

# On the application of differential evolution to the analysis of X-ray spectra

Anna Kępa, Barbara Sylwester, Marek Siarkowski, Janusz Sylwester



Space Research Centre, Polish Academy of Sciences, Bartycka 18a, Warsaw

Solar Physics Division, Kopernika 11 Wrocław

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# 1. DEM, elemental abundances



$$\varphi(T_e) = N_e^2 \frac{dV}{dT_e}$$

$N_e$  - electron density

$V$  - plasma volume

$T_e$  - temperature

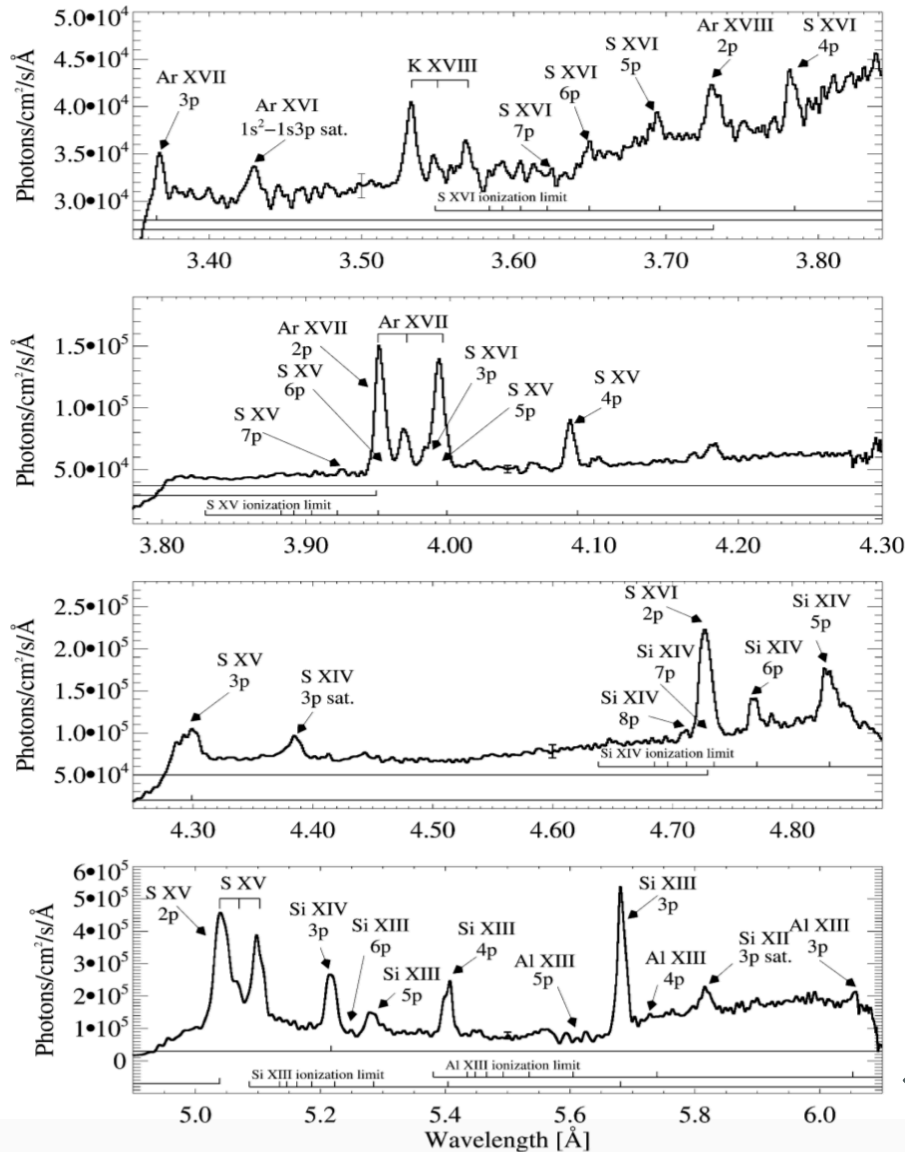
$A_i$  - assumed abundance of an element

