

# DateLife Workflows

Luna L. Sanchez Reyes

2019-05-09

## Taxon Cetacea

### 1. Query source chronograms

There are 198 species in the Open Tree of Life Taxonomy for the taxon Cetacea. Information on time of divergence is available for 89 of these species across 6 published and peer-reviewed chronograms. Original study citations as well as number of Cetacea species found across those source chronograms is shown in Table 1.

Table 1: Cetacea source chronogram studies information.

	<i>Citation</i>	<i>Source N</i>	<i>Taxon N</i>
1.	Bininda-Emonds, Olaf R. P., Marcel Cardillo, Kate E. Jones, Ross D. E. MacPhee, Robin M. D. Beck, Richard Grenyer, Samantha A. Price, Rutger A. Vos, John L. Gittleman, Andy Purvis. 2007. The delayed rise of present-day mammals. <i>Nature</i> 446 (7135): 507-512	3	78/198
2.	Hedges, S. Blair, Julie Marin, Michael Suleski, Madeline Paymer, Sudhir Kumar. 2015. Tree of life reveals clock-like speciation and diversification. <i>Molecular Biology and Evolution</i> 32 (4): 835-845	1	79/198
3.	Steeman, M., Hebsgaard M., Fordyce R., Ho S., Rabosky D., Nielsen R., Rahbek C., Glenner H., Sørensen M., & Willerslev E. 2009. Radiation of Extant Cetaceans Driven by Restructuring of the Oceans. <i>Systematic Biology</i> 58 (6): 573-585.	1	86/198
4.	Toljag & O., Voje K.L., Matschiner M., Liow L., & Hansen T.F. 2017. Millions of Years Behind: Slow Adaptation of Ruminants to Grasslands. <i>Systematic Biology</i> , .	1	32/198

*Source N*: Number of source chronograms reported in study.

*Taxon N*: Number of queried taxa found in source chronograms.

All source chronograms are fully ultrametric and their maximum ages range from 33.5 to 55.5 million years ago (MYA). As a means for comparison, lineage through time plots of all source chronograms available in data base are shown in Fig. 1

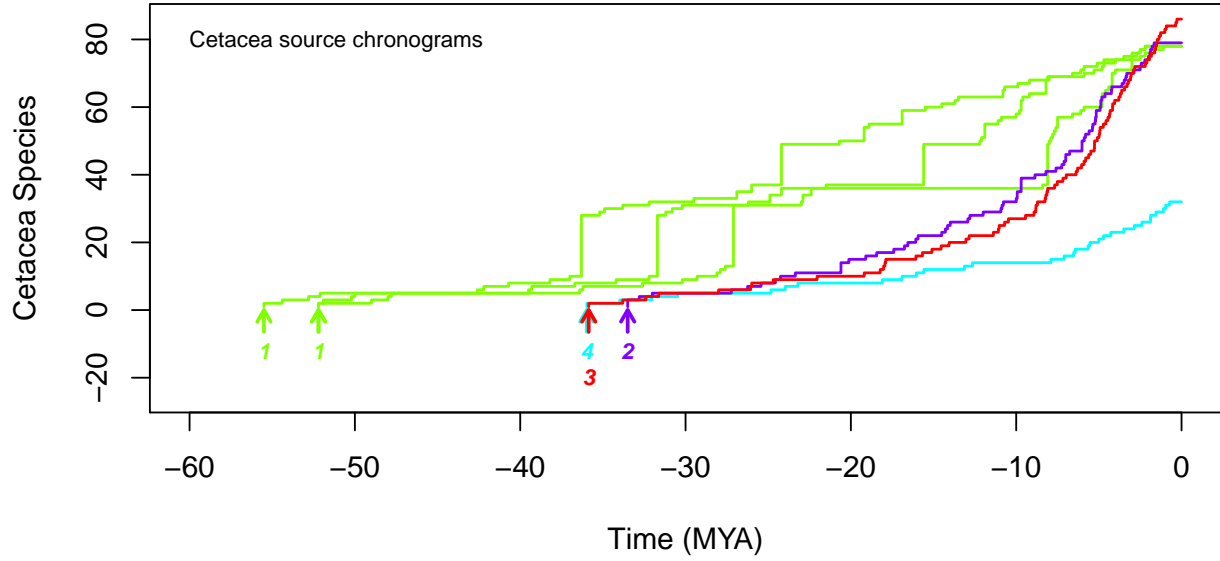


Figure 1: Lineage through time (LTT) plots of source chronograms available in data base for species in the Cetacea. Numbers correspond to original studies in Table 1. Arrows indicate maximum age of each chronogram.

## 2. Summarize results from query

LTT plots are a nice way to visually compare several trees. But what if you want to summarize information from all source chronograms into a single summary chronogram?

The first step is to identify the degree of species overlap among your source chornograms: if each source chronogram has a unique sample of species, it will not be possible to combine them into a single summary chronogram. To identify the set of trees or *grove* with the most source chronograms that have at least two overlapping taxa, we followed Ané et al. 2016. In this case, not all source chronograms found for the Cetacea have at least two overlapping species. The largest grove has 2 chronograms (out of 6 total source chronograms).

