

# XXIII ENAA ENCONTRO NACIONAL DE ASTRONOMIA E ASTROFÍSICA

## *OPTIMIZATION METHODS FOR DERIVING STELLAR PARAMETERS*

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# Overview:

- ▣ Main goals;
- ▣ Motivation;
- ▣ Optimization methods and some preliminary results;
- ▣ Outlines;

# Goals

It is aimed to develop a tool to derive the stellar parameters of FGK type stars, such as:

1.  $T_{\text{eff}}$ ;
2.  $\log(g)$ ;
3.  $[\text{Fe}/\text{H}]$ ;
4.  $\xi$  (microturbulence);

$$4\text{D} \rightarrow (T_{\text{eff}}, \log(g), [\text{Fe}/\text{H}], \xi)$$

$T_{\text{eff}}$  of FGK type stars:

F: 6000-7500 K;

G: 5000-6000 K;

K: 3500-5000 K;

# Objective function

Objective function:

$$\chi^2 = w_1 c_1^2 + w_2 c_2^2 + w_3 c_3^2 \quad (1)$$

where:

- ▣  $w_i \geq 0, i = 1, 2, 3 \rightarrow$  values fitted according to the model;
- ▣  $c_1 \rightarrow$  slope of the plot  $\text{Ab}(\text{Fe}/\text{H})$  vs  $\log_{10}(W/\lambda)$ ;
- ▣  $c_2 \rightarrow$  slope of the plot  $\text{Ab}(\text{Fe}/\text{H})$  vs excitation potential (excitation equilibrium);
- ▣  $c_3 \rightarrow c_3 = [\text{FeI}/\text{H}] - [\text{FeII}/\text{H}]$  (ionization equilibrium);

Stellar parameters are derived assuming LTE conditions.

# Optimization methods and some preliminary results

- ▣ Downhill Simplex Method (Amoeba);
  - Preliminary results;
- ▣ Downhill Simplex with a cooling scheme (Amebsa);
  - Preliminary results;
- ▣ Particle Swarm Optimization (PSO);
- ▣ Combination of the Particle Swarm Optimization and deterministic methods;

# How was the Downhill Simplex Method adjusted to the problem?

$$4D \rightarrow (T_{\text{eff}}, \log(g), [\text{Fe}/\text{H}], \xi)$$

$$3000\text{K} < T_{\text{eff}} < 7000\text{K}$$

$$1.0 \text{ cm.s}^{-2} < \log(g) < 5 \text{ cm.s}^{-2}$$

$$0 \text{ km.s}^{-1} < \xi < 4 \text{ km.s}^{-1}$$

$$-2 < [\text{Fe}/\text{H}] < 2$$

- The objective function is non-differentiable;
- The topology of the function is unknown;

# How was the Downhill Simplex Method adjusted to the problem?

1. Initial guess: take the solar parameters as the initial guess. Generate  $n$  random points around the initial guess and evaluate the cost function at each point. Define the point with the lowest  $\chi^2$ -value as the best initial guess;
2. Define the initial simplex around the best initial guess and derive the  $\chi^2$ -value in each vertex;
3. Usually, the simplex goes to a region where the  $\chi^2$ -value is maximum;

4. The next steps can be summarized as reflections, contractions and expansions of the 4D space (Fig.1);
5. When the simplex finds a valley, it goes downwards to the minimum;



