene simply changes state if binary or performs a decreasing amplitude leap over the time if real or integer, so as to progressively limit the exploration as research goes on.

**Crossbreeding** is performed by pairing two population chromosomes which exchange information each other to give birth to two descendants. Just as for mutation, crossbreeding is an **exploration** operation of the research space of which two examples are given in Figure 4.4.



Figure 4.4 - *Examples of crossbreeding* 

In these examples, crossbreeding of two parent chromosomes randomly drawn in population is carried out either by gene exchange (crossover), each gene being reproduced in either descendants, or by averaging values (integer or real) of parent genes (barycentric).

**Selection** is a process whereby each chromosome is duplicated a number of times in the new population according to value (or fitness) of function to be optimized (also called adaptation function). Chromosomes, the adaptation function value of which is high, have a strong probability to contribute to the next generation, by creating one or more descendants identical to them. Such operator, an example of which is proposed in Figure 4.5, is of course an artificial version of the biological selection. In the nature, adapting a species is determined by its ability to survive to predators, diseases, and obstacles to get over to reach adulthood and reproduction period, whereas in our artificial environment, the function to be optimized is the final arbitrator of life or death of any chromosome. In this respect, selection operation is a **development** operation of research space.



Figure 4.5 - Example of selection

In this example, selection probability pi of each chromosome, computed from the relative weight of the result of its assessment, corresponds to a lottery wheel section whereby N draws are carried out to obtain the new population (N being the constant population size).

In addition to the specified examples, mutation, crossbreeding and selection operations may be performed in different ways proving to be more or less efficient depending on problems to be dealt with. Moreover, the optimum research may be improved by linking with such basic operations more classical techniques of setting to scale, elitism, or optimizing (method of climber).

Setting to scale is transformation acting on the adaptation function value whose purpose is creating a zoom effect on results as research goes on. At first steps of research, deviations between fitness are wished to be reduced so as to prevent good chromosomes from becoming too predominating. Then, deviations are amplified to accelerate convergence.

Elitism consists in preserving, for each generation, a number of best population chromosomes which might disappear due to mutation, crossbreeding or selection operations.

A climber method, such as non-linear simplex, may be related with the genetic algorithm to form together a hybrid method with a best ability to develop (research of local optima).

### 4.1.2 Differential Evolution

Proposed in 1995 per K Price and R. Storn, the Differential Evolution consists in generating a new chromosome by adding to genes of a member of the population the difference between genes of two other chromosomes.

Similar to the mutation and the crossbreeding of the Genetic Algorithms, this operator explores the space of the solutions by simultaneously modifying the totality of genes of each chromosome.

It requires a permanent diversity of each gene in the population to avoid a premature convergence. Also, a hybrid use associating Genetic Algorithms, Differential Evolution and nonlinear Simplex, is particularly robust to solve various problems.

### 4.1.3 Nonlinear simplex

The local method of the nonlinear simplex, illustrated below, can be associated the genetic algorithms and the differential evolution to constitute together a hybrid method having a better capacity of exploitation (research of the local optima).



Simplex of n+1 points in R<sup>n</sup>

### 4.1.4 Coupling between optimization and Monte-Carlo simulation

The function to be optimized cannot be always expressed in an analytical way and its evaluation can result from a Monte-Carlo simulation (see an example of coupling with the simulation software SIMCAB in chapter 4.4).

However, the coupling between optimization and stochastic simulation, which consists in search of an optimal configuration of parameters starting from the results of a function of evaluation treated by Monte-Carlo simulation, is very penalizing in term of duration of treatment. At first approximation, the number of simulations to be realized is equal to the number of evaluations necessary to optimization multiplied by number N of simulations required by the required precision.

This is why GENCAB implements an original strategy consisting in varying, during the treatment, the number of simulations  $N_i$  of each evaluation, by exploiting the average and the variance of the results obtained starting from a preliminary evaluation limited to  $N_0$  simulations.



