



Stochastic TOC modeling for East African Rift System Lakes, a possible pre-salt analogous

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2 PETROBRAS

August 11, 2023



... somewhere in the ancient earth ...

Carreira et. al

Problem set

Objectives

Introduction

Methodology

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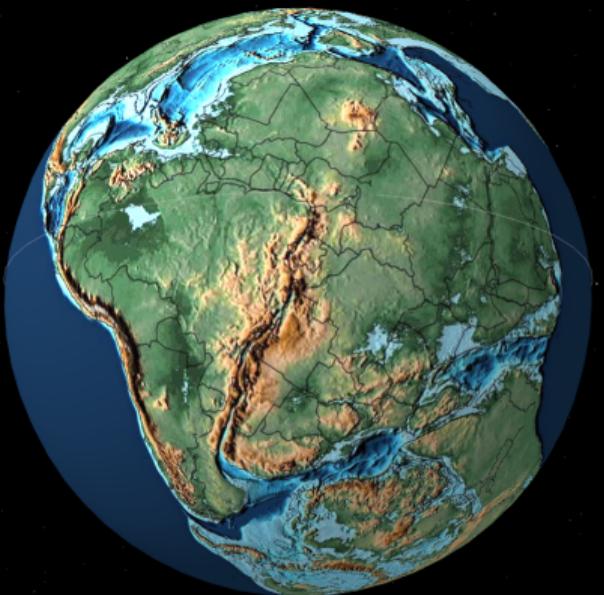
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... somewhere in the ancient earth ...



150 My ago



... somewhere in the ancient earth ...



120 My ago

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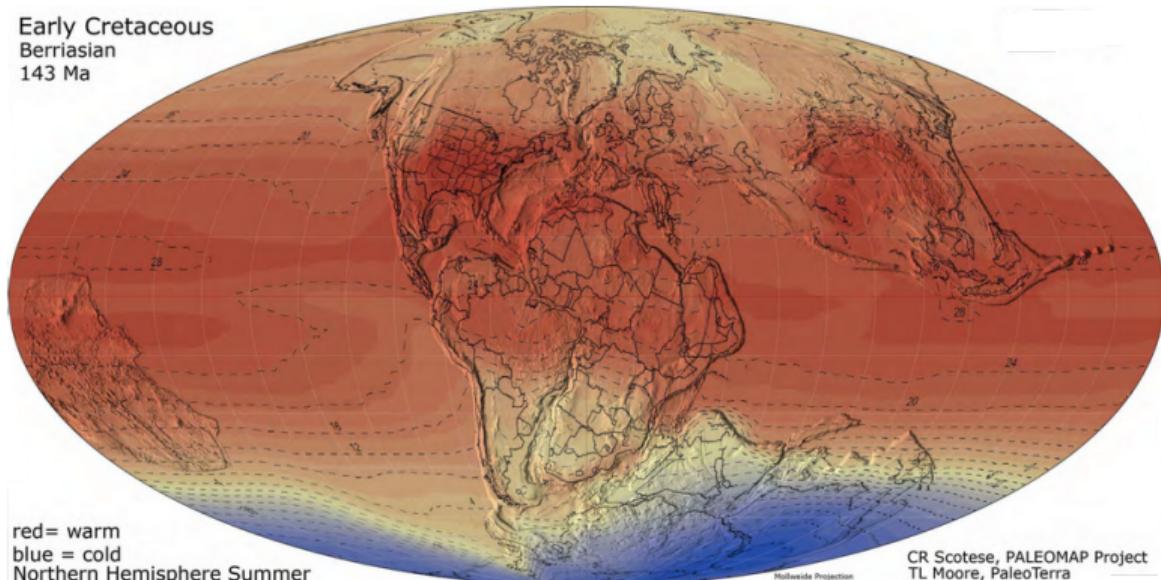


Figure: 143My ago, lakes were formed. (Scotese, 2013)



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$$TOC = f(\alpha, \gamma, \delta, \dots)$$

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$$TOC = f(\alpha, \gamma, \delta, \dots) \xrightarrow{\text{unknown}}$$



Modern Analogous

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Modern Analogous



Considering an initial Rift perspective



Objectives

- ▶ Define the main variables that interact in actual lakes;





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- ▶ Such lakes should be a pre-salt analogous;





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- ▶ Such lakes should be a pre-salt analogous;
- ▶ Predictive TOC model for lakes;



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- ▶ Define the main variables that interact in actual lakes;
- ▶ Such lakes should be a pre-salt analogous;
- ▶ Predictive TOC model for lakes;
- ▶ Create and publicize a data table used to mimetic TOC in real lake systems;



Objectives



- ▶ Define the main variables that interact in actual lakes;
- ▶ Such lakes should be a pre-salt analogous;
- ▶ Predictive TOC model for lakes;
- ▶ Create and publicize a data table used to mimetic TOC in real lake systems;
- ▶ Define the best membership function for the studied lakes.