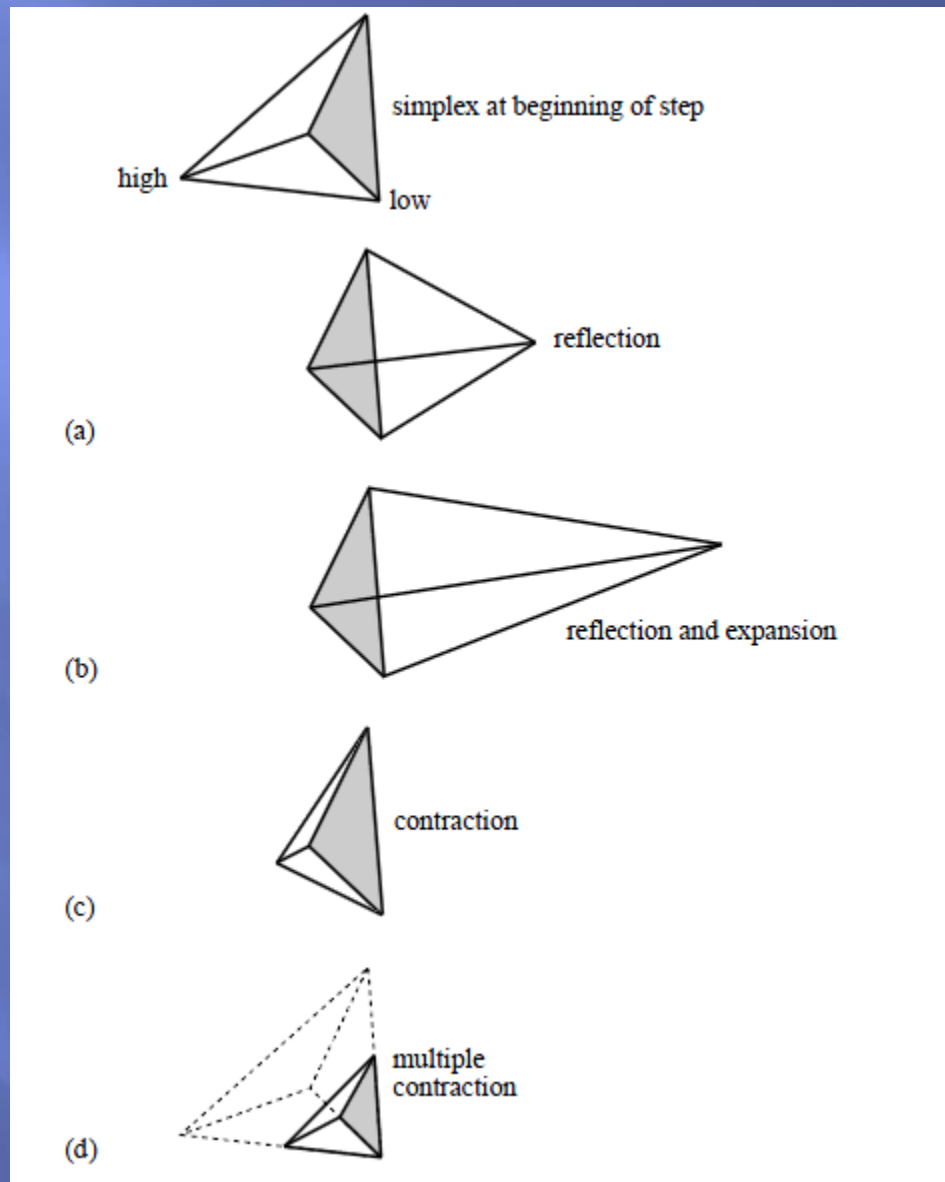


Fig.1 – Possible iterations of the simplex method. Source: Press, W. H., Teukolsky, S. A., Vetterling, W. T. And Flannery, B. P. (2002), *Numerical Recipes in C The art of scientific computing*, 2<sup>nd</sup> Edition, Cambridge Press University

# What are the convergence criteria?

$$\chi^2 < \text{Tolerance}$$

Number of iteration > Number of maximum iterations allowed

$$c_1 < 0.001 \text{ (E.P.)}$$

$$c_2 < 0.002 \text{ (EW)}$$

$$\text{Ab(FeI)} - \text{Ab(FeII)} (c_3) < 0.005 \text{ (ionization equilibrium)}$$

# Amoeba vs Amebsa

Amebsa:

- Based on the downhill simplex method (the allowed moves for the simplex are the same as in Amoeba);
- It has an implemented cooling scheme, similar to the simulated annealing.