Now that we have identified a grove we can go on to summarize it by translating the source chronograms into patristic distance matrices and then averaging them into a single summary matrix; yes, this first step is *that* straightforward. We can average the source matrices by simply using the mean or median distances, or we can use methods that involve transforming the original distance matrices –such as the super distance matrix (SDM) approach of Criscuolo et al. 2006– by minimizing the distances across source matrices. As a result of such transformation, an SDM summary matrix can contain negative values. In this case, the SDM summary matrix has some negative values in the following taxa: *Eubalaena japonica*, *Eubalaena glacialis*.

Because our summary matrix is basically a distance matrix, a distance-based clustering algorithm could be used to reconstruct the tree. Algorithms such as neighbour joining (NJ) and unweighted pair group method with arithmetic mean (UPGMA) are fast and work very well when there are no missing values in the matrices. However, summary matrices coming from source chronograms usually have several NAs and missing rows. When this happens, variants of traditional clustering algorithms have been developed to deal with missing values. However, even these methods do not work well with our summary matrices, as shown in the following section. We should note that these clustering methods are usually applied to distance matrices representing substitution rates and not absolute time.

## 2.1. Clustering a summary matrix

NJ, UPGMA, BIONJ, minimum variance reduction (MVR) and the triangle method (TM) algorithms were used to cluster median and SDM summary distance matrices. All clustering algorithms returned very similar trees with both types of summary matrices (Fig. 2, Appendix Fig. 5). UPGMA is the only algorithm that returns ultrametric trees, but they are considerably older than expected from source chronograms. The other methods returned trees with reasonable ages, but that are not ultrametric.

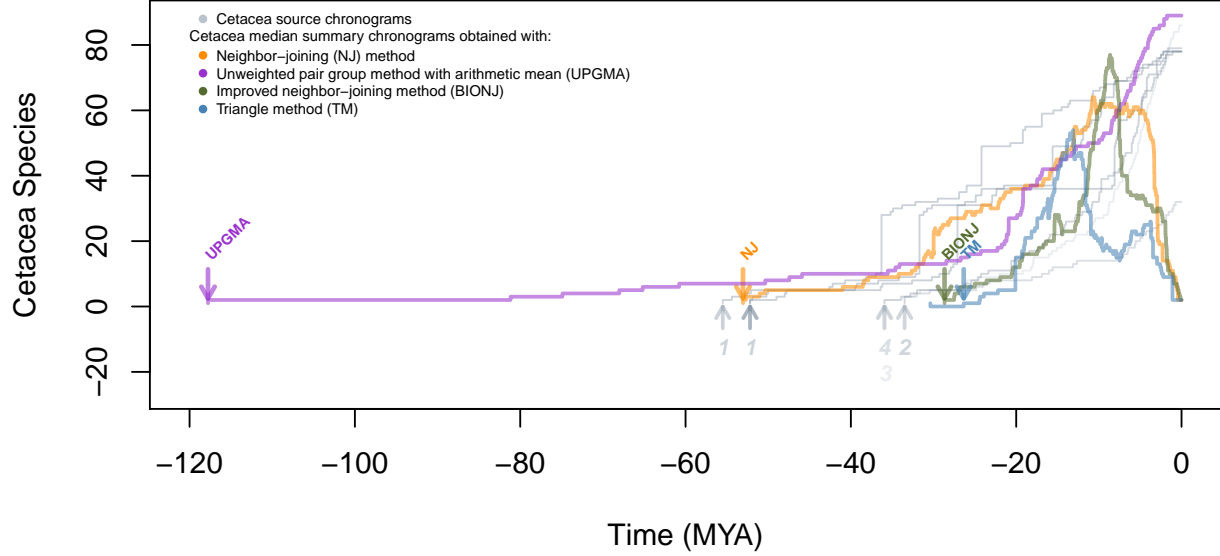


Figure 2: Lineage Through Time plots of Cetacea median summary chronograms obtained with different clustering algorithms. Not all algorithms worked with this summary matrix and we are only showing here the ones that worked. Chronograms obtained from the SDM summary matrix are very similar to the ones from the median summary matrix with all clustering algorithms (Appendix Fig. 5).

An alternative to clustering algorithms is to use all data available in the summary matrix as calibrations over a consensus tree. The advantage of this is that we can get a distribution of ages for the nodes and that we can essentially use this summary matrix to date any topology containing at least some of the nodes, as shown in the **Create new data** section.

## 2.2. Calibrating a consensus tree with data from a summary matrix

Even if the branch lengths coming from the clustered chronograms are not adequate, the topology can still be used as a consensus tree of the taxa with time data available. Then, a list of divergence times available for each node can be constructed from the summary matrix, simply by matching it to the node that corresponds to each pair of taxa in any given tree. Finally, the list and consensus tree can be fed to any dating software that does not require data. The branch length aduster (BLADJ) algorithm [Webb2000] is really fast and does not make any evolutionary assumptions on age distribution. Other software such as MrBayes or r8s can be used without data instead of BLADJ. In here, we show summary chronograms obtained with BLADJ, using minimum, mean and maximum distances (from node age summary matrices) as fixed ages on the consensus tree (Fig. 3). Chronograms from both types of summary matrices are quite similar. As expected, SDM chronograms using minimum, mean and maximum distances do not vary much in their maximum age, because ages are transformed to minimize variance across them. In contrast, median chronogram obtained with minimum, mean and maximum distances have wider variation in their maximum ages, as can be observed from the separation between green arrows in Fig. 3.