The guiding principle of this technique consists in giving to each solution the same probability of inappropriate rejection, which results in a condition between respective values  $N_i$  and  $N_j$  of the number of simulations realized to evaluate two candidates I and J. This condition results directly from the application of the central limit theorem.

In order to significantly decrease the total duration of the treatments (from 1 to 30 according to the problems to be solved and the adjustment of the algorithms), the user can thus activate this strategy by defining the  $N_0$  number of simulations carried out for the coarse evaluation as well as number N necessary to the necessary precision.

He can also make grow the precision requested during the treatment, parallel to the progressive improvement of the population of solutions.

Note: Contrary to the ordinary coupling between simulation and optimization, optimization should not relate to results of simulation in the form of a combination between average value and/or standard deviation, when this technique of improvement of the coupling is activated.

## 4.2 Algorithms' Selection and Setting

Command "Algorithm" of menu "Optimisation" generates the display of following dialog box which helps set the optimizing parameters.

ALGORITHM ? 🔀							
Population size : 50							
Mutation :							
C Type 1 (gene by gene)							
C Type 2 (differential evolution)							
<ul> <li>Type 3 (mixed)</li> </ul>							
Crossbreeding :							
C None							
Crossover							
C Barycentric							
Selection							
<ul> <li>Sampling of remaining part without replacement</li> <li>Sampling of remaining part with replacement</li> <li>Deterministic sampling</li> <li>Lottery wheel</li> </ul>							
<ul> <li>✓ Lottery wheel</li> <li>✓ Setting to scale &gt;&gt; ○ Truncation</li> <li>✓ Elitism &gt;&gt; Number of individuals : 1</li> </ul>							
Simplex >> Number of chromosomes : 1							
For 50 % of iterations Number of steps : 50							
After 50 % of iterations 🔲 Without replacement							
OK Cancel							

The user may define the population size and choose among different mutation, crossbreeding and selection operators.

He may also select a setting to scale, by choosing between two different techniques (Truncation or Exponential), an elitism operator, by specifying the number of individuals to be maintained for each generation, and a link with Simplex algorithm, possibly limited to certain loops of calculation (in proportion and starting from a certain row)..

If Simplex is selected, the user should define a number of chromosomes, among the best of the population, from which a local optimum will be searched. He should also indicate a number of processing steps to be carried out for this research and possibly select the option **''Without Replacement''**.

When such option is requested, the chromosome is no longer replaced by the local optimum being found by simplex but its fitness assumes the value of that of the optimum, which may increase chances to find out new optima on subsequent mutations.



Simplex with replacement

Depending on options selected, validation generates the display of different additional dialog boxes.

## 4.2.1 Mutation

Three operators of change are proposed to the user:

- That described on figure 4.3 of the chapter 4.1.1 (Type 1)
- Differential Evolution (Standard 2)
- A mixed use of these two operators (Type 3)

According to the type of operator chosen, the following dialog boxes allow to define the mutation probability of each chromosome, the decrease in mutation amplitude of a real or integer gene and the mutation probability of a binary gene.

MUTATION		DIFFERENT	IAL EVOLUTION	? 🛛	
Probability of chromosome mutation:	0.3		Probability of chromoso	me mutation:	0.3
Mutation probability of a gene :	0.3		🔽 Decrease of the am	plitude (real or integer gene)	
✓ Decrease of the amplitude (real or integer gene)			Factor of de	3	
Factor of decrease (b>0):		Number of generation	20		
Number of generations affected (T>0) :		🔽 All (T	= Number of iterations)		
✓ All (T = Number of iterations)			🔽 Self-adapting	decrease	
✓ Self-adapting decrease			Mutation probability of	a binary gene :	0.3
OK Return to menu	Cancel		ОК	Return to menu	Cancel

The mutation amplitude of a real or integer gene can be governed by an adaptive control or the following expression:

$$1 - r^{(1-\frac{t}{T})^b}$$

where r is a random number comprised between 0 and 1 and t the number of the processing loop.



## 4.2.2 Crossbreeding

One of the two crossbreeding operators described in Figure 4.4 (Crossover or barycentric) may be selected by the user. The above described dialog box helps define the crossbreeding probability of each population chromosome with another one randomly chosen in such population.