$f_i(T_e)$  - emission function

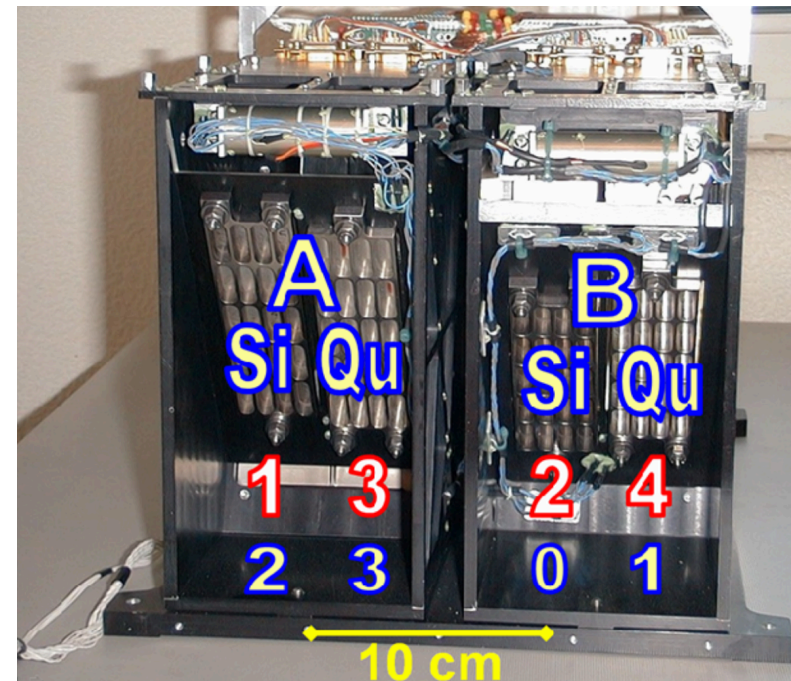
$N$  - number of spectra bands

$$F_i = A_i \int_0^{\infty} f_i(T_e) \varphi(T_e) dT_e \quad i = 1, 2, \dots, N$$

