



# CONVECTIVE PARAMETERIZATION OF ENSEMBLE WEIGHTED APPROACH FOR THE REGIONAL MODEL BRAMS

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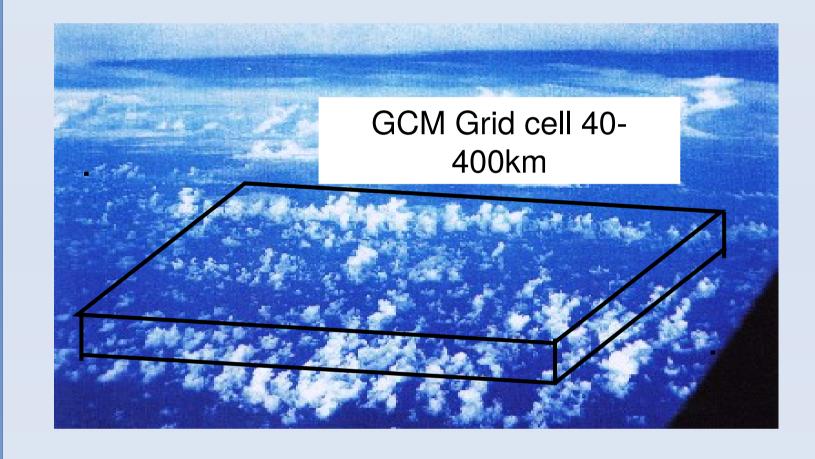
RESUMO: No presente trabalho, a metodologia de problema inverso de estimação de parâmetros é aplicada ao modelo BRAMS. O problema inverso é resolvido pelo método de otimização Firefly (FA) e o modelo direto é dado pelas simulações de precipitação utilizando diferentes parametrizações de convecção do modelo. O objetivo é determinar numericamente os pesos de cada parametrização para ponderar o conjunto de parametrizações convectivas. Como resultado, é obtido o campo de chuva reconstruído a partir da combinação entre as simulações e os campos de pesos. Os resultados indicaram um campo de precipitação reconstruído mais próxima das observações.

ABSTRACT: In this study, the methodology of inverse problem of parameter estimation is applied using the regional model BRAMS. The inverse problem is solved by the Firefly (FA) optimization method and the direct model is given by the simulations of precipitation expressed by different cumulus parameterizations of the model. The goal is to determine numerically the weights of each parameterization to weight the ensemble of cumulus parameterizations. The results showed a retrieved precipitation field closest to the observations.

#### INTRODUCTION

# Why is so difficult represent clouds in numerical models?





## FIREFLY METHOD

Pseudo code

## begin

Objective function f(x),  $x=(x_1,...,x_d)^T$ 

Generate initial population of fireflies  $x_i$  (i=1, 2,..., n)

Light intensity  $I_i$  at  $x_i$  is determined by  $f(x_i)$ 

Define light absorption coefficient y

**while** (t < MaxGeneration)(Number of iterations)

**for** i = 1: n all n fireflies

for j = 1: d loop over all d dimensions

**if**  $(I_i > I_j)$ , Move firefly i towards j: end if

Attractiveness varies with distance r via exp[- yr] evaluate new solutions and update light intensity

end for j

end for i

Rank the fireflies and find the current best

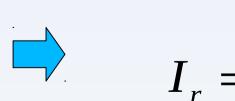
(2008)

end while Postprocess results and visualization

end

Adapted of Yang

 $I(x) \propto f(x)$ 



$$I_r = \frac{I_{fonte}}{r^2}$$

Movement of the firefly i toward firefly j (brightest)

$$x_{i} = x_{i} + \frac{\beta_{0}}{1 + r^{2} \gamma} (x_{j} - x_{i}) + \alpha \left( rand - \frac{1}{2} \right)$$
attraction randomness

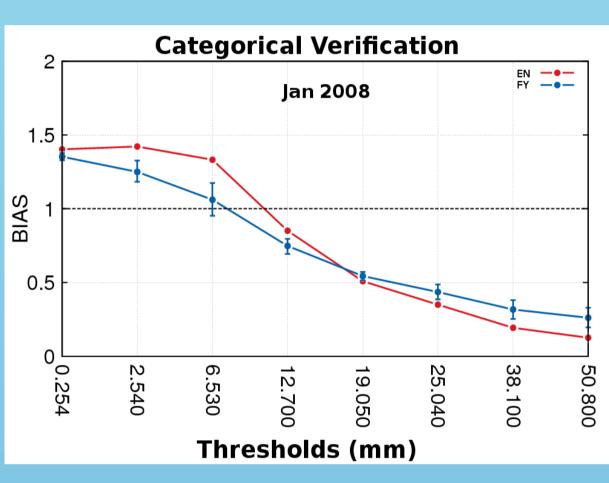
 $\gamma = O(1) =$  determines the convergence velocity