# How Amebsa works?

1. Initially set an initial temperature ( $T$ ) sufficiently high and the cooling scheme;
2. The simplex is initially allowed to expand until it reaches an approximately size of the region, which can be reached at this temperature  $T$ .
3. The simplex moves in a stochastic tumbling Brownian motion within this region.
4. If the cooling scheme is sufficiently slow, the simplex will converge to a region where the lowest relative minimum is located.
5. When  $T \rightarrow 0$ , this new implementation reduces to the old simplex method (Amoeba).

# Preliminary Results and work still ongoing

	<b>Number of stars that converged to the solution</b>	<b>Number of stars that do not converged to the solution</b>	<b>Total</b>
Amoeba (C-version)	415	36	451
Amebsa (C-version)	422	29	451
PSO (C-version)	390	61	451
PSO + Amoeba (C-version)	?	?	?
PSO + Amebsa (C-version)	426	25	451

Table 1 - Summary of the number of stars that have converged and that have not converged to the solution in a sample of 451 stars. (<http://vizier.cfa.harvard.edu/viz-bin/VizieR-3>)

# Preliminary Results (Amoeba)

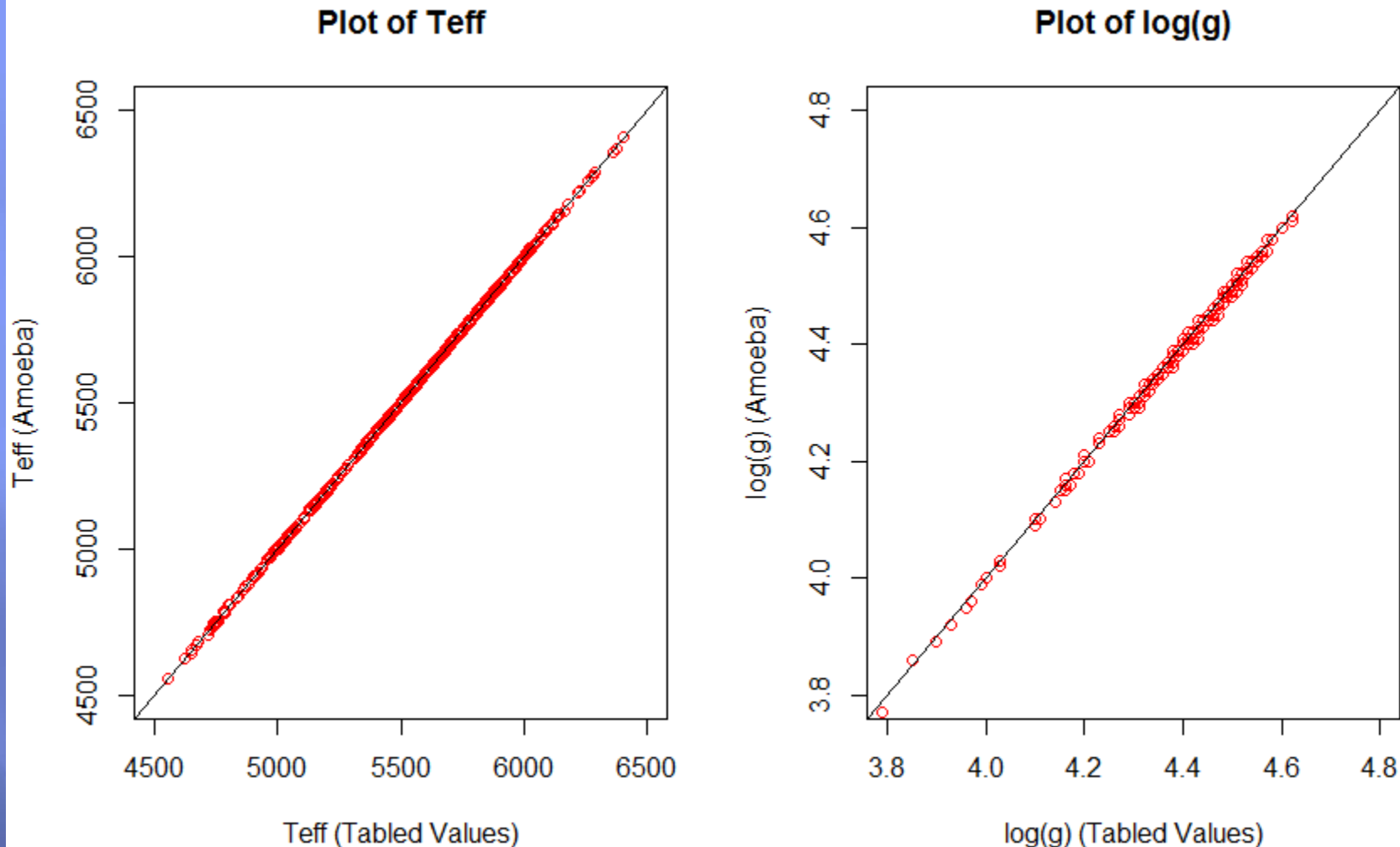


Fig.2 – Right: Plot of the derived Teff versus the tabled values. Left: Plot of the derived surface gravity versus the tabled values. The tabled values were taken from the publically available database: <http://vizier.cfa.harvard.edu/viz-bin/VizieR-3>.