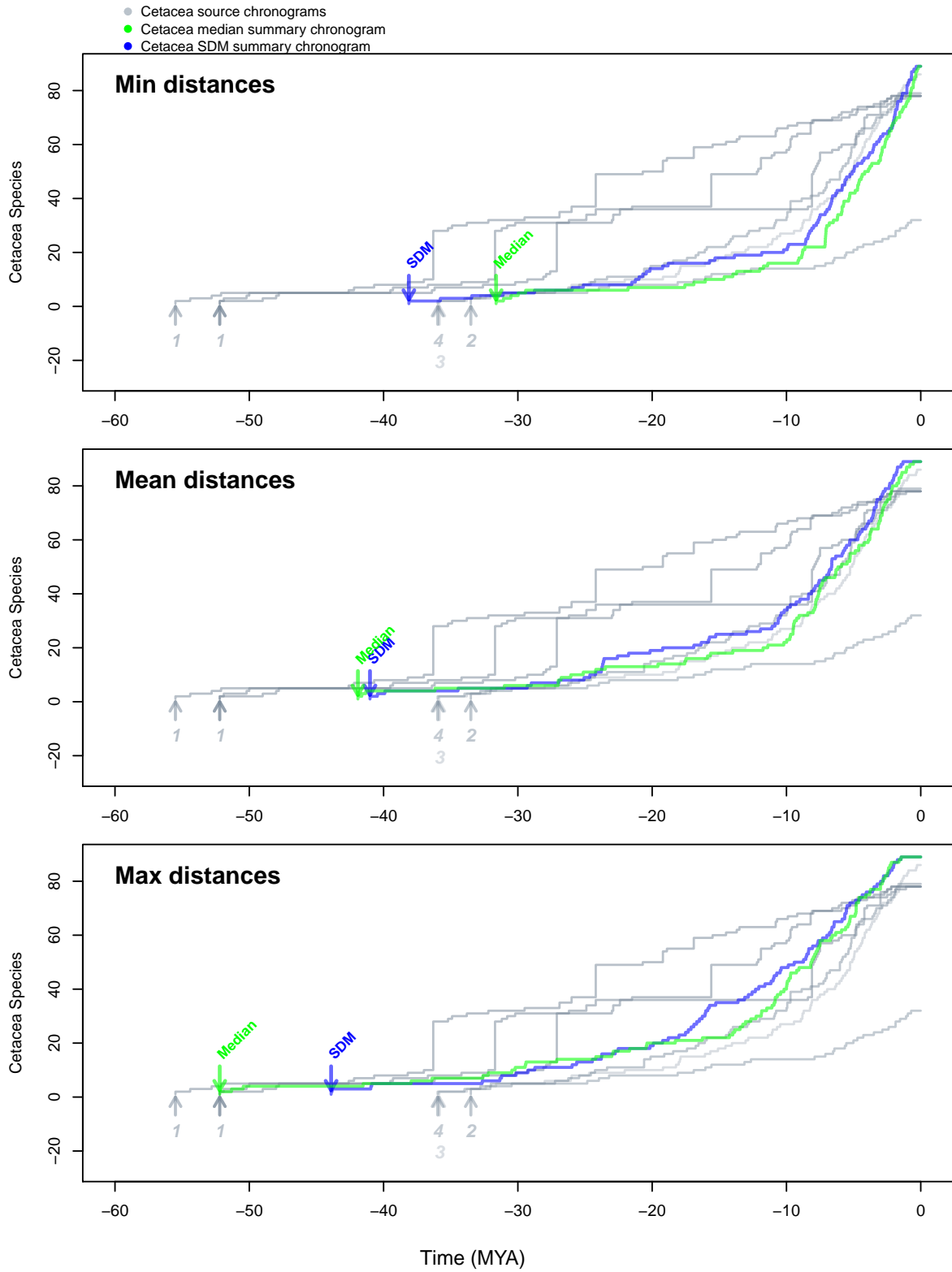


Figure 3: Cetacea lineage through time (LTT) plots from source chronograms (gray), median (green) and SDM (blue) summary chronograms obtained by calibrating a consensus tree topology with distance data from respective summary matrices and then adjusting branch lengths with BLADJ.