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Introduction

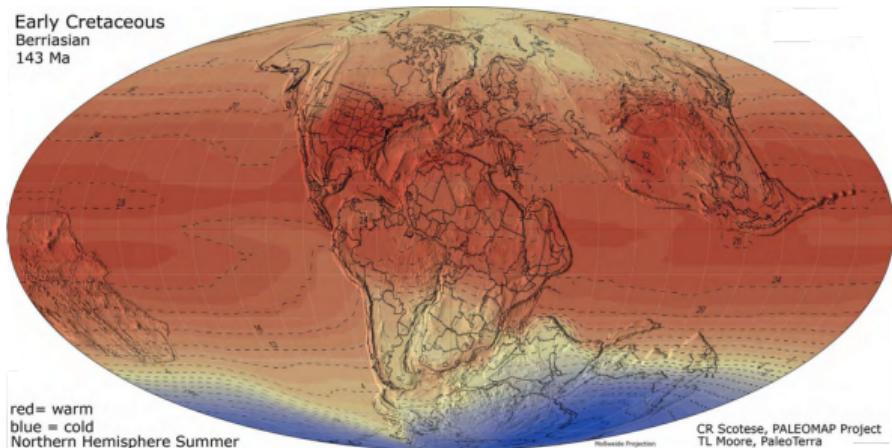
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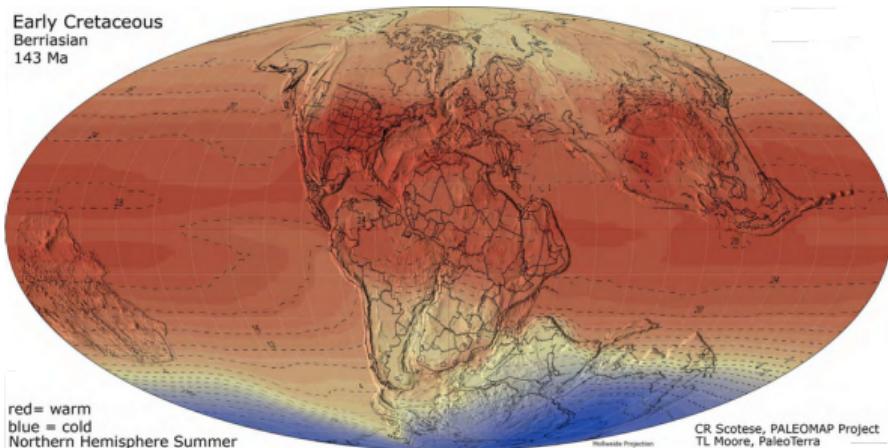
Pre-salt lakes



- ▶ This distinctive set of lakes existed throughout the Lower Cretaceous



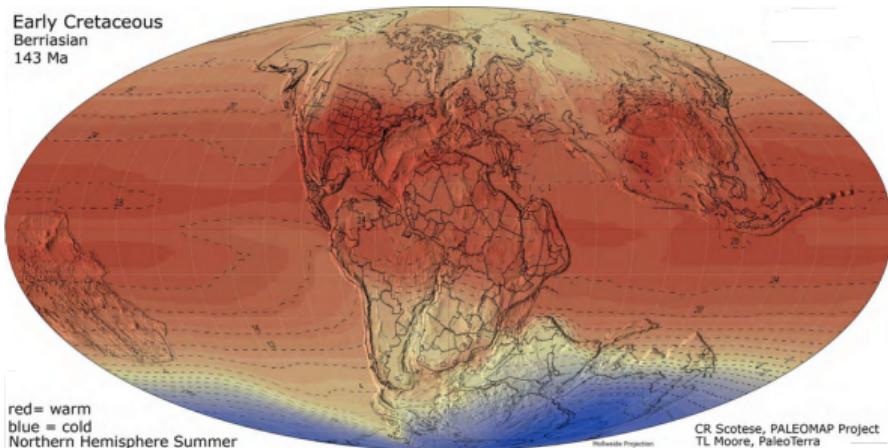
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- ▶ This distinctive set of lakes existed throughout the Lower Cretaceous
- ▶ It has a wide distribution and its record includes the sedimentary basins of the eastern margin as well as the sedimentary basins of the equatorial margin



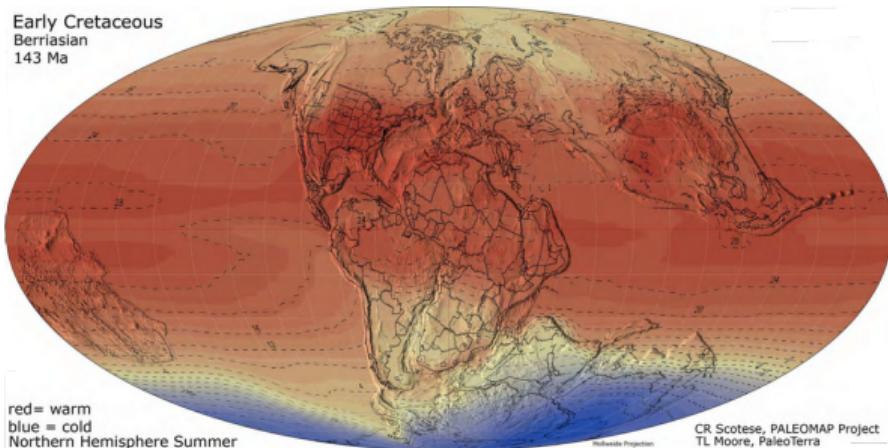
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- ▶ The record of large layers of salt is not decisive for the existence of these lakes.



