



# Supplement of

# Geochronological database and classification system for age uncertainties in Neotropical pollen records

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## Introduction

This document presents the outcomes and the manual of the methodology presented in the paper "Geochronological database and classification system for age uncertainties in Neotropical pollen records" by S.G.A. Flantua, M. Blaauw and H. Hooghiemstra in Climate of the Past 2016.

The methodology uses the R-code called 'Clam' to perform age-depth modelling for palaeoecological records (in this case pollen records) and implements an adjusted version from the 'star classification system' presented in Giesecke et al. (2014). This star classification is displayed along a site's age model to indicate age uncertainty.

This document has been structured in two parts:

1) Outcomes from Flantua, Blaauw and Hooghiemstra (2016).

2) Setup of the programs and the scripts or "codes" to produce new age models with star classification outcome.

This is the Version I of this manual, uploaded January 2016. We will aim to update this manual when further improvements are needed. If you have any questions or comments, please don't hesitate to contact us. We would be happy to hear from you.

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## 1. Outcomes from Flantua, Blaauw and Hooghiemstra (2016).

1) From <u>https://figshare.com/s/0e9afb8fe758a0e6e8c8</u>, download the folder called Flantua\_ClimPast\_2016.zip.

This folder contains the original publication "Flantua, Blaauw, Hooghiemstra\_2016\_CP\_AgeModelling.pdf", the table with the list of sites used "LIST\_sites.xlsx", the literature list from these sites "LIST\_publications\_from\_sites.xlsx" and the folder "Cores" with the recalibrated age models from this paper and the corresponding folder with all the descriptions. The text file "script\_per\_agemodel\_FINAL" contains the parameters used for each age model in the R scripts.

Name	Туре	
Cores	File folder	
Descriptions age models	File folder	
🗾 Flantua,Blaauw, Hooghiemstra_2016_CP_AgeModelling.pdf	Adobe Acrobat Document	
LIST_publications_from_sites.xlsx	Microsoft Excel Worksheet	
🔊 LIST_sites.xlsx	Microsoft Excel Worksheet	
script_per_agemodel_FINAL.txt	Text Document	

Open "LIST\_sites.xlsx". The first column indicates the identification number that concurs with the numbers in the folder "Cores". The last column indicates the reference you will find in the file "LIST\_publications\_from\_sites.xlsx". In the latter, you will obtain the complete reference organized in alphabetic order.

1								
	A	В	С	D	E	F	G	Н
1	LAPD ID	NAME OF SITE	COUNTRY	LATITUDE (	LONGITUDE	YOUNGEST AG	OLDEST AGE (yr	PUBLICATION
2	292	Cala Conto	Bolivia	-17.57	-65.93	10000	36000	Graf ,1981; Graf ,1992
3	308	Cerro Calvario	Bolivia	-16.25	-68.50	4000	23300	Graf ,1992
4	309	Chacaltaya 1	Bolivia	-16.37	-68.15	0	7600	Graf ,1981; Graf ,1992
5	310	Chacaltaya 2	Bolivia	-16.37	-68.15	0	9800	Graf ,1981; Graf ,1992
6	311	Cotapampa	Bolivia	-15.22	-69.10	0	10900	Graf ,1981; Graf ,1992
7	312	Cumbre Unduavi	Bolivia	-16.35	-68.03	0	13600	Graf ,1981; Graf ,1992
8	333	Laguna Katantica	Bolivia	-14.80	-69.18	0	7500	Graf ,1981; Graf ,1992
9	336	Laguna Bella Vista A	Bolivia	-13.62	-61.55	1530	51000	Mayle et al ,2000; Burbridge et al ,2004
10	339	Laguna Chaplin A	Bolivia	-14.48	-61.07	0	50000	Mayle et al ,2000; Burbridge et al ,2004; Mayle et al ,2007
11	344	Laguna Khomer Kocha Upper	Bolivia	-17.28	-65.98	0	18100	Williams et al ,2011a
12	347	Laguna Yaguarú	Bolivia	-15.60	-63.22	0	5600	Taylor et al ,2010
13	348	Lake Chalalan	Bolivia	-14.43	-67.92	60	16000	Urrego et al ,2012
14	349	Lake Santa Rosa	Bolivia	-14.48	-67.87	2500	16000	Urrego et al ,2012
15	350	Lake Siberia 93-1	Bolivia	-17.83	-64.72	4500	40000	Mourguiart & Ledru ,2003
16	361	Monte Blanco 2	Bolivia	-17.03	-67.36	900	8300	Graf ,1981; Graf ,1992
17	378	Sajama 2	Bolivia	-18.12	-68.97	0	4400	Graf ,1992
18	381	Sajama Ice Cap 2	Bolivia	-18.10	-68.88	0	15000	Reese ,2003; Thompson et al ,1998; Reese et al ,2013