CROSSBREEDING	? ×
Crossbreeding probability of a chromosome : 0,3	
OK Return to menu	

## 4.2.3 Selection

In addition to the selection with lottery wheel shown in Figure 4.5, the software proposes three other selection operators:

- . Sampling of remaining part without replacement
- . Sampling of remaining part with replacement
- . Deterministic sampling

Such operators, which cannot be parameterized, perform the selection as follows:

#### Sampling of remaining part without replacement

Assuming a population of n individuals, the expected number  $n_i$  of descendants for each individual i is computed by the following formula:

$$n_i = n * \frac{f(i)}{\sum_{i=1}^n f(i)}$$
 where f designates the adaptation function

Each individual i is reproduced, in new population, a number of times equal to the whole part of number  $n_{\rm i}.$ 

In order to complete the population and bring it back to its initial size n, individuals are successively subject to a random draw by considering the decimal part of number  $n_i$  as probability of success.

The two other selection operators differ from the previous one only by the processing operated on decimal parts of numbers  $n_i$ :

#### Sampling of remaining part with replacement

To complete the population, decimal parts of numbers  $n_i$  are used to form a lottery wheel.

#### Deterministic sampling

Decimal parts of  $n_i$  are arranged in decreasing order, and chromosomes corresponding to first elements of list complete population.

The method of selection with lottery wheel offers a great variance and often conducts to results far from those expected (especially disappearance of best elements). But no one could really demonstrate to date the superiority of one of the other selection methods being proposed.

## 4.2.4 Setting to Scale

Two different techniques of setting to scale are offered to user.

#### Setting to scale by truncation in sigma

The preliminary transformation of fitness of each chromosome is performed as follows:

$$f' = f - (\overline{f} - c \sigma)$$

with  $\overline{f}$  the average of fitness for all chromosomes and  $\sigma$  the typical deviation.

Transformation may be represented as follows :



User using dialog box below defines scale factor «c».

SETTING TO SCALE BY TRUNCATION IN SIGMA	? ×
Scale factor : 2	
OK Return to menu	

#### Setting to exponential scale

Preliminary fitness transformation of each chromosome is carried out as follows:

$$f' = f^{I(k)} \text{ with } I(k) = \left(\frac{s^*}{s_0}\right)^{p_1} \tan^{p_2\left(\frac{s_0}{s^*}\right)^{\alpha}} \left(\frac{\pi}{2} \frac{k}{N+1}\right) \qquad f' \qquad \text{Beginning} \\ f = \int_{0}^{\infty} \frac{1}{s_0} \left(\frac{\pi}{s_0} \frac{k}{N+1}\right) \left(\frac{\pi}{2} \frac{k}{N+1}\right) = \int_{0}^{\infty} \frac{1}{s_0} \left(\frac{\pi}{s_0} \frac{k}{N+1}\right) \left(\frac{\pi}{s_0} \frac{k}{N+1}\right) \left(\frac{\pi}{s_0} \frac{k}{N+1}\right) = \int_{0}^{\infty} \frac{1}{s_0} \left(\frac{\pi}{s_0} \frac{k}{N+1}\right) \left(\frac{\pi}{s_0} \frac{k}{N+1}\right) \left(\frac{\pi}{s_0} \frac{k}{N+1}\right) = \int_{0}^{\infty} \frac{1}{s_0} \left(\frac{\pi}{s_0} \frac{k}{N+1}\right) \left(\frac{\pi}{s_0} \frac{k}{N+1}\right) \left(\frac{\pi}{s_0} \frac{k}{N+1}\right) = \int_{0}^{\infty} \frac{1}{s_0} \left(\frac{\pi}{s_0} \frac{k}{N+1}\right) \left(\frac{\pi}{s_0} \frac{k}{N+1}\right) \left(\frac{\pi}{s_0} \frac{k}{N+1}\right) = \int_{0}^{\infty} \frac{1}{s_0} \left(\frac{\pi}{s_0} \frac{k}{N+1}\right) \left(\frac{\pi}{s_0} \frac{k}{N+1}\right) \left(\frac{\pi}{s_0} \frac{k}{N+1}\right) \left(\frac{\pi}{s_0} \frac{k}{N+1}\right) \left(\frac{\pi}{s_0} \frac{k}{N+1}\right) = \int_{0}^{\infty} \frac{1}{s_0} \left(\frac{\pi}{s_0} \frac{k}{N+1}\right) \left(\frac{\pi}{s_0} \frac{$$