# 1. X-ray spectra, RESIK spectrometer



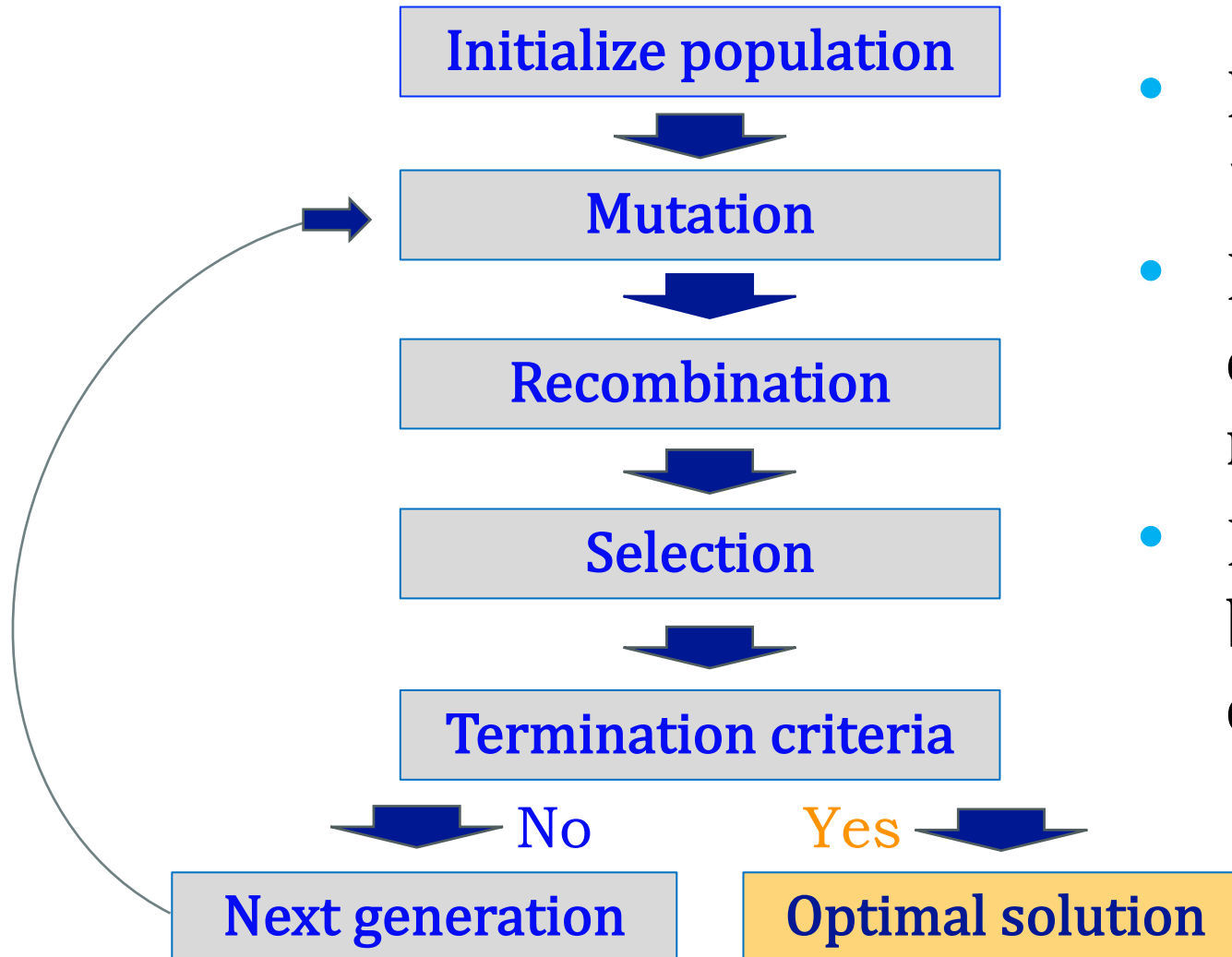
REntgenovsky Spektrometr s Izognutymi Kristalami instrument, consisting of two double-channel X-ray spectrometers, designed to observe solar active region and flare plasmas.



Mission : CORONAS-F  
Operated: 2001 – 2003  
Spectral range: 3.3 – 6.1 Å

Average spectra observed by RESIK for 14 flares  
(the total integration time amounts approximately to 9h)

## 2. Differential evolution (DE) method



- Proposed by Price and Storn in 1995
- It is a stochastic, population-based optimization algorithm for solving nonlinear optimization problem
- Is a very powerful algorithm for black-box optimization (also called derivative-free optimization).

# 3. Differential evolution (DE) method

## 1. Population

Abundances	DEM
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1T

$A_{Si}$	$A_S$	$A_{Ar}$	$A_K$	$T_1$	$\varphi(T_1)$
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2T

$A_{Si}$	$A_S$	$A_{Ar}$	$A_K$	$T_1$	$\varphi(T_1)$	$T_2$	$\varphi(T_2)$
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abundances