> Open the folder "Cores" in your file browser.

Here you will find for each core (analyzed pollen record) the age models as present in the "LIST sites.xlsx".

- > Open folder "0309\_CTY1". Here you find the folders of the different age models.
- Open folder "Run8". You will find the different files that served as input and the files that were produced as output. In the following Table 1 each file is explained in more detail. All .txt and .csv files can be opened in a plain-text editor such as WordPad.
- As you will see, each run will always have an age model produced by linear interpolation and in case that more than three control points were available (e.g. <sup>14</sup>C data points), also a smooth spline age model.

FILE NAME	EXPLANATION
0309_author_depths.csv	Csv (comma-separated value)-file with the sample
	depths.
0309_CTY1.csv (input)	'Control point file': File with the data on the control
	points (such as <sup>14</sup> C), error, reservoir, depth, thickness
	and RCode (Codes explained in Table 2). This is one
	of the basic files required to run 'Clam'.
0309_CTY1_depths.txt (input)	Text file with the sample depths. This is one of the
	basic files required to run 'Clam'.
0309_CTY1_calibrated.txt (output)	File with the calibrated age ranges at 95% confidence
	interval.
0309_CTY1_interpolated.pdf (output)	Generated age model based on interpolation, pdf
	format.
0309_CTY1_interpolated.png (output)	Generated age model based on interpolation, png
	format.
0309_CTY1_interpolated_ages.txt (output)	Calibrated ages for each sample depth based on
	interpolation. From left to right: depths, minimum
	calibrated age, maximum calibrated age, "best" age,
	estimated accumulation rate.
0309_CTY1_interpolated_settings.txt (output)	Parameters used to produce the interpolated age
	model, such as calibration curve used, modeling
	method and goodness-of-fit.

# Table 1. Age model files

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0309_CTY1_interpolated_stars.txt (output )	Outcome from the star classification system based on
	interpolation. From left to right: sample depth,
	[constant] star assigned when a segment is straight,
	[bad.extra] stars assigned when maximum distance to
	nearest date (yr) = 2000, [good.extra] max. distance to
	nearest date (yr) = 1000, [best.extra] max. distance to
	nearest date (yr) = 500, [stars] total number of stars.
0309_CTY1_old.csv	Reference file indicating depths and control points with
	top (TOP) and bottom (BOT).
0309_CTY1_smooth_spline.pdf (output)	Generated age model based on smooth spline, pdf
	format.
0309_CTY1_smooth_spline.png (output)	Generated age model based on smooth spline, png
	format.
0309_CTY1_smooth_spline_ages.txt (output)	Calibrated ages for each sample depth based on
	smooth spline. From left to right: depths, minimum
	calibrated age, maximum calibrated age, "best" age,
	estimated accumulation rate.
0309_CTY1_smooth_spline_settings.txt	Parameters used to produce the smooth spline age
(output)	model, such as calibration curve used, modeling
	method and goodness-of-fit.
0309_CTY1_smooth_spline_stars.txt (output)	Outcome from the star classification system based on
	smooth spline. From left to right: sample depth,
	[constant] star assigned when at straight segment,
	[bad.extra] stars assigned when maximum distance to
	nearest date (yr) = 2000, [good.extra] max. distance to
	nearest date (yr) = 1000, [best.extra] max. distance to
	nearest date (yr) = 500, [stars] total number of stars.
0309_CTY1_smoothspline.pdf (output)	Generated age model based on smooth spline with the
	star classification result plotted along the vertical axis,
	pdf format.