Pre-salt lakes

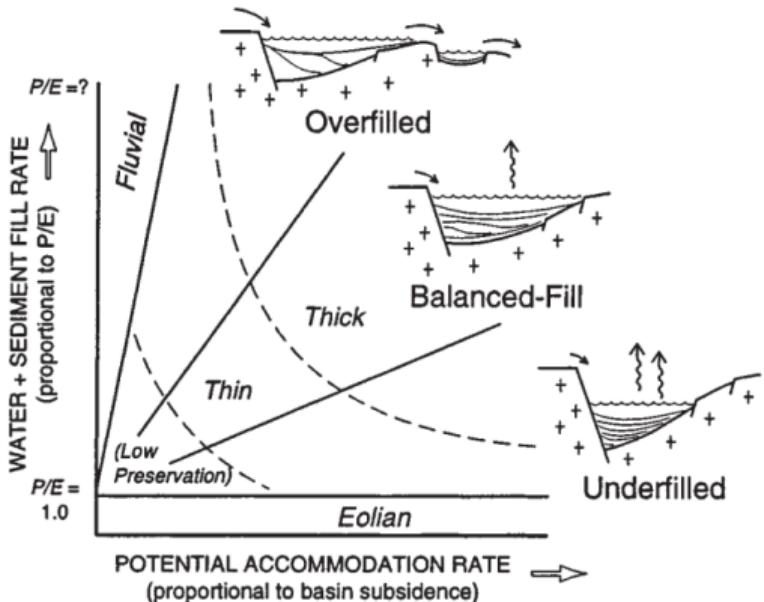


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- ▶ It has a wide distribution and its record includes the sedimentary basins of the eastern margin as well as the sedimentary basins of the equatorial margin
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(Kelts, 1988; Talbot, 1988; Gonçalves, 2001; Wright and Rodriguez, 2018; Boyd et al., 2015; Neves et al., 2019)



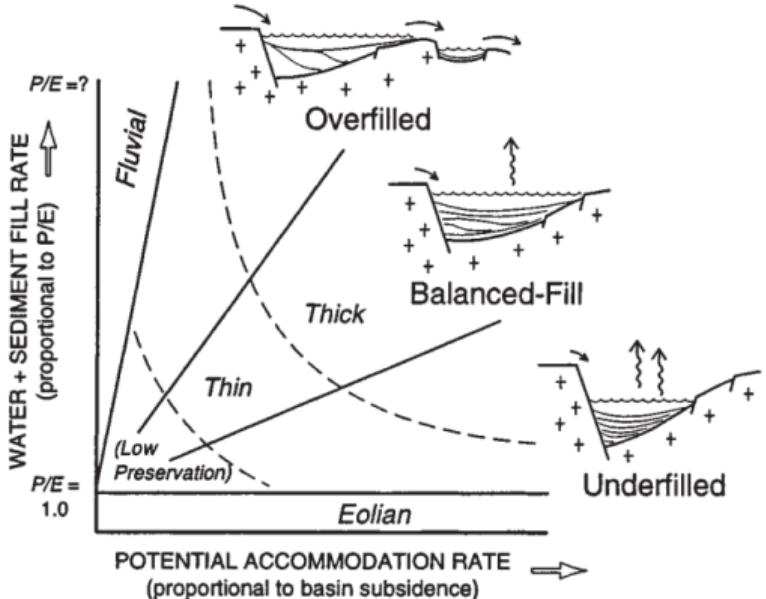
Pre-salt lakes



- ▶ The relation precipitation/evaporation induces the preservation factor;



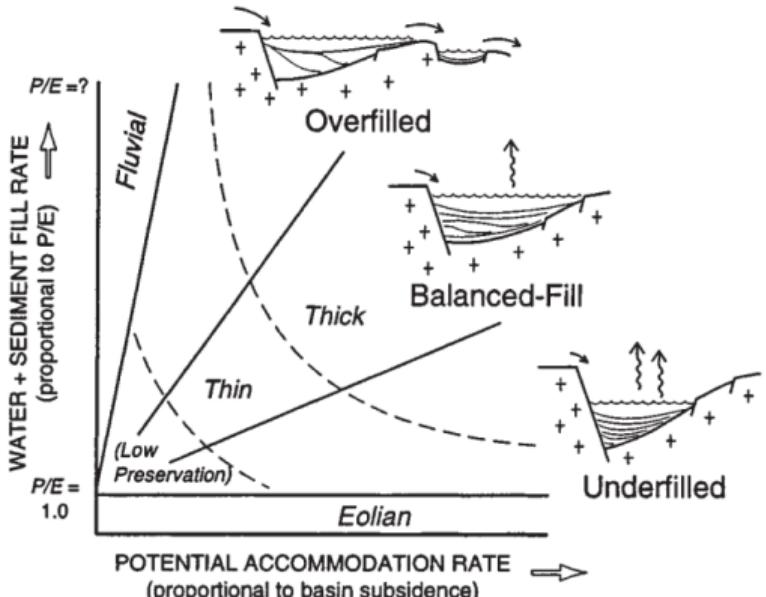
Pre-salt lakes



- ▶ The relation precipitation/evaporation induces the preservation factor;
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Pre-salt lakes