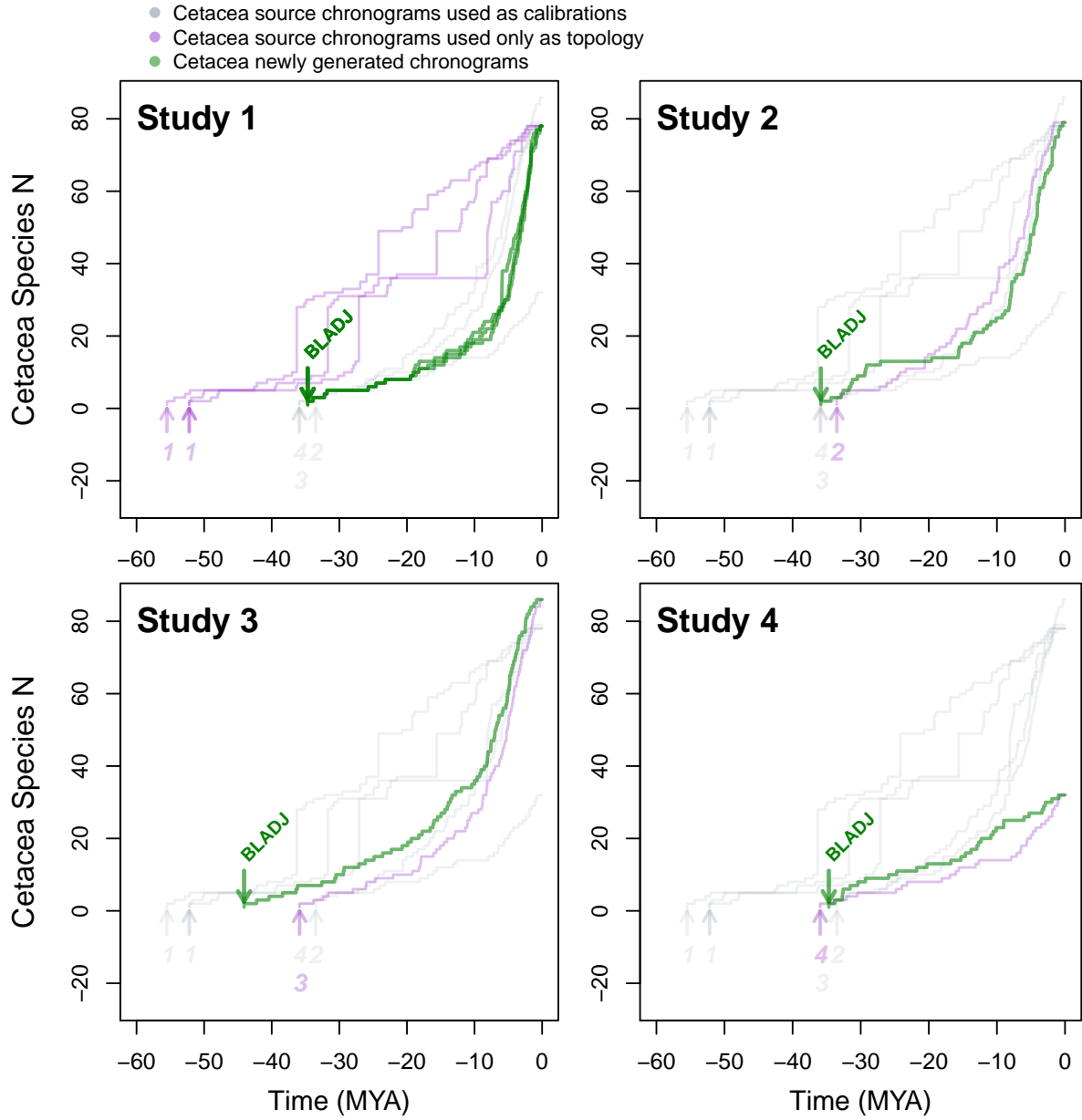


Figure 4: Cetacea lineage through time (LTT) plots from source chronograms used as secondary calibrations (gray), source chronograms used as topology (green) and chronograms resulting from calibrating the latter with the former using BLADJ.

Table 2: Was it successful to use each source chronogram independently as calibration (CalibN) against the Dated Open Tree of Life (dOToL) and each other (ChronoN)?

	dOToL	Chrono1	Chrono2	Chrono3	Chrono4	Chrono5	Chrono6
Calibrations1	TRUE	TRUE	FALSE	FALSE	FALSE	TRUE	TRUE
Calibrations2	TRUE	TRUE	FALSE	FALSE	FALSE	TRUE	TRUE
Calibrations3	TRUE	TRUE	FALSE	FALSE	FALSE	TRUE	TRUE
Calibrations4	TRUE	TRUE	FALSE	FALSE	FALSE	TRUE	TRUE
Calibrations5	TRUE	TRUE	FALSE	FALSE	FALSE	TRUE	TRUE
Calibrations6	TRUE	TRUE	FALSE	FALSE	FALSE	TRUE	TRUE

### 3. Generate new chronograms.

Another way to leverage information from the source chronograms is to use the node ages as secondary calibration points to date any tree topology (with or without branch lengths) given that at least two taxa from source chronograms are in the tips of that topology. In this data set, we have 425 calibrations in total (that basically correspond to the sum of the number of nodes in each source chronogram). Once we have a target tree topology, we can map the calibrations to the target tree. Some nodes will have several calibrations and some others might have none. To deal with this, we can expand the calibrations to make them agree, or we can summarize them. To exemplify each method we performed a series of cross validation analyses by using the information from all other source chronograms to date the topology of source chronograms from each study

#### 3.1. Calibrate a tree without branch lengths

#### 3.2. Calibrate a tree with data (from BOLD).

#### 4.1. Expanding calibrations

show cross validation of LTTs from chronograms obtained by dating the topology of each study with data from any other study.