where: k is the current generation

N the number of generations being wished (iteration number) And parameters S\*, S0, P1, P2 and  $\alpha$  are defined by the following dialog box:

SETTING TO	EXPONENTIAL SCALE
S* :	0.1
S0 :	0.1
P1 :	0.05
P2 :	0.1
Alpha :	0.1
ОК	Return to menu

## 4.2.5 Taking into account of the constraints

The taking into account of the constraints is carried out by the addition of a term of penalty to the result of the function to optimize. This one with the following form in which fp can be adjusted by the user:

$$Tp = fp^* \sum (dci)^2$$

with dci = Max(0, B-A) if  $A \ge B$ , = B-A if A = B or = A-INT(A) if A Integer

TAKING INTO ACCOUNT OF THE CONSTRAINTS	? ×
Factor of penalty: 1E+50	
OK Return to menu	

This adjustment is in particular necessary in the case of constraints of the equality type or Integer value not to block the algorithm in its research by a too strong penalty (to increase the penalty gradually).

## 4.2.6 Optimization starting from results of simulation

The following dialog box makes it possible to the user to activate the optimized strategy of coupling between optimization and Monte-Carlo simulation (described in paragraph 4.1.4) and to define the minimum number  $N_0$  of simulations carried out for the coarse evaluation as well as maximum number N necessary to the necessary precision.

OPTIMIZATION FROM RESULTS OF SIMULATION	? 🗙
✓ Optimized coupling	
Max number of simulations by evaluation:	5000
Min number of simulations by evaluation:	100
Evolution factor of the number of simulations :	1
(0: Nmax ; <1: fast ; 1: linear  ; >1: slow)	
OK Return to menu	

According to the entered value of a coefficient K, this required precision can be fixed or progress during the treatment according to the following formula, parallel to the progressive improvement of the population of solutions.





## 4.3 Initial Population

Command "**Initial Population**" of menu "**Optimisation**" generates the display of a dialog box which helps define the initial population (randomly drawn by default).



This box allows to:

- . define population size,
- . generate a chromosome data acquisition sheet to be considered in initial population,
- . consider obviously such chromosomes in initial population,
- . generate randomly initial population,
- . display initial population,

. assess such population according to the result of the cell of the sheet whose address is in the box "Cell".

An option allows maintaining only the best individual on each new processing and generating randomly the remainder of population.

If such option is not selected, population obtained at end of previous processing is entirely preserved as new initial population.

## **5 Examples of Applications**

Examples shown here are provided for demonstration in online help.



## **5.1 Mathematical Functions**

 $f(x,y) = 200 - (x^2 + y^2)$  with x, y real, comprised between -10 and +10

This convex function may be optimized only by simplex (iteration number = 1, population size =1)



f(x,y) = Integer Part of  $[10 - (24+x^2 + y^2)/25]$ with x, y real, comprised between -10 and +10

This function shows only stages making simplex inoperative.



 $f(x,y) = Maximum [0,02; (sin(x)*sin(y)/100+x^2*y^2)^{1/2}]$ with x, y real, comprised between -10 and +10

This function shows multiple local optima and its optimizing is made especially efficient by linking Genetic Algoritmes and Simplex.