# Preliminary Results (Amoeba)

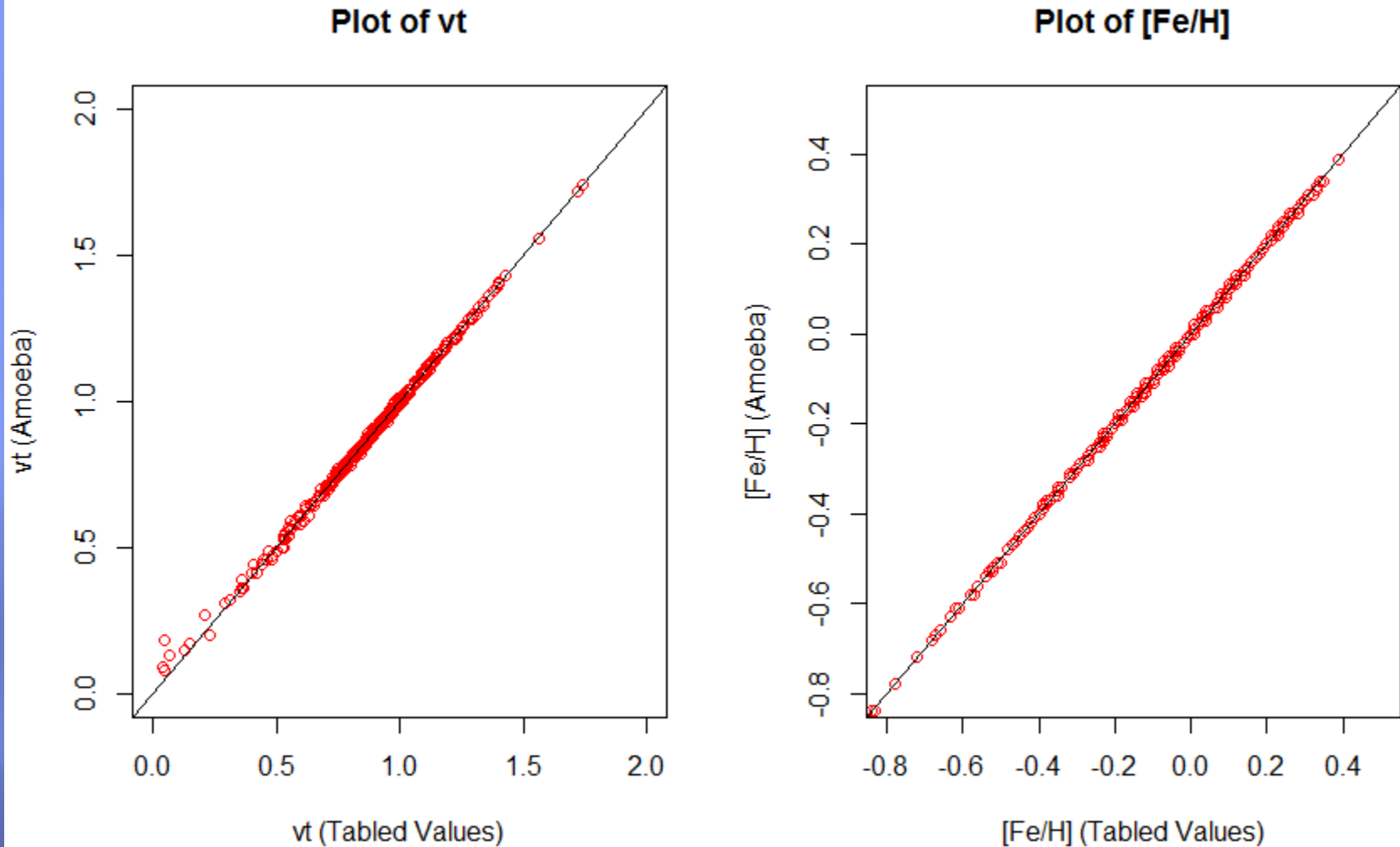


Fig.3 – Right: Plot of the derived microturbulence versus the tabled values. Left: Plot of the derived [Fe/H] values versus the tabled values. The tabled values were taken from the publically available database: <http://vizier.cfa.harvard.edu/viz-bin/VizieR-3>.