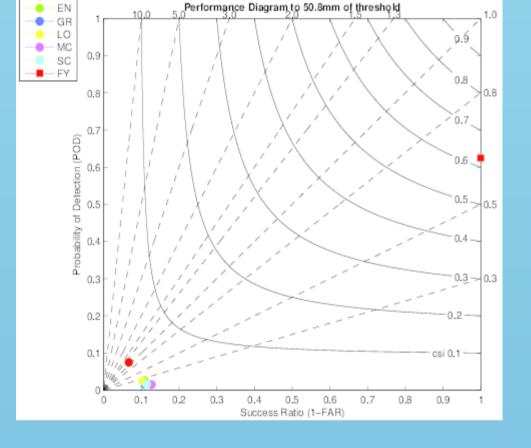
To an environment light absorption coefficient fix  $\gamma$ 

#### RESULTS

Experimental tests with the FA algorithm parameter

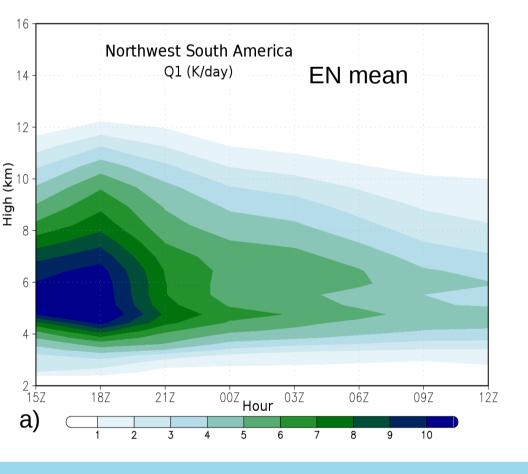
Parameter	Initial Value	Final Value	Increment
α	0.01	0.1	0.01
β	0.1	1.0	0.1
У	1.0	10.	1.0
n	5	5	5
G	10	100	10

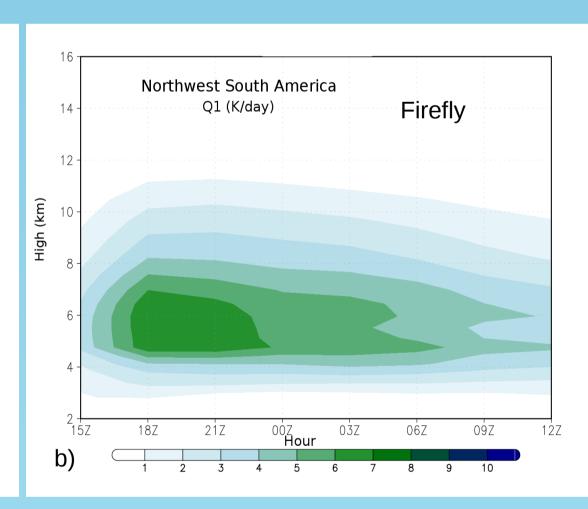




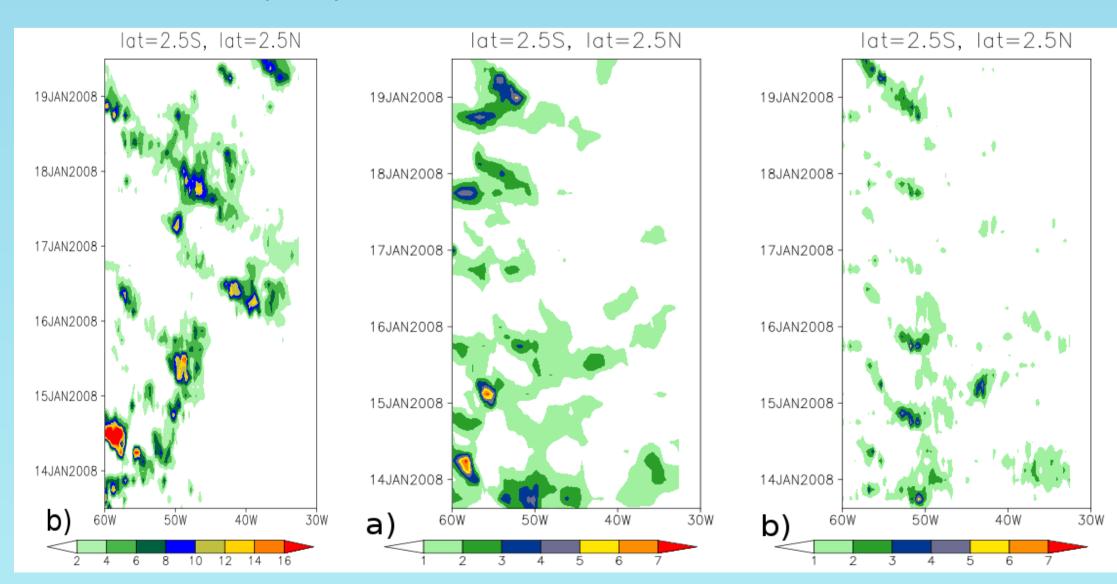
Categorical verification: Mean bias score versus precipitation thresholds (0.254, 2.54, 6.53, 12.7, 19.05, 25.4, 38.1, 50.8 mm) for South America for a set of 30 forecasts of 24-h accumulated precipitation for 120h in advance for (A) January 2008. Blue line represents simulations using FY weight method and red line the original EN. Blue bars indicate significance test from the bootstrap method (Hamill,

Categorical verification: Performance Diagram to threshold 50.8 mm for South America, for January 2008. AS, EN, GR, LO, MC, SC and FY represent the original ensemble, Grell, Low-level Omega, moisture convergence, Kain-Fritsch and Firefly closures.