## 5.2 Polynomial Adjustment

## 5.3 Combinatory Problem

ariable	II° of city	List		Distance		*******					1111111111111			*******	100515
	0	100450700	Brest	707										Strasbourg	
6	6	123456789	Lyon	767	Brest		505	703	255	496	949	767	518	903	601
5	5	12345789	Marseille	316	Paris		0	681	386	559	769	472	375	447	22
2	2	1234789	Toulouse	400	Toulouse	703	681	0	559	250	400	467	306	901	90
3 3 2 3	4	134789	Bordeaux	250	Nantes	255	386	559	0	331	890	607	297	832	59
3	7	13789	Limoges	219	Bordeaux	496	559	250	331	0	657	549	219	914	78
2	3	1389	Nantes	297	Marseille	949	769	400	890	657	0	316	610	750	97
3	9	189	Lille	593	Lyon	767	472	467	607	549	316	0	364	434	66
1	1	18	Paris	224	Limoges	518	375	306	297	219	610	364	0	707	59
	8	8	Strasbourg	447	Strasbourg	903	447	901	832	914	750	434	707	0	52
			Total :	2746	Lille	601	224	905	593	786	979	668	599	524	0
	1 8	1 8				1000	224	901 905	832 593	914 786	979 979	434 668	599	524	

## 5.4 Linking with SIMCAB Software

Such a coupling enables to achieve optimizations from simulation results.

2	
	Parking strategy
Nth free spa	ace or first free space after row P
Free space 1 : Free space 2 : Free space 3 Free space 4 Free space 5 Free space 6 Free space 7 Free space 8 Free space 9 Free space 10	96 >P       100 spaces per finitute         #N/A       N: 5         #N/A       P: 56         #N/A       Space number : 96         #N/A       Time taken to reach the objective : 1,36
	Mean value : 4,7259 Standard deviation : 3,09317466

In this example, the two optimal parameters of parking strategy (Nth free parking lot and row P from which the first free parking lot will be systematically taken) are being searched by *GENCAB* by minimizing the average of times taken to reach the objective, assessed by *SIMCAB*.

## 5.5 Linking with SUPERCAB Software

*GENCAB* may be linked with other Excel® operating softwares, especially with the RAMS (Reliability, Availability, Maintenability and Safety) *SUPERCAB* software also issued by *CAB INNOVATION*. Linking with this software may thereby be used for optimizing system architecture:

Units	MTTF ON (heure)	Nb	Kind of redondancy	Stock of spares	Cost unit (Euros)	MDT (hour)	TAT (hour)	Operational availability	Cost (Euros)	
Engine az/el	100000	2	série	1	4500	28	2400	0,9972	13500	
Coders	100000	2	série	1	1500	28	2400	0,9972	4500	Markovian Treatments (SUPERCAB tool
Transmitter/receiving	2007		Passive 1/2	0	15104	28	1000	0,8433	30208	
Calculator of piloting	2040		Passive 1/1	3	4158	25	800	0,9674	16633	
A - TTC STATION						· · · · · · · · · · · · · · · · · · ·		0,8111	64841	
		а. — н	50	86 - 1 S	20	as:		10		
Computer of Archive	33000	1	série	0	4500	29	115	0,9965	4942	Configuration of 24 real or integers parameters (in blue)
Computer of production	2439		Passive 2/4	1	2158	30	432	0,9866	11074	
Supervision PC	10000		Active 1/3	1	500	28	427	0,9972	2287	
Mirror Disc	50000	2	série	0	4000	28	334	0,9989	8333	
B - USER CENTER			· 22		20	W		0,9793	26636	Diue)
	58 38				00	10 DO				
Antenna	33000	1	série		4500		1000	0,9706	4500	
Transmitter/receiving	2201	1	série	3	6007	40	345	0,9814	24354	
Supervision PC	127000	1	série	3	500	40	417	0,9997	2292	
C - Emergency Center								0,9522	31146	
TOTAL OVETEM							A*D.C	0.0000	400000	
TOTAL SYSTEM:							A*B+C	0,9902	122622	

#### **OPERATING LICENCE AGREEMENT**

#### OF GENCAB SOFTWARE PACKAGE

#### **ARTICLE 1 : SUBJECT**

The purpose of this Agreement is to define the conditions in which the CAB INNOVATION Company grants the customer with a non-transferable, non-exclusive and personal right to use the software package referred to as "GENCAB" and whose features are specified in user's manual.