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RCODE	DESCRIPTION
PB2	210Pb
C14	Carbon-14 or Carbon-14: AMS
BEN	Compared with benthic oxygen isotope data
BOT_C	Core base estimated
BOT_A	Core base known
BOT_U	Core base unknown
TOP_C	Core top estimated
TOP_A	Core top known
TOP_U	Core top unknown
Fision	Fission track
LS	Liquid scintillation
TEF	Tephra
TL	TL-date
U238	Uranium series
DER	Age derived from known event

Table 2	Description	of "RCode" in	control	noint file
I able z	. Description			point me

## Descriptions of the original and recalibrated age models (folder "Descriptions age models")

As mentioned previously, each document provides the metadata of the pollen record (site name and original publications), important observations on the original age model, and the newly calibrated age model by Flantua, Blaauw and Hooghiemstra (2016). We did not include figures and tables from the original age models due to copyright issues, but this information has been collected as well for comparison. The document furthermore mentions if an original depths file was available (the exact depths at which samples were taken) or if depths were derived from the original publications. For each record different age models were created to compare the effect of including e.g. an outlier, a hiatus and/or estimated top age. In the description there will be an explanation of the 'runs'<sup>1</sup> executed and the differences between them in terms of the used parameters The last model in consecutive order (e.g. run 9 vs run 8) is generally the one considered with the best fit. The outcomes are all found in the corresponding folders of the records in the folder 'Cores' within the folder "Flantua\_ClimPast\_2016" and the text file "script\_per\_agemodel\_FINAL" includes the parameters for each age model as used in R (explained later on in this manual).

<sup>&</sup>lt;sup>1</sup> With a 'run' is meant the execution of the R codes presented in this manual.



# 2. Setup of the programs and codes.

Here we will explain the basics of running Clam to make an age model for your own record and how to obtain the star classification output alongside.

#### **Required** programs

R: You need to have installed a recent version of the free open-source statistical software R (R Core Team, 2015). This program is needed to run the different codes from this manual. To obtain the latest version of R, please access <u>https://www.r-project.org/</u>. R runs on a wide range of operating systems including Windows and Mac. Install the program as you would with any other program.

2) **Clam.R:** Clam is a code that will run in **R**. Therefore, it has the extension ".R". With this code you will be able to perform 'classical' age-depth modelling (Blaauw, 2010), which is different to the flexible Bayesian age-depth modelling performed by the code called Bacon (Blaauw and Christen, 2011). Here we only use Clam. To obtain the latest version of Clam, go to <u>http://chrono.qub.ac.uk/blaauw/Clam.html</u> There you will also find the extensive version of the manual on Clam.

3) **StarClassification\_AgeModels.R**: This is also an R-code and in this case needed to perform the star classification system on the age models.

## Install programs

1) From the figshare link <u>https://figshare.com/s/0e9afb8fe758a0e6e8c8</u>, download the file called **Clam\_Stars.zip**. Unzip to somewhere on your computer where you have write access (e.g. d:\Clam\_Stars).

2) In this folder you will find three R-codes and the different calibration curves available to create age models. The calibration curves are in a format "14C file". Furthermore there is a folder called 'Cores' that contains two examples to run the scripts before preparing your own data. This folder contains the different files needed to run the age model, such as the <sup>14</sup>C data and sample depths (See the 'input' files in Table 1). This will be explained in further detail in the next section.