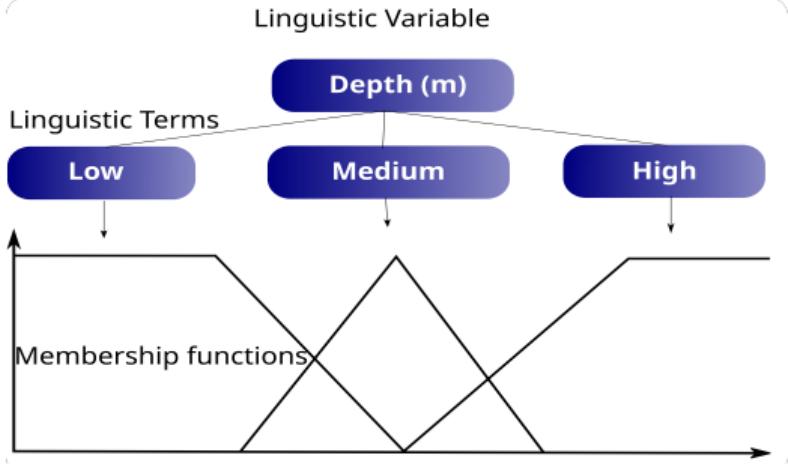
- ▶ The relation precipitation/evaporation induces the preservation factor;
- ▶ The sedimentation rate, distance of the source area, and the depths of the lake have a direct impact on the preservation factor;
- ▶ Factors such as pH, dissolved oxygen, and primary productivity warrant consideration.

(Kelts, 1988; Talbot, 1988; Gonçalves, 2001; Wright and Rodriguez, 2018; Boyd et al., 2015; Neves et al., 2019)