#### 4.2. Summarizing calibrations

#### 4.3. Example with subspecies tree

As an example, we're gonna date the subspecies tree of the group (coming from otol).

Now, let's say you like the Open Tree of Life Taxonomy and you want to stick to that tree. Dates from available studies were tested over the Open Tree of Life Synthetic tree of Cetacea and a tree was constructed, but all branch lengths are NA. We also tried each source chronogram independently, with the Dated OToL and with each other, as a form of cross validation in Table 2. This is not working perfectly yet, but we are developing new ways to use all calibrations efficiently.

#### **4. Simulate data/ Add missing taxa**

An alternative to generate a dated tree from a set of taxa is to take the available information and simulate into it the missing data. We will take the median and sdm summary chronograms to date the Synthetic tree of Life:

## References

## Appendix

The following species were completely absent from the chronogram data base: *Amphiptera pacifica*, *Balaena agamachschik*, *Balaena mangidach*, *Balaenoptera andrejewi*, *Balaenoptera caerulea*, *Balaenoptera emarginata*, *Balaenoptera grimmii*, *Balaenoptera maculata*, *Balaenoptera nigra*, *Balaenoptera punctulata*, *Catodon polycyphus*, *Catodon polycyphus*, *Catodon svineval*, *Cephalorhynchus commersonii*, *Cephalorhynchus heavisidii*, *Clymenia gadamu*, *Delphinapterus senedetta*, *Delphinorhynchus maculatus*, *Delphinorhynchus pernettyi*, *Delphinorhynchus santonicus*, *Delphinus abusalam*, *Delphinus anarnacus*, *Delphinus attenuatus*, *Delphinus bertini*, *Delphinus bonnaterrei*, *Delphinus boryi*, *Delphinus caerulea*, *Delphinus carbonarius*, *Delphinus coronatus*, *Delphinus cymodice*, *Delphinus cymodoce*, *Delphinus epiodon*, *Delphinus eurynome*, *Delphinus fabricii*, *Delphinus feres*, *Delphinus gadamu*, *Delphinus hamatus*, *Delphinus harlani*, *Delphinus leucocephalus*, *Delphinus livittatus*, *Delphinus maculatus*, *Delphinus maculiventer*, *Delphinus minimus*, *Delphinus nesarnac*, *Delphinus niger*, *Delphinus pernettyensis*, *Delphinus pernettyi*, *Delphinus perniger*, *Delphinus rappii*, *Delphinus rhinoceros*, *Delphinus salam*, *Delphinus siculus*, *Delphinus symodice*, *Delphinus walkeri*, *Epiodon rafinesque*, *Epiodon urganantus*, *Eudelphinus tasmaniensis*, *Globicephala macrorhynchus*, *Globicephalus fuscus*, *Globicephalus unedens*, *Globiocephalus chinensis*, *Inia araguaiaensis*, *Inia boliviensis*, *Lagenodelphis australis*, *Lagenodelphis obliquidens*, *Lagenodelphis hosei*, *Lagenorhynchus bombifrons*, *Lagenorhynchus nilssonii*, *Lagenorhynchus posidonia*, *Lagenorhynchus superciliosus*, *Lagenorhynchus acutus*, *Lagenorhynchus albirostris*, *Lagenorhynchus australis*, *Lagenorhynchus cruciger*, *Lagenorhynchus obliquidens*, *Lagenorhynchus obscurus*, *Mesoplodon hotaula*, *Mesoplodon lazdarii*, *Monodon spurius*, *Neophocaena asiaorientalis*, *Phocaena posidonia*, *Physeter gibbosus*, *Physeter katadon*, *Physeter krefftii*, *Physeter polycephalus*, *Physeter polycystus*, *Physeter pterodon*, *Platanista indi*, *Prodelphinus malayanus*, *Sotalia gadamu*, *Sotalia maculiventer*, *Sotalia perniger*, *Sotalia santonicus*, *Sousa gadamu*, *Sousa plumbea*, *Sousa sahilensis*, *Steno fuscus*, *Steno gadamu*, *Steno malayanus*, *Steno perniger*, *Tursio catalania*, *Tursio cymodoce*, *Tursio eurynome*, *Tursiops australis*, *Tursiops catalania*, *Tursiops cymodice*, *Tursiops dawsoni*, *Tursiops fergusonii*, *Tursiops nesarnack*