Name	Туре	Size
🐌 Cores	File folder	
StarClassification_AgeModels.R	R File	6 KB
Script_per_AgeModel.R	R File	1 KB
clam.R	R File	63 KB
SHCal13.14C	14C File	72 KB
SHCal04.14C	14C File	30 KB
postbomb_SH3.14C	14C File	8 KB
postbomb_SH1-2.14C	14C File	10 KB
postbomb_SH.14C	14C File	15 KB
postbomb_NH3.14C	14C File	8 KB
postbomb_NH2.14C	14C File	9 KB
postbomb_NH1.14C	14C File	10 KB
Marine13.14C	14C File	67 KB
Marine09.14C	14C File	54 KB
IntCal13.14C	14C File	72 KB
IntCal09.14C	14C File	52 KB

# How to access and run the codes

- > Open **R**
- > Change the working directory to the Clam\_Stars folder (e.g. d:\Clam\_Stars).
- > Load the R-code Clam so to enter the age modelling program as followed:
  - Write: source ("Clam.R")
  - o Enter
  - Output: > "Hi there, welcome to Clam for age-depth modelling."
- To run the star classification system, you have to load the R-code called 'StarClassification\_AgeModels.R'
  - Write: source ("StarClassification\_AgeModels.R")
  - o Enter
  - $\circ$   $\,$  No output will be shown, but the code is now loaded.
- *R* is now ready to use Clam to create an age model and to implement the star classification system to define age uncertainty for each sample.





# Note

The R codes and the 'Cores' folder always need to be organized together as shown in the figure above and names of files and folders should not be changed.

In the Clam\_Stars folder there is a R-code called "Script\_per\_AgeModel.R". You can open this code in RStudio or with the program Notepad. You will see two commands starting with "Agemodel.stars", then the identification of the core (e.g. "0309\_CTY1") and what follows are the parameters to define additional features of the age model. In this case: Agemodel.stars("0309\_CTY1", cc=3, smooth=0.3

Here below we first explain the parameters we have been using for the age models, e.g. type of calibration curve, outliers and hiatus.

## Parameters to define your age model

For each age model you want to create, you need to specify the parameters. For several parameters, there is already a default value defined in Clam (see the manual of Clam for additional information on these default values: <u>http://chrono.qub.ac.uk/blaauw/Clam.html</u>).

#### Calibration curves

To define which calibration curve needs to be implemented, the term 'cc' is used e.g. Agemodel.stars("0893\_FUQ3", cc=1). By default the northern hemisphere terrestrial calibration curve is used (Table 3). To use alternative curves, change the value of 'cc' to the number of the desired calibration curve (e.g. cc=2).

Table 3. Calibration curves and number

Calibration curve	Number
IntCal13.14C	1
Marine13.14C	2
SHCal13.14C	3

#### Postbomb calibration curve

Negative radiocarbon ages are calibrated using postbomb curves and the user needs to inform Clam which curve to use. If no postbomb option is provided for cores with negative radiocarbon ages, Clam will not



produce an age-depth model. To know which postbomb calibration curve to use (Table 4), there is a world map presented in Hua et al. (2013). When the appropriate postbomb curve is identified, this can be specified in the R-code "script\_per\_agemodel.R" by the expression 'postbomb', e.g. Agemodel.stars("0394\_TQMA", cc=3, postbomb=5). In this example, postbomb curve SH3.14C is used.

Table 4. Postbomb calibration curves and number

Postbomb calibration curve	Number
postbomb_NH1.14C	1
postbomb_NH2.14C	2
postbomb_NH3.14C	3
postbomb_SH1-2.14C	4
postbomb_SH3.14C	5

#### Hiatus

A core can have a hiatus (a missing section in the core) at a certain depth or even multiple ones. In some cases this can be important to include in the age depth model. The expression 'hiatus' is used as followed: 'hiatus=470' meaning that there is hiatus at 470 cm depth, or in case of multiple ones: 'hiatus = c(470,600)' (hiatus at 470 cm and 600 cm depth). In "script\_per\_agemodel.R" it will look like this: Agemodel.stars("0907 JOTAR", cc=1, postbomb=2, hiatus=c(410))

#### Slump

A slump can occur when a mass movement of sediment is introduced into the record. On some cases this can be important to include in the age depth model. For the expression 'slump' you need to define the upper and lower depths, e.g. slump=c(470,600) when there is a slump at 470 cm depth, or in case of multiple ones: 'slump = c(80,100,470,600)' (slump between 80 cm and 100 cm depth, and between 470 and 600). In "script\_per\_agemodel.R" it will look like this: Agemodel.stars("0875\_BOSQ1", cc=1, slump=c(72,90)).