DEM

30T

$A_{Si}$	$A_S$	$A_{Ar}$	$A_K$	$\varphi(T_1)$	$\varphi(T_2)$	$\varphi(T_3)$	...	$\varphi(T_2)$	$\varphi(T_N)$
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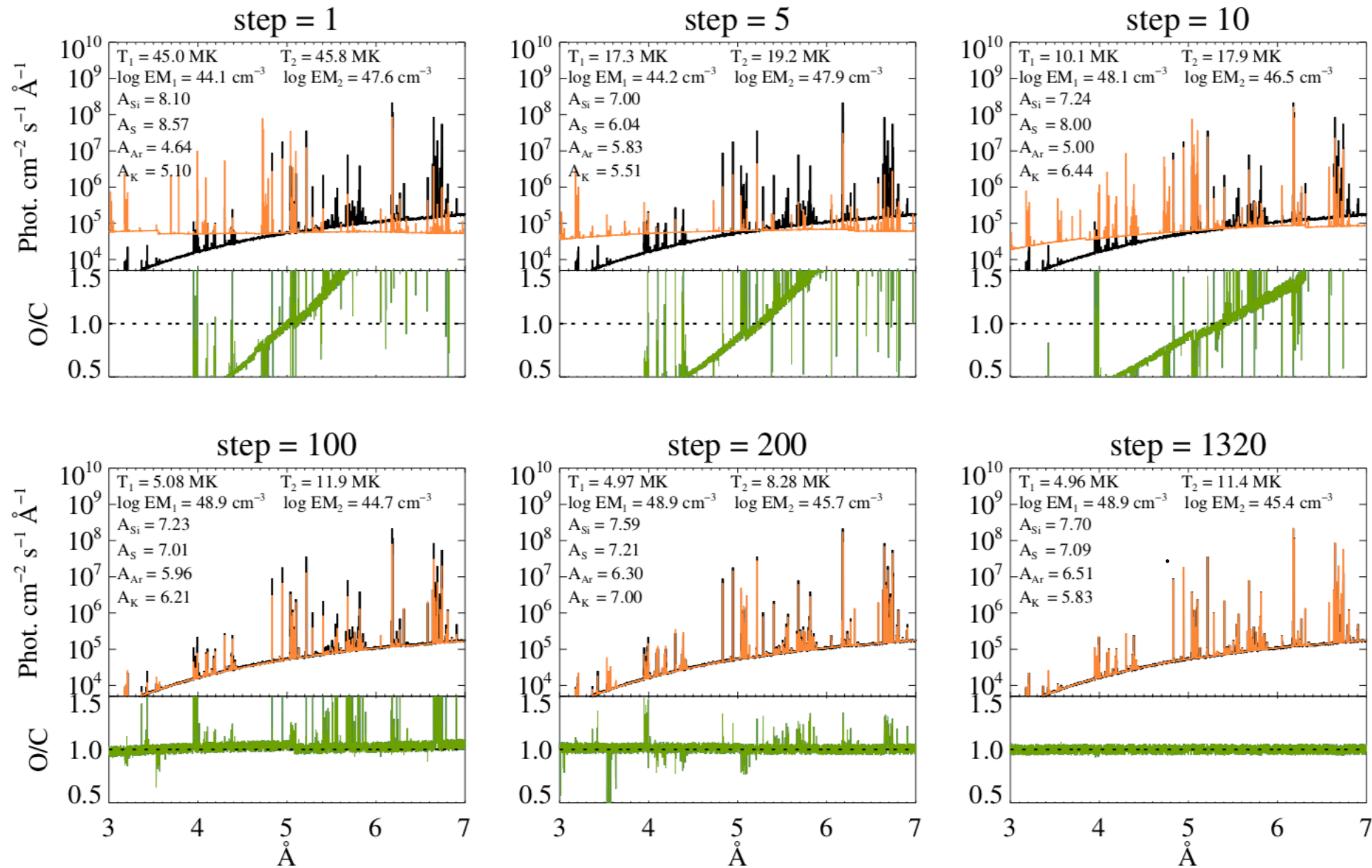
abundances