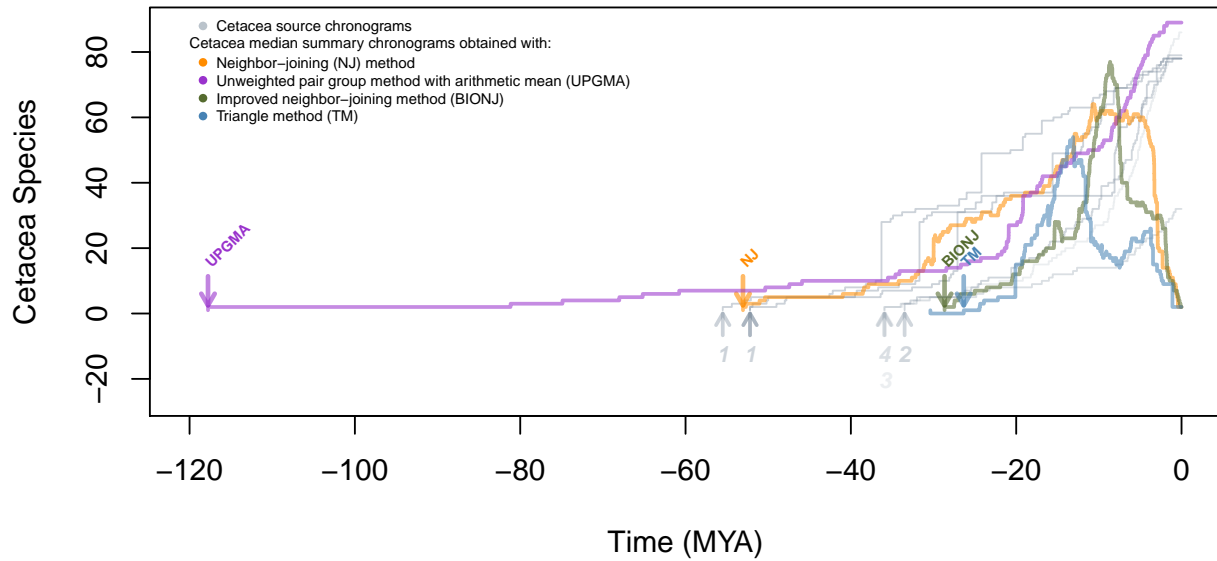


Figure 5: Lineage Through Time plots of Cetacea SDM summary chronograms obtained with different clustering algorithms. Not all algorithms worked with the SDM summary matrix and we are only showing here the ones that worked. Chronograms obtained from the median summary matrix are very similar to the ones shown here with all algorithms (mainFig. 2).

This taxon's SDM matrix has some negative values in the following taxa: *Eubalaena japonica*, *Eubalaena glacialis*. This taxon's Median matrix has NO negative values.