### **Outliers**

Control dates may be considered as outliers due to recent contamination or mixing of sediment, among others. The outliers are marked in **Clam** by the expression 'outliers' and their position within the control



point file should be indicated counting from the top of the sequence. For example, in case that the second date in 0309\_CTY1.csv (input) would be the outlier (3095 14C yr), then the expression in "script\_per\_agemodel.R" will become: Agemodel.stars("0309\_CTY1", cc=3, outliers=c(2)).

## Smoothness of smooth spline age model

The R-code to implement the star classification system will always try to produce two types of age models. The linear interpolation or regression needs at least two control points and the smooth spline at least four data points. The smoothness of the smooth spline can be adjusted by using the expression "smooth". The default value is 0.3. To produce an age model with a "stiffer" smoothness (for example to avoid age reversals) higher values should be used, e.g. smooth=0.5. For a more flexible smooth spline (for example to better "fit" dispersed dates), lower values can be used, e.g. smooth=0.15. In "script\_per\_agemodel.R" it will look like this: Agemodel.stars("0333\_LKAT", cc=3, smooth=0.22).

# Organizing the input file

Within the folder 'Cores' you will find two folders from two different records, namely 0309\_CTY1 and 0310\_CTY2.

Name	Туре
퉬 0309_CTY1	File folder
0310_CTY2	File folder

Within each folder you will find two input files that start with exactly the same name as the folder. This is very important that the name of the folder is EXACTLY the same as the files within the folder, or else clam will give you an error and will not produce any age model. The two files in each folder are the two necessary input files as described in Table 1.

# The input files

- 1) The 'Control point file': File with the data on the control points and corresponding information.
- 2) Depth-file. The file with the depths at which samples were taken.

# How to make a Control point file:

- 1) Open *Excel* to make the control point file.
- 2) This file has 8 columns of information of which 7 are read by Clam.

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#### Table 5. Postbomb calibration curves and number

	HEADER	INFORMATION
1	ID	Identification codes of each control points, such as laboratory code. Both letters
		and numbers may be used.
2	C14_age	Uncalibrated age of control point, such as the 14C age or the tephra age as
		measured by the laboratory. Units are in years before present.
3	Cal_BP	This column is most often left open because Clam calculates the calibrated
		ages itself. This column can be used if you want to include the estimated top or
		bottom age, for example by "0" or "-60" to indicate that top section is 'recent'.
		Only provide a year before present (cal yr BP), because text characters, e.g.,
		"AD 1900" or "1900-1950" for a calendar age cause problems.
4	error	Error of the uncalibrated age of control point, e.g. "150" for 150 years. Errors
		should always be greater than 0.
5	reservoir	If the age offset due to the reservoir effect is known, then include here.
6	depth	Depth as which the control point is taken. Units are in cm, e.g. "28" for 28 cm.
		This column should never be left open.
7	thickness	The thickness of the sample to derive the control point, e.g. "5" for 5 cm. The
		default thickness is 1 cm and will obtain this value when this column is left
		open.
8	RCode	(optional) An additional column used to include a code on the control point,
		such as 14C for a $^{14}$ C date, TOP_C for an estimated top age, or TEF for a
		tephra age. Additional options are shown in Table 2.

Notes:

- Name the columns exactly in the same order and with the same name as described in Table 5.
- > Order the dates according to their depths, starting with the highest dates and working downwards.
- > Do not use commas as decimals separators but dots.
- This file should be in csv-format. Use the function "Save as" to replace the Excel file (in case you use Excel) by csv.
- The .csv file can be opened in a plain-text editor such as WordPad or NotePad to quickly check for and correct any errors (e.g. removing empty rows with lots of commas).