# Preliminary Results (Amebsa)

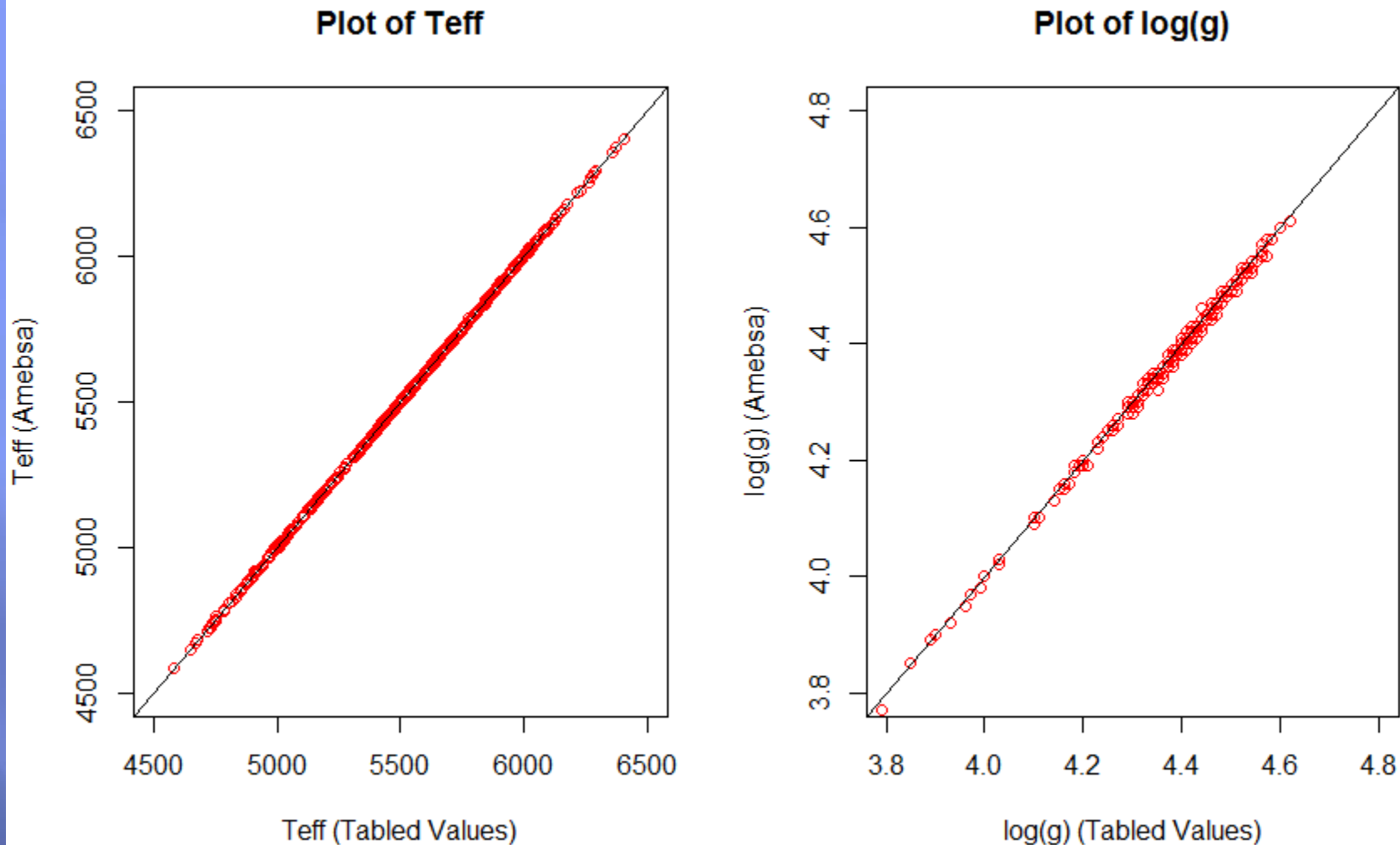


Fig.4 - Right: Plot of the derived Teff versus the tabled values. Left: Plot of the derived surface gravity versus the tabled values. The tabled values were taken from the publically available database: <http://vizier.cfa.harvard.edu/viz-bin/VizieR-3>.