#### **ARTICLE 2 : SCOPE OF THE OPERATING RIGHT**

The customer may use the software package on one single computer and on a second one provided that the second computer does not operate at the same time as the first one. The customer can only have one software package copy maintained in a safe place as a backup copy.

If this license is regarding a performance on site, the customer may install the package software on a server, while scrupulously complying with purchase conditions stated on specific conditions especially defining the maximum number of users authorized to use the software package from their terminal and the maximum number of users authorized to use it simultaneously. The customer is therefore authorized to perform a number of software package documentation copies equal to the maximum number of users allowed to use it.

CAB INNOVATION will be in a position to perform inspections, either itself or through a specialized entity purposefully authorized by CAB INNOVATION, at customer premises to verify if customer has met its requirements : number of software package copies used, location of such copies, etc... Parties will agree as regards the practical modalities of performance of such inspections so as to disturb minimally customer's activity.

#### **ARTICLE 3 : DELIVERY, INSTALLATION AND RECEPTION**

The software package and attached supplies will be delivered to the customer on mail reception date. The customer installs, at its own costs, the software package using relevant manual delivered by CAB INNOVATION. The customer performs the inventory and shall inform CAB INNOVATION, within three working days of the delivery, of

any apparent nonconformity with respect to the order. The customer is liable for any loss or any damage caused to supplies as from the delivery.

#### ARTICLE 4 : TESTING AND GUARANTEE

Guarantee is effective as from the mail delivery date set forth in Article 3 and has a three-month validity.

During the guarantee validity, if the customer experiences a software package operation trouble, he should inform CAB INNOVATION about it, so as to receive any helpful explanations with the purpose of remedying such trouble. If the trouble is continuing, the customer will return the C.D. ROM to CAB INNOVATION, at CAB INNOVATION's Head Office, at his own expense and with registered mail with acknowledgement of receipt, by specifying exactly the troubles encountered.

Within the three months of reception of consignment set forth in preceding paragraph, CAB INNOVATION will deliver, at its own expense, a new product version to the customer. This new version will be benefiting of the same guarantee as benefited the first version.

The customer looses the benefit of the guarantee if he does not comply with the instructions manual recommendations, if he performs modifications of configuration set forth in Article 2 above without obtaining a prior written consent from CAB INNOVATION, or if he performs modifications, additions, corrections, etc... on software package, even with the support from a specialized service company, without obtaining a prior written consent from CAB INNOVATION.

#### **ARTICLE 5 : PROPERTY RIGHT**

CAB INNOVATION declares to be holding all the rights provided for by the intellectual property code for GENCAB package software and its documentation.

As this operating-right granting generates no property-right transfer, the customer abstains from :

- any GENCAB software package reproduction, whether it is wholly or partly carried out, whatever the form assumed, excepting the number of copies authorized in Article 2;

- any GENCAB software package transcription in any other language than that provided for in this Agreement (see Appendix), any adaptation to use it in other equipment or with other basic software packages de base than those provided for in this Agreement.

To ensure this property protection, the customer undertakes especially to

- maintain clearly visible any property and copyright specifications that CAB INNOVATION would have affixed on programs, supporting material and documentation ;

- assume with respect to his staff and any external person any helpful information and prevention step.

#### **ARTICLE 6 : USING SOURCES**

Any GENCAB software package modification, transcription and, as a general rule, any operation requiring the use of sources and their documentation are exclusively reserved for CAB INNOVATION.

The customer holds the right to get the information required for the software package interoperability with other softwares he is using, under the conditions provided for in the intellectual property code.

In each case, an amendment of these provisions will set out the price, time limits and general terms of performance thereof.

#### **ARTICLE 7 : LIABILITY**

The customer is liable for :

choosing GENCAB software package, its adequacy with his requirements, precautions to be assumed and back-up files to be made for his operation, his staff qualification, as he received from CAB INNOVATION recommendations and information required upon its operating conditions and limits of its performances set forth in user's manual;
 the use made for results he obtains.