#### **Diurnal cycle:** Mean diurnal cycle of Q1 for January 2008 over northwest South America: a) ensemble mean and b) Firefly



Diurnal cycle: Hovmöller diagram of accumulated precipitation each 3h from 13 January 12:00 to 19 January 12:00 2008 mean over 10°S and 2,5°N

## **AKNOWLEGEMENTS**

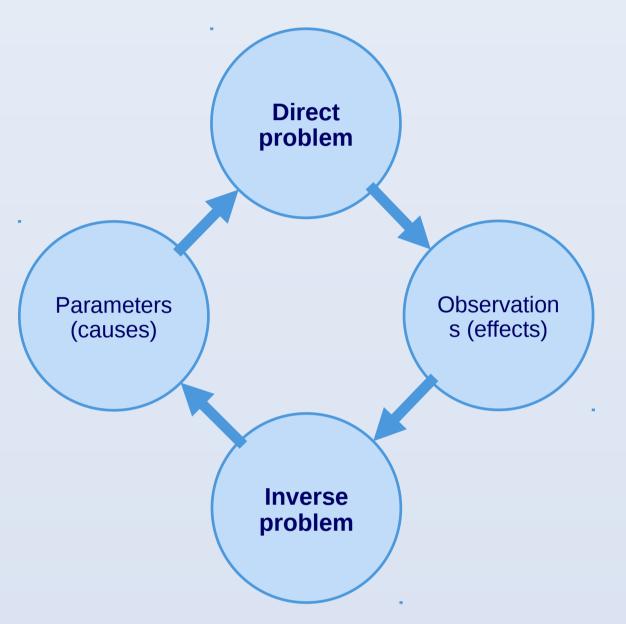
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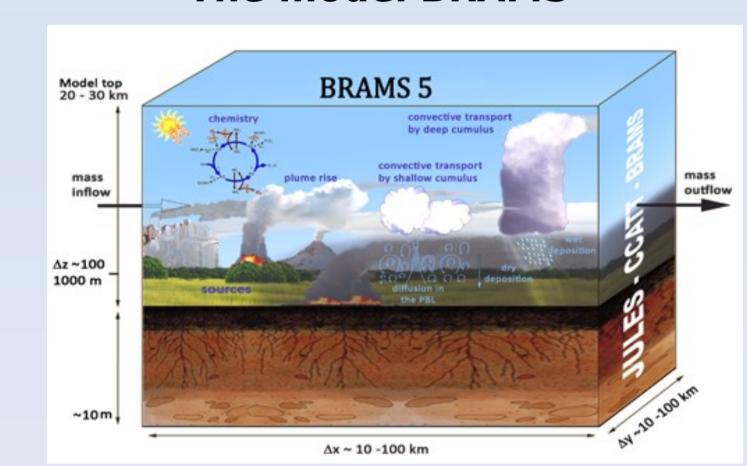


## **METHODOLOGY**

#### Weights estimation Inverse Problems



#### The model BRAMS



$$P_{S} = w_{AS}P_{AS} + w_{GR}P_{GR} + w_{KF}P_{KF} + w_{MC}P_{MC} + w_{LO}P_{LO}$$

$$J(\overrightarrow{W}^T) = \min \left\| P_M^{w_i} - P_S \right\|_2^2$$
 where  $P_M = \sum_{i=1}^5 w_i P_i$ 

## **Closures used:**

- Grell (GR)
- **Arakawa & Schubert (AS)**
- Kain e Fritsch (KF)
- Moisture convergence (MC)
- Low-level omega (LO)

**Numerical experiment:** simulation of the diurnal cycle; 30-days of 24h forecasts January 2008

Iterations (MaxGeneration)= 1000

 $N^{\circ}$  fireflies (n) = 20

 $B_{0} = 1$  $\alpha = 0.2$  $\gamma = 1$ 

## CONCLUSION

Results showed high sensitivity of model **BRAMS** to Firefly algorithm method, with impacts over diurnal cycle of precipitation, heatig profiles and improvement of the skill of BRAMS

## REFERENCES

Grell, G. A. and Dévényi, D. A generalized approach to parameterizing convection combining ensemble and data assimilation techniques. Geophys. Res. Lett., v. 29, no. 14, 2002

Luz, E. F. P et al. Conceitualização do algoritmo vagalume e sua aplicação na estimativa de condição inicial de calor. In: IX Workshop do Curso de Computação Aplicada do INPE, 2009

Yang, X. Nature-Inspired Metaheuristic Algorithms, Cambridge, 2008