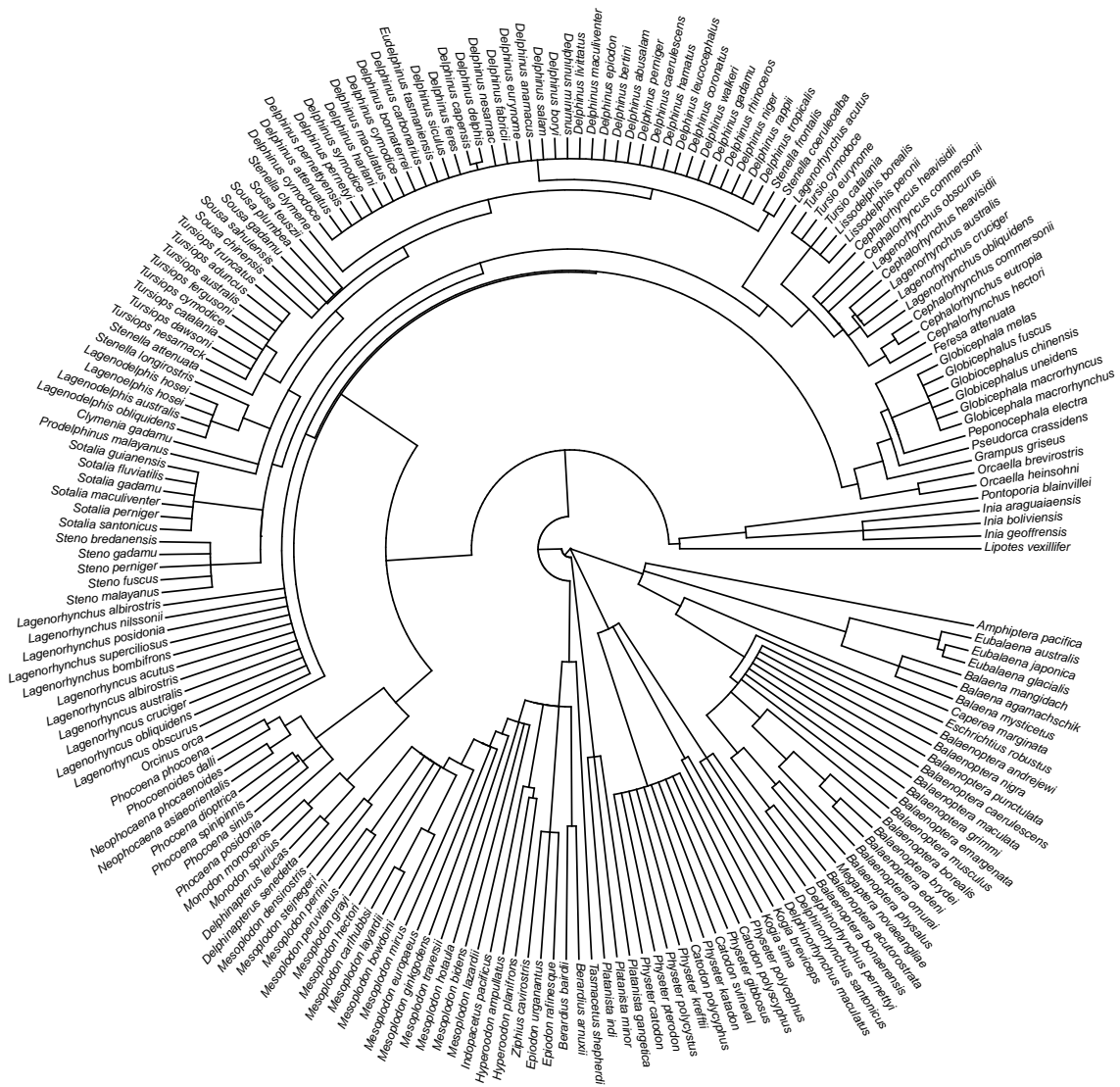


Figure 6: Cetacea Species Dated Open Tree of Life Induced Subtree. This chronogram was obtained with `get_dated_otol_induced_subtree()` function.

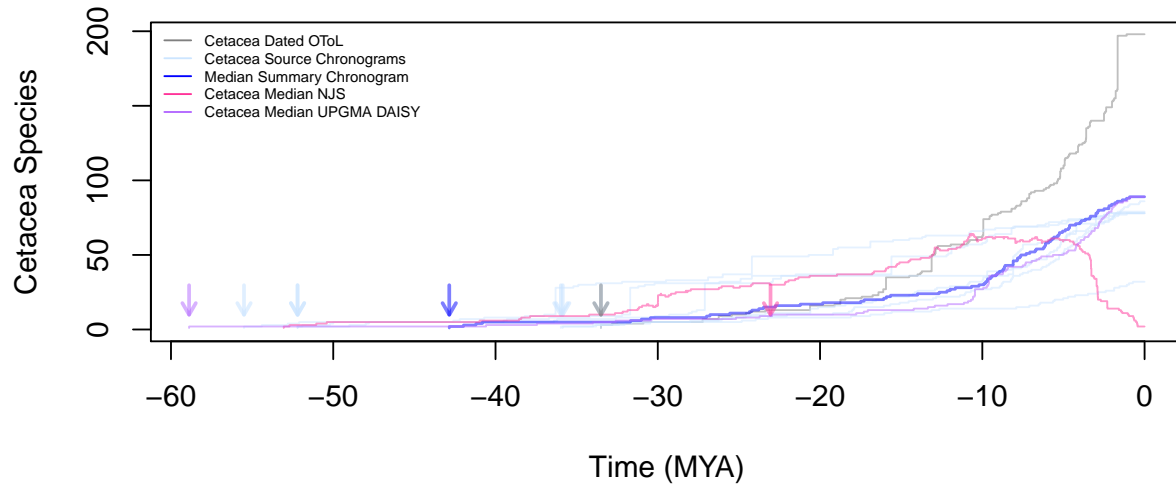


Figure 7: Cetacea lineage through time (LTT) plots from source chronograms and Median summary matrix converted to phylo with different methods (NJ and UPGMA). Clustering algorithms used often are returning non-ultrametric trees or with maximum ages that are just off (too old or too young). So we developed an alternative algorithm in `datelife` to go from a summary matrix to a fully ultrametric tree.