# Preliminary Results (Amebsa)

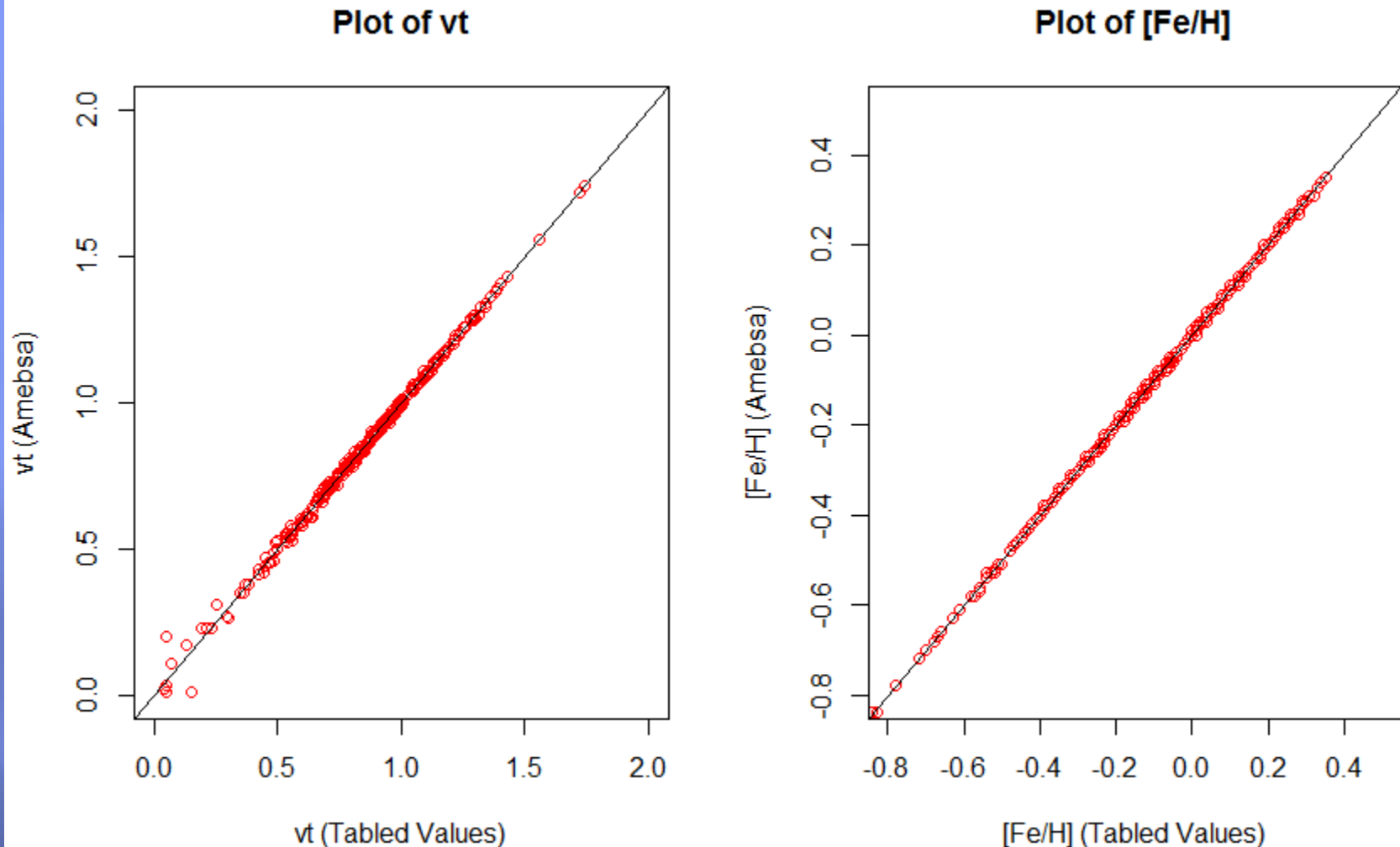


Fig.5 - Right: Plot of the derived microturbulence versus the tabled values. Left: Plot of the derived  $[Fe/H]$  values versus the tabled values. The tabled values were taken from the publically available database: <http://vizier.cfa.harvard.edu/viz-bin/VizieR-3>.

# Brief summary of the mean convergence times

	Amoeba (Fortran)	Amoeba (C-version)
K-type stars	27.60	23.16
G-type stars	17.19	9.70
F-type stars	5.60	13.09

Table 2 – Summary of the mean convergence times for the FGK type stars, using the Amoeba and Amebsa optimization methods. The convergence times are listed in minutes.

# Brief summary of the mean convergence times

	K-type stars	G-type stars	F-type stars
Amoeba (C-version)	39.07	17.18	18.18
Amebsa (C-version)	34.13	12.37	8.93
PSO (C-version)	117.43	65.53	44.03
PSO + Amoeba (C-version)	?	?	?
PSO + Amebsa (C-version)	44.34	21.37	16.14

Table 3 – Summary of the mean convergence times for the FGK type stars, using the Amoeba and Amebsa optimization methods. The convergence times are listed in minutes.