DEM

N=30

1MK – 30 MK,  $\Delta T=1MK$

# 4. Tests



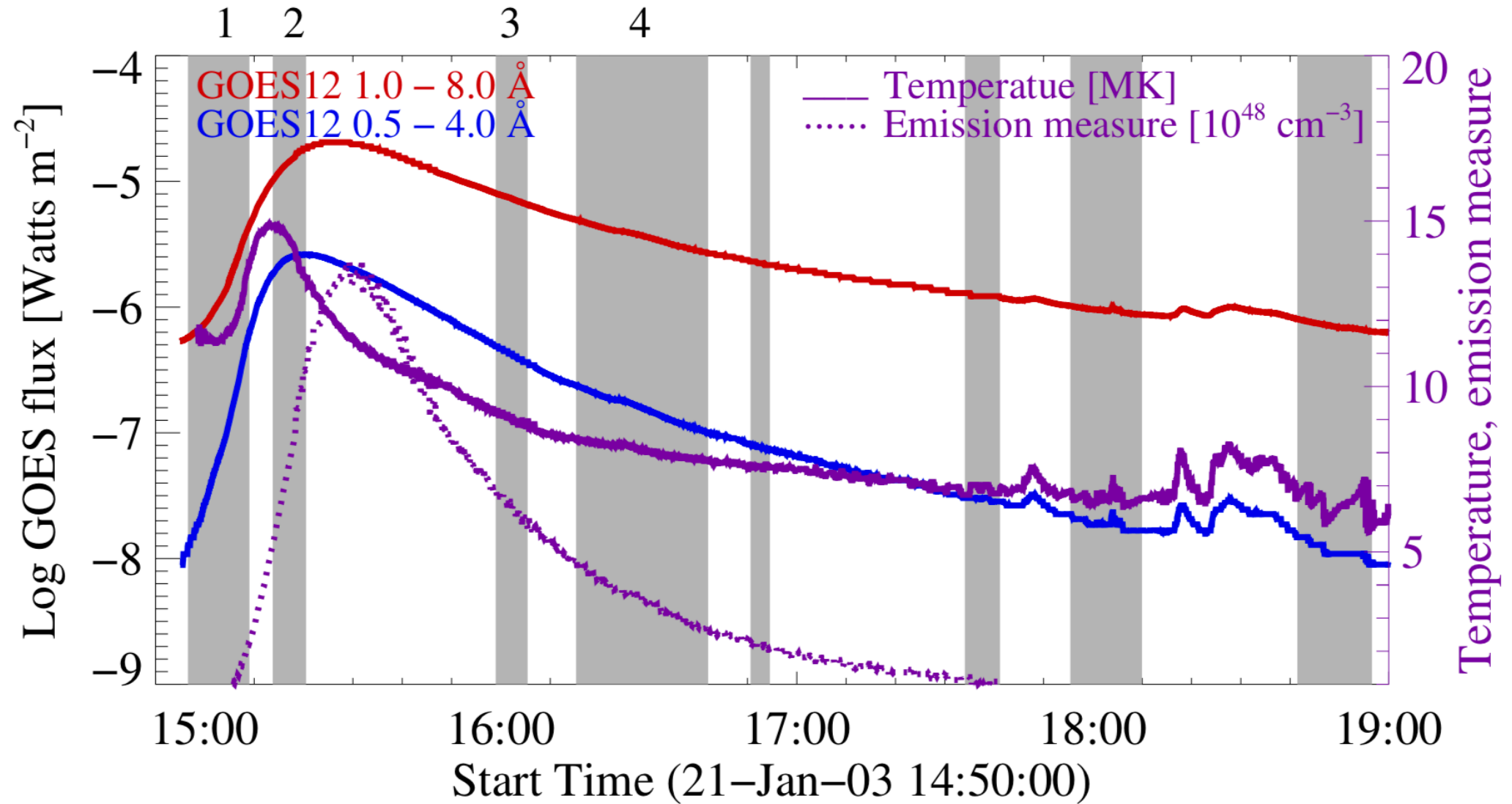
Model 2T

$T_1 = 5$  MK  
 $EM_1 = 1 \times 10^{49}$  cm $^{-3}$

$T_2 = 12$  MK  
 $EM_2 = 2 \times 10^{45}$  cm $^{-3}$

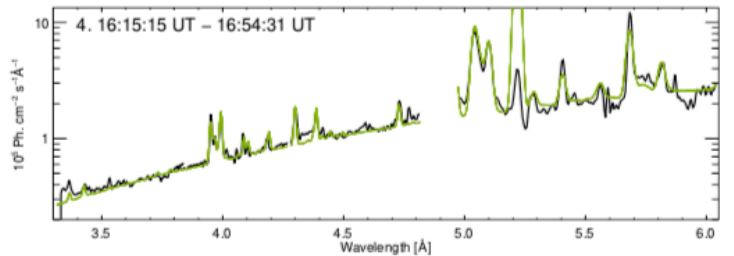
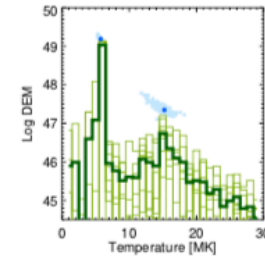