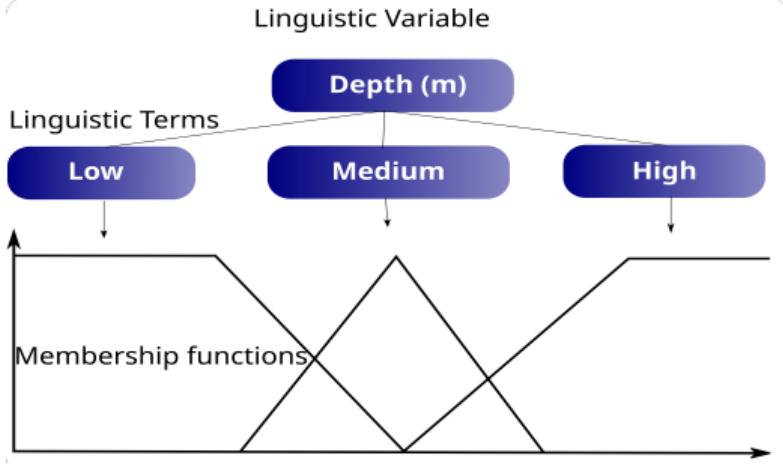
Fuzzy system

- ▶ Fuzzy sets are defined by an interval within a linguistic variable





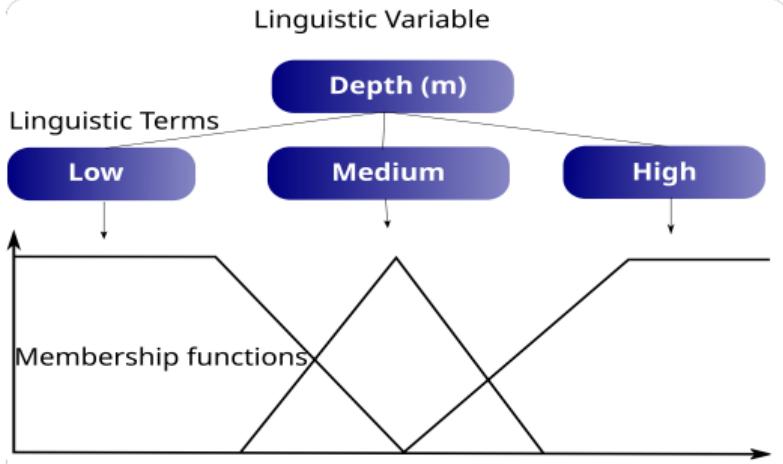
Fuzzy system



- ▶ Fuzzy sets are defined by an interval within a linguistic variable
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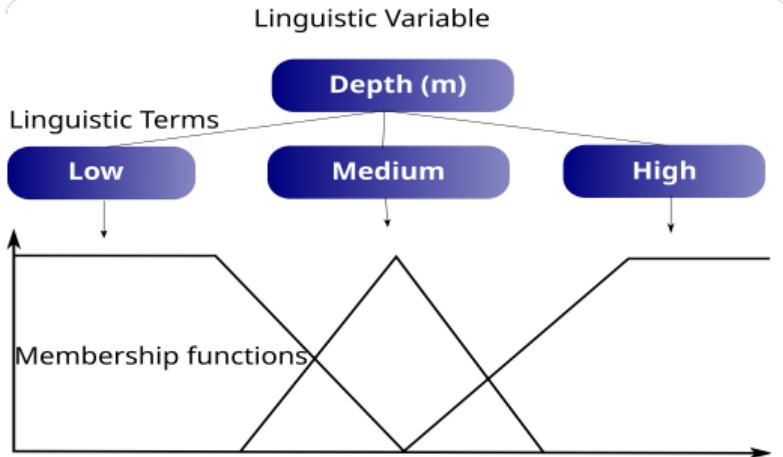
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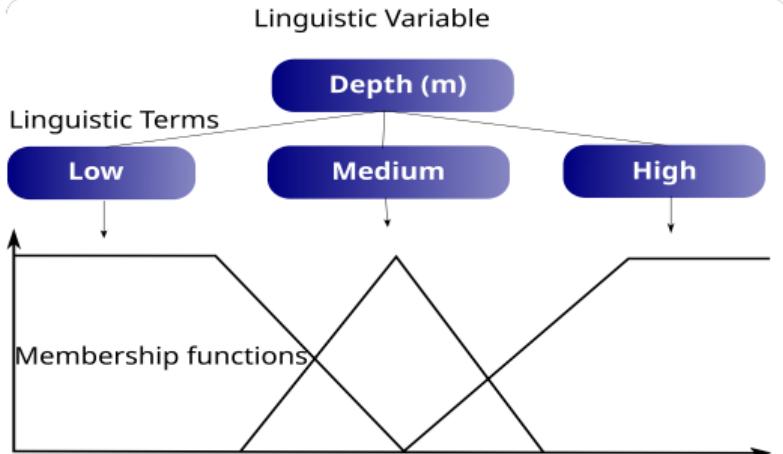
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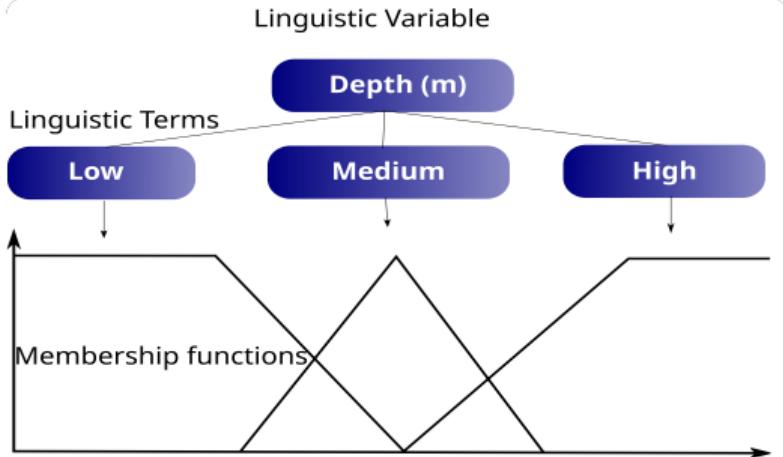
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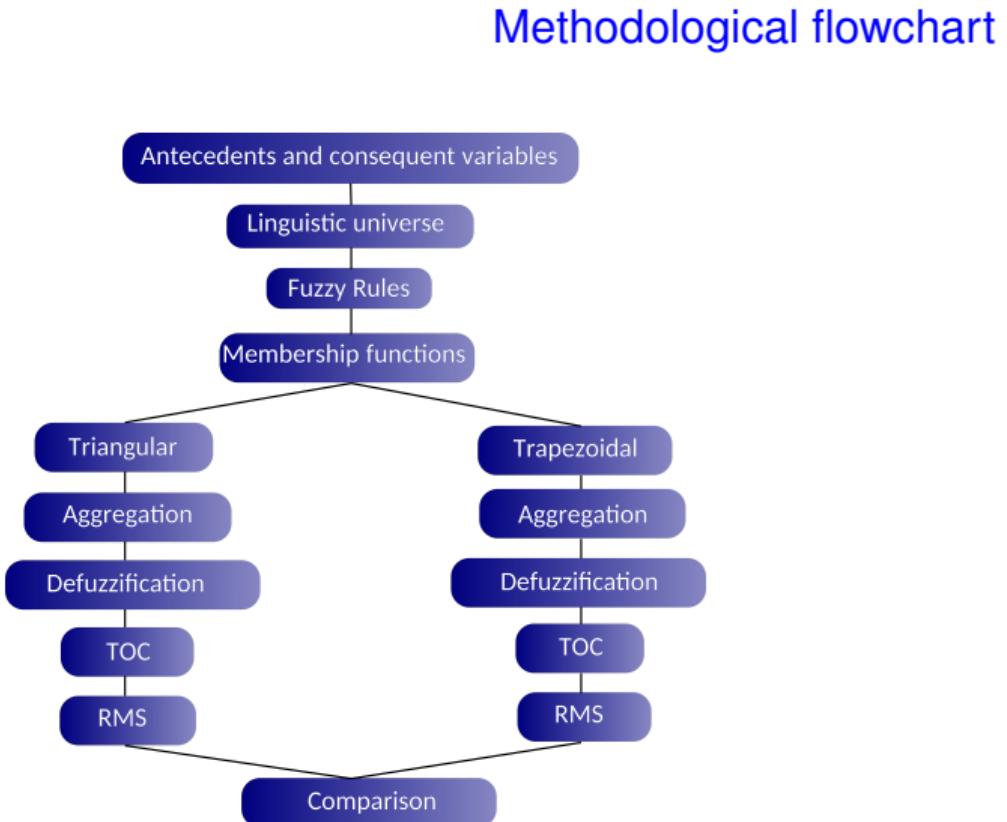
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$$RMS = \sqrt{\frac{1}{n} \sum_{i=1}^n (x_i - \hat{x}_i)^2}$$