CAB INNOVATION is liable for the software package conformity with his documentation. The customer shall prove any possible non-conformity.

CAB INNOVATION does not assume any whatsoever guarantee, whether explicit or implicit, relating to the software package, manuals, attached documentation or any supporting item or material provided and, especially, any guarantee for marketing of any products relating to software package or for using software package for a determined use, any guarantee for absence of forgery, etc...

Under no circumstances CAB INNOVATION could be held responsible for any whatsoever damage, especially loss in performance, data loss or any other financial loss resulting from the use or impossibility to use the GENCAB software package, even if CAB INNOVATION was told about the possibility of such damage.

In the event where CAB INNOVATION liability is retained, it is expressly agreed upon that the total amount of compensation to be paid by CAB INNOVATION, all cases taken together, could not in any way exceed the initial-royalty price reduced by 25 % per period of twelve months elapsed as from the mailing delivery date.

#### **ARTICLE 8 : DURATION**

This Agreement is entered into for an undetermined period of time as of the date set forth in Article 3.

#### **ARTICLE 9 : TERMINATION**

Each party may terminate this Agreement, by registered mail with acknowledgement of receipt forwarded to the other party, for any breach by such party of its obligations, despite a notice remaining unresponsive for 15 days, and this occurring with no prejudice to damages it could claim and provided that the last paragraph of Article 7 above, be enforced.

At end of this Agreement or in case of termination for whatsoever reason, the customer will have to stop using GENCAB software package, pay all sums remaining due on date of termination and return all elements composing the software package (computer programs, documentation, etc ... ) without maintaining any copy of it.

#### **ARTICLE 10 : ROYALTY**

As a payment for the operating-right concession, the customer pays CAB INNOVATION an initial royalty the amount of which is determined in specific conditions.

#### **ARTICLE 11 : PROHIBITED TRANFER**

The customer refrains from transferring the software package operating right granted personally to him by these provisions. The customer also abstains from making documentation and supporting material (CD ROM), even free of charge, available to a person not expressly set forth in second paragraph of Article 2.

#### **ARTICLE 12 : ADDITIONAL SERVICES**

Any additional services will be subject to an amendment of these provisions, possibly through an exchange of letters, so as to specify the contents, modalities of achievement and the price.

#### **ARTICLE 13 : CORRECTIVE AND PREVENTIVE MAINTENANCE**

The corrective and preventive maintenance may be subject, upon customer's request, to a separate Agreement attached to these provisions.

#### **ARTICLE 14 : ENTIRETY OF THE AGREEMENT**

The user's manual defining the GENCAB software package features is appended to these provisions.

The provisions of this Agreement and his Appendix express the entirety of the Agreement entered into between the parties. They are prevailing among any proposition, exchange of letters preceding its signing up, together with any other provision stated in documents exchanged between the parties and relating to the Agreement's subject matter.

If any whatsoever clause of this Agreement is null and void with respect to a rule of Law or a Law in force, it will considered as not being written though not involving the Agreement's nullity.

#### **ARTICLE 15 : ADVERTISING**

CAB INNOVATION could mention the customer in its business references as a GENCAB software package user.

#### **ARTICLE 16 : CONFIDENTIALITY**

Each party undertakes not to disclose any kind of documents or information about the other party that it would have been informed of on the Agreement's performance and undertakes to have such obligation fulfilled by the persons it is liable for

#### **ARTICLE 17 : AGREEMENT'S LANGUAGE**

This Agreement is entered into and drawn up in the French language. In the event where it is translated into one or more foreign languages, only the French text will be deemed authentic in case of any dispute between the parties.

#### **ARTICLE 18 : APPLICABLE LAW - DISPUTES**

The French Law governs this Agreement.

In the event of any disagreement over the interpretation and performance of any whatsoever provision of this Agreement, and if parties fail to reach an agreement under an arbitration procedure, only Toulouse's Courts will be competent to settle the dispute, despite the plurality of defendants or the appeal for guarantee.