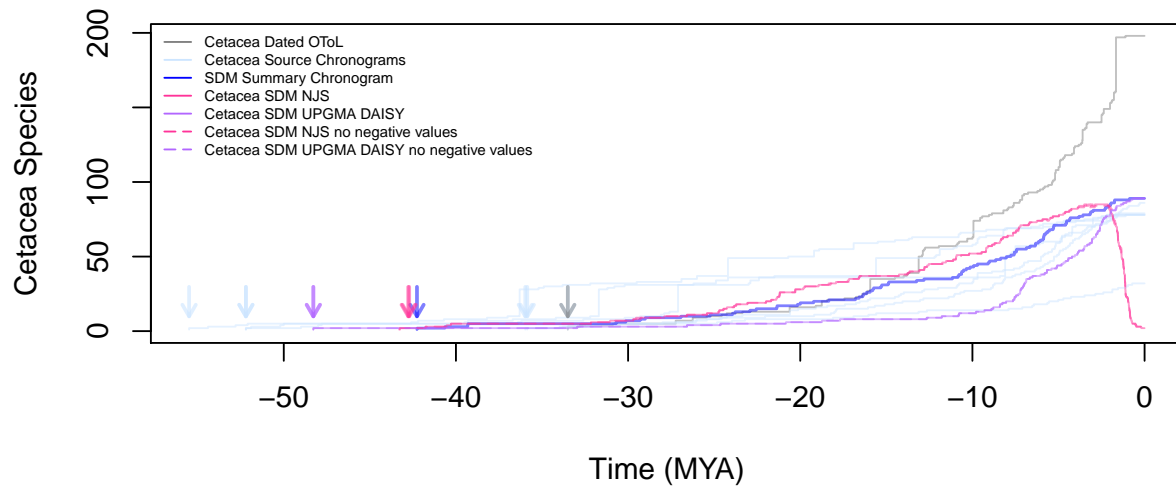


Figure 8: Cetacea lineage through time (LTT) plots from source chronograms and SDM summary matrix converted to phylo with different methods (NJ and UPGMA). As you can note, dashed lines and solid lines from trees coming out from both types of clustering algorithms implemented are mostly overlapping. This means that removing negative values does not change results from clustering algorithms much. Clustering algorithms used often are returning non-ultrametric trees or with maximum ages that are just off (too old or too young). So we developed an alternative algorithm in `datelife` to go from a summary matrix to a fully ultrametric tree.

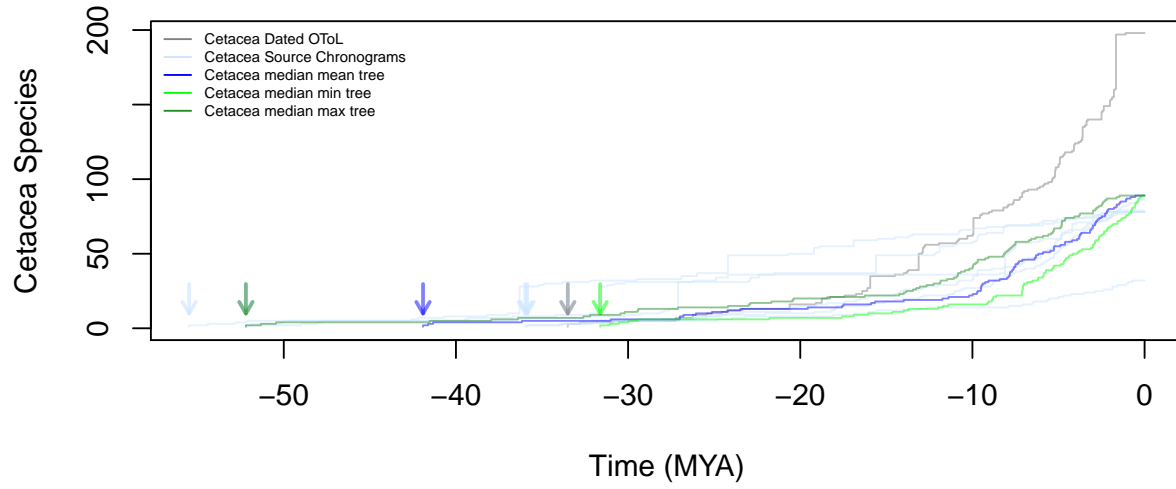


Figure 9: Cetacea lineage through time (LTT) plots from source chronograms and Median summary matrix converted to phylo with `datelife` algorithm.

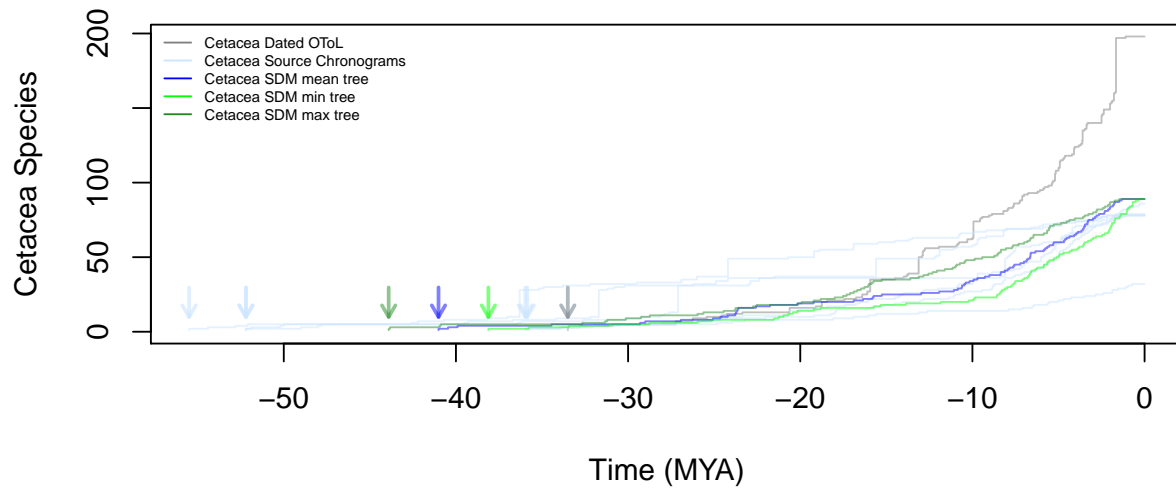


Figure 10: Cetacea lineage through time (LTT) plots from source chronograms and SDM summary matrix converted to phylo with `datelife` algorithm.