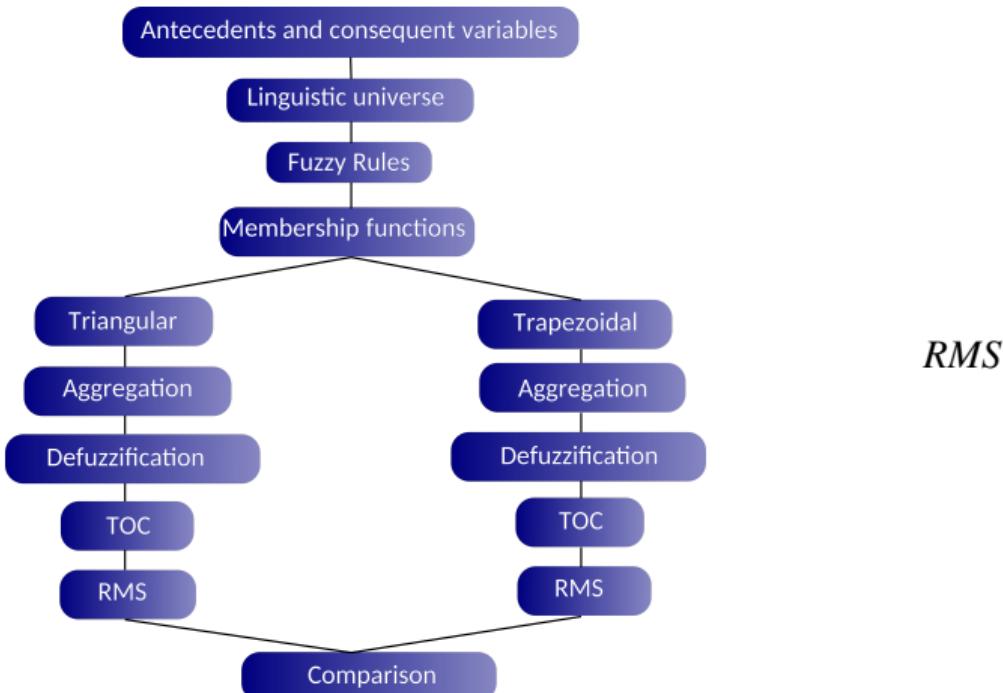




Table: East African Lakes Database. In red is TOC, defined as the model consequent variable. (Talbot, 1988; Bronikowska and Pisarska, 2021; Hamilton et al., 2016)

Lake	TOC	AD	MD	pH	O ₂	SR	GRA	SEL	PP
Edward	11.62	17	112	9.10	2.50	2.8	0.06	1	43.30
Motubu	2.81	70	85	8.90	0.02	0.9	0.2	25	600
Kivu	7.14	240	480	8.60	11.76	8.00	0.10	0.02	264
Tanganyika	4.81	572	1470	8.30	9.16	1.00	0.002	0.02	1.40
Victoria	11.23	40	80	9.30	0.12	0.82	0.002	0.02	6.25

where TOC is Total Organic Carbon in %, AD is average depth in m, MD is maximum depth in m, SR is sedimentation rate ($cm/kyear$), GRA is grain size deposit in mm, SEL grain selection in mm, PP is primary productivity in ($gC/m^2/year$).



Victoria Lake

Classificação (COT)

%

Muito baixo	0.1-1
Baixo	1-6
Médio	6-9
Alto	8-20
Muito alto	>20

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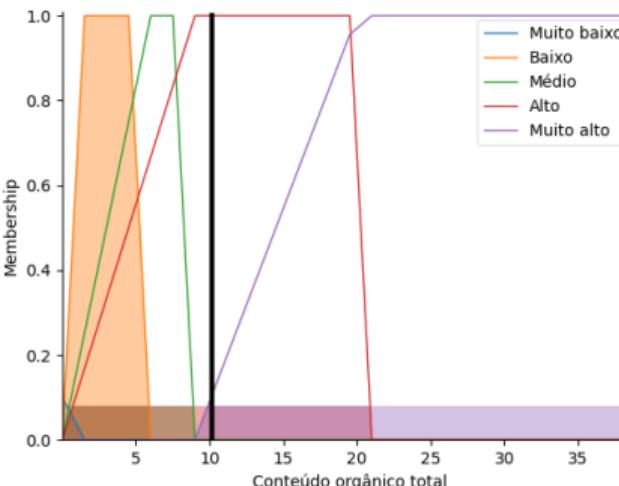
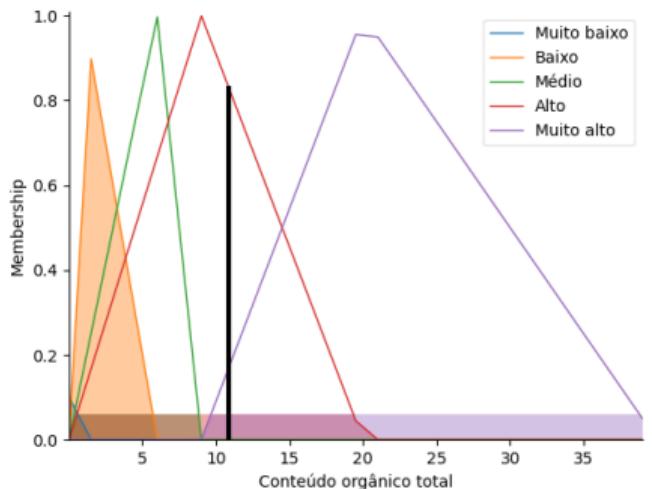