# Brief summary of the convergence times

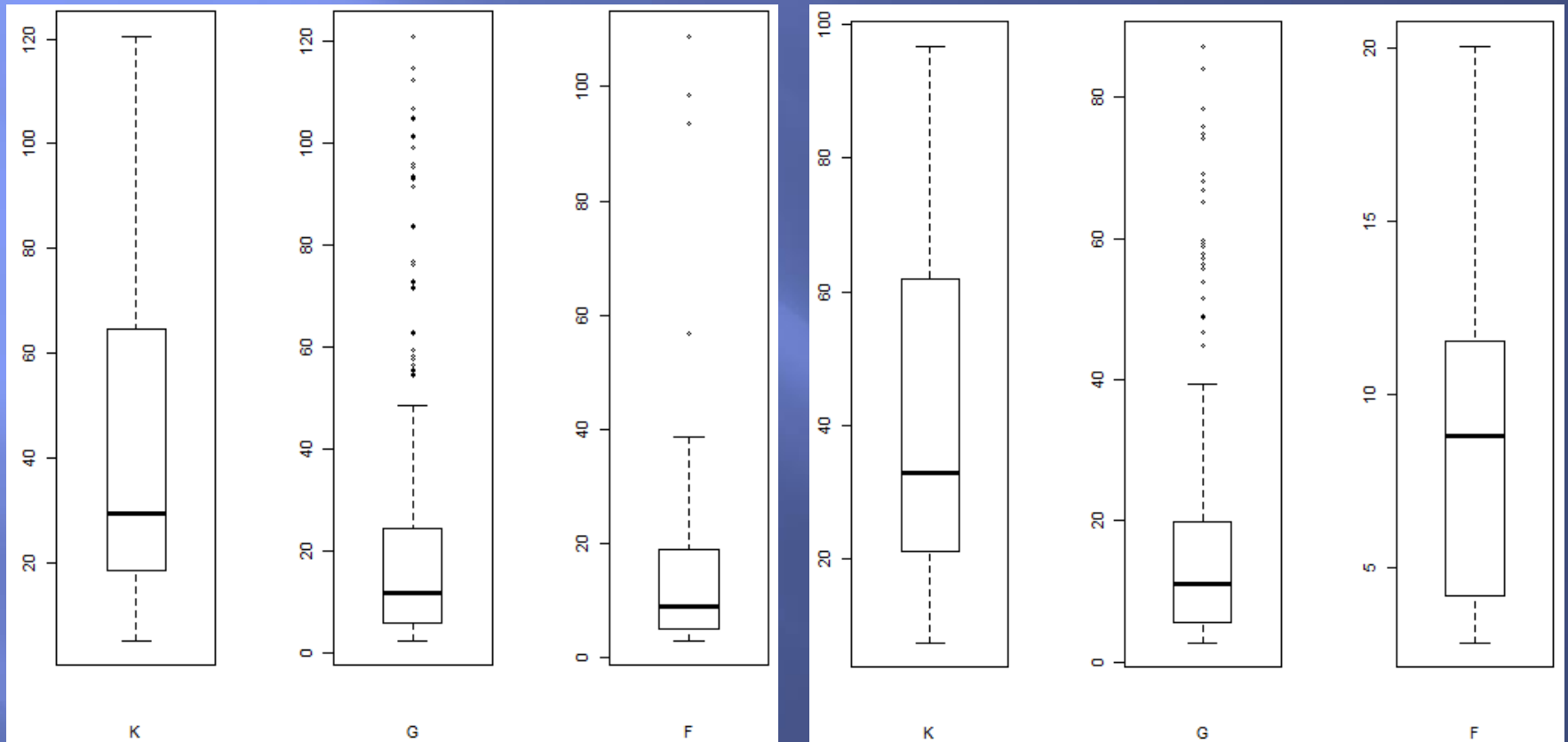


Fig.6 - Left: Boxplots of the convergence times for the K-, G- and F-type stars, respectively, using the Amoeba optimization method. Right: Boxplots of the convergence times for the K-, G- and F-type stars, respectively, using the Amebsa optimization method.

# Outlines

- ▣ The convergence times are better for the C-version of Amoeba, comparing with Fortran (for K. And G-type stars);
- ▣ Amebsa and Amoeba are well adapted to the described problem and both give the correct optimal solution;
- ▣ The convergence rate is higher in the Amebsa implementation;
- ▣ The convergence to the optimal solution is faster in the Amebsa implementation (for G- and F-type stars);

Thank you