File name: 0309\_CTY1

Save as type: Excel Workbook (\*.xlsx) Click "Save as type" and look for "CSV (Comma delimited) (\*.csv)"





Excel Workbook (\*.xlsx) Excel Macro-Enabled Workbook (\*.xlsm) Excel Binary Workbook (\*.xlsb) Excel 97-2003 Workbook (\*.xls) XML Data (\*.xml) Single File Web Page (\*.mht;\*.mhtml) Web Page (\*.htm;\*.html) Excel Template (\*.xltx) Excel Macro-Enabled Template (\*.xltm) Excel 97-2003 Template (\*.xlt) Text (Tab delimited) (\*.txt) Unicode Text (\*.txt) XML Spreadsheet 2003 (\*.xml) Microsoft Excel 5.0/95 Workbook (\*.xls) CSV (Comma delimited) (\*.cs Formatted Text (Space delimited) (\*.prn) Text (Macintosh) (\*.txt) Text (MS-DOS) (\*.txt) CSV (Macintosh) (\*.csv) CSV (MS-DOS) (\*.csv) DIF (Data Interchange Format) (\*.dif) SYLK (Symbolic Link) (\*.slk) Excel Add-In (\*.xlam) Excel 97-2003 Add-In (\*.xla) PDF (\*.pdf) XPS Document (\*.xps) OpenDocument Spreadsheet (\*.ods) Excel Workbook (\*.xlsx)

## Depth file:

This file is a simple text file that should only have the list of depths in cm at which samples were taken. Do not include a header like "depths (cm)", only the values of the depths. This file should have exactly the same name as the folder including "\_depths".

# Organization of the folders and files

Make sure that you have everything organized as shown in the folder 'Clam\_stars'. This means having the 14C files together with the R files and the folder 'Cores' with the folder with your site information.

Name	Ŧ	Туре
🐌 Cores		File folder
StarClassification_AgeModels.R		R File
script_per_agemodel.R		R File
clam.R		R File
SHCal13.14C		14C File
SHCal04.14C		14C File
postbomb_SH3.14C		14C File
postbomb_SH1-2.14C		14C File
postbomb_SH.14C		14C File
postbomb_NH3.14C		14C File
postbomb_NH2.14C		14C File
postbomb_NH1.14C		14C File
Marine13.14C		14C File
Marine09.14C		14C File
IntCal13.14C		14C File
IntCal09.14C		14C File



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## To run clam and the star classification system for ONE age model

When you are ready with defining your parameters and you have your folders ready, let's say in this case Agemodel.stars("0310 CTY2", cc=3, smooth=0.2), you can past this directly into R Console (where you write your commands where the > symbol is). By pressing 'Enter', clam.R and StarClassification\_AgeModels.R will run and produce the output within the folder you have destined to your record, in this case folder "0310 CTY2". All output files as specified in Table 1 will be produced.

## To run clam and the star classification system for MANY age models

For running many age models at a time, it's useful if you use a R-code where the parameters from each record are joined and clam will run through all of them to produce age models. For this purpose, the file "script\_per\_agemodel.R" can be used to run several age models at a time.

In this example, the file "script\_per\_agemodel.R" contains the commands for two records, 0309\_CTY1 and 0310\_CTY10.

- To tell Clam that it needs to read the R-code "script\_per\_agemodel":
  - Write in R Console: source "script\_per\_agemodel.R"
  - Output: Each core folder will now contain the age models with the star classification output (see Table 1).

## For your own age models:

You can paste the commands for each separate age model directly in script\_per\_agemodel.R (e.g. if you have it open in RStudio. Don't forget to save!) or you can use Notepad to make adjustments and then save back to an R-file. When you used Notepad, simply save "script\_per\_agemodel.R" as text. Now change the extension (e.g. by using Windows Explorer) from ".txt" to ".R", to convert it into a R file. Now the file is ready to be read by Clam.

#### NOTE:

Each time you run Clam reading the "script\_per\_agemodel.R" file, the files within the folder 'Cores' will be overwritten. So all the output files from Table 1 will be overwritten. If you would like to save those output files, move the output files to another folder but take care that you leave the input files for Clam to read.





# **REFERENCES**

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