Victoria Lake

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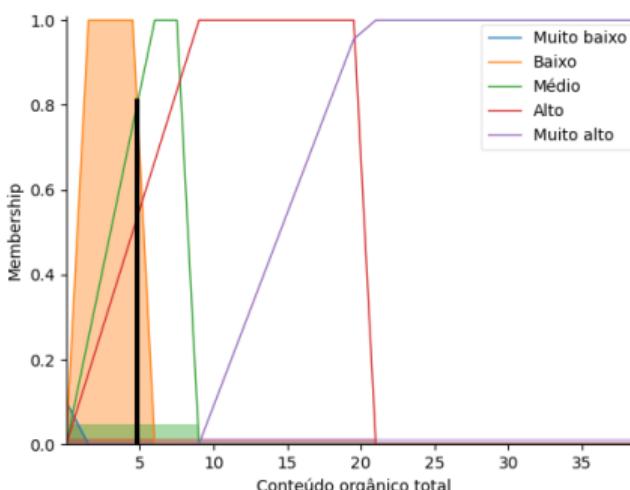
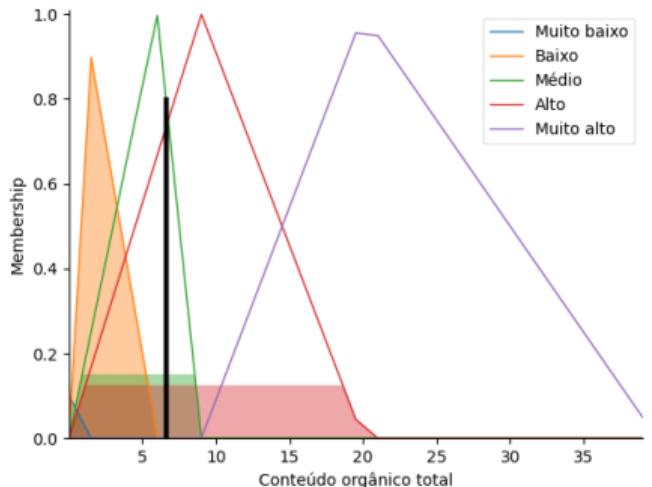


Tanganyika Lake

Classificação (COT)

%

Muito baixo	0.1-1
Baixo	1-6
Médio	6-9
Alto	8-20
Muito alto	>20

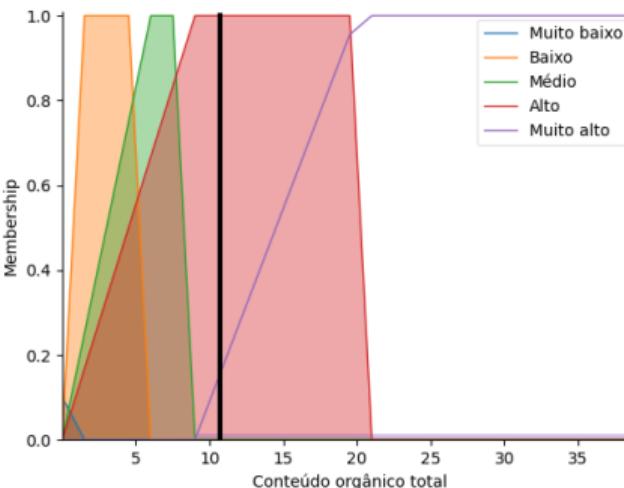
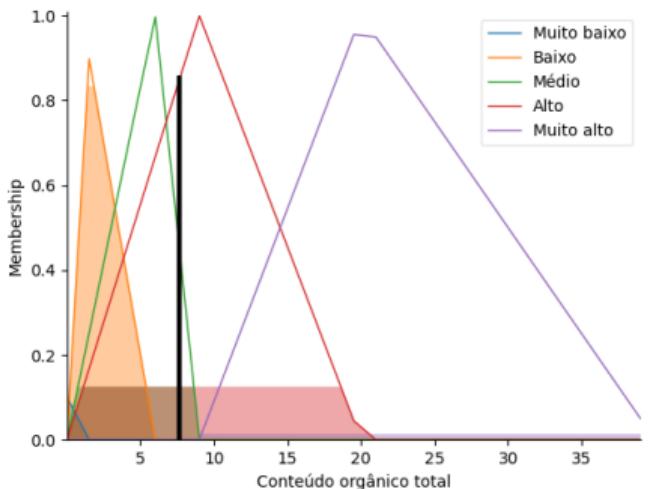




Kivu Lake

Classificação (COT)

	%
Muito baixo	0.1-1
Baixo	1-6
Médio	6-9
Alto	8-20
Muito alto	>20

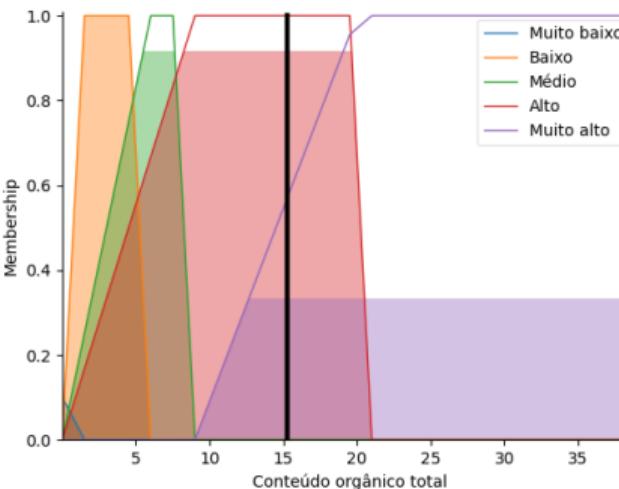
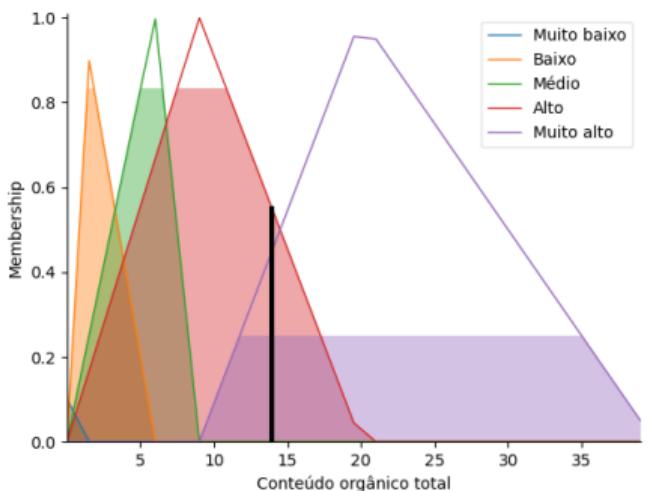




Edward Lake

Classificação (COT)

	%
Muito baixo	0.1-1
Baixo	1-6
Médio	6-9
Alto	8-20
Muito alto	>20





Motubu Lake

Classificação (COT)

%

Muito baixo	0.1-1
Baixo	1-6
Médio	6-9
Alto	8-20
Muito alto	>20

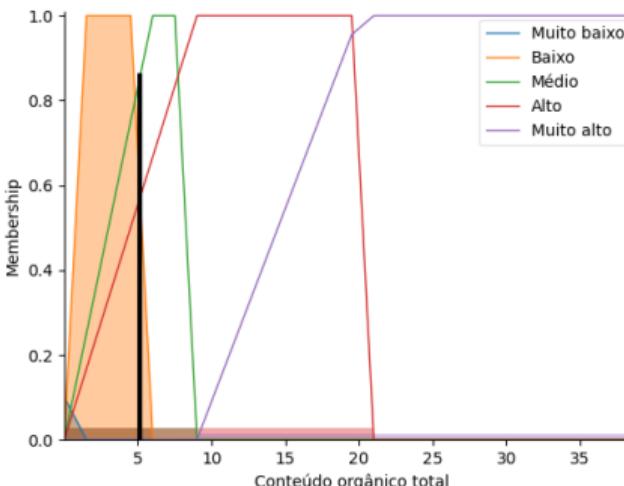
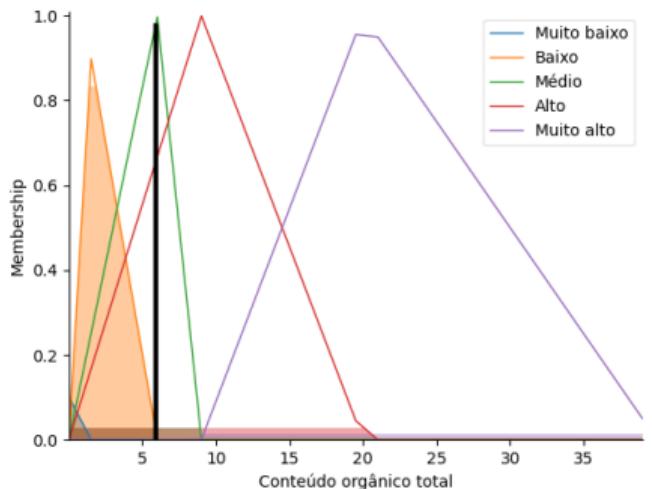




Table: Results

Lake	membership	$TOC_{obs}(\%)$	$TOC_{calc}(\%)$	RMS (%)
Edward	triangular	11.62	13.95	2.33
Motubu	triangular	2.81	5.89	3.07
Kivu	triangular	7.14	7.67	0.53
Tanganyika	triangular	4.81	4.67	0.13
Victoria	triangular	11.23	10.87	0.36
Edward	trapezoidal	11.62	15.24	3.62
Motubu	trapezoidal	2.81	5.15	2.34
Kivu	trapezoidal	7.14	10.72	3.58
Tanganyika	trapezoidal	4.81	4.79	0.01
Victoria	trapezoidal	11.23	10.14	1.08

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Some conclusions

- ▶ The simulations held for the East African Lake Systems showed good results for TOC estimation when a lake TOC function is not known.



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- ▶ The TOC concentration is better estimated when triangular membership functions are applied.



Some conclusions

- ▶ The simulations held for the East African Lake Systems showed good results for TOC estimation when a lake TOC function is not known.
- ▶ The TOC concentration is better estimated when triangular membership functions are applied.
- ▶ Results indicates that the organic matter contents can be estimated considering important environmental variables such as primary productivity (maximum of 600 gC/m²/year) and dissolved oxygen, but also when geological parameters such as sedimentation rate, granulometry, and selection are considered.



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Obrigado!

Fale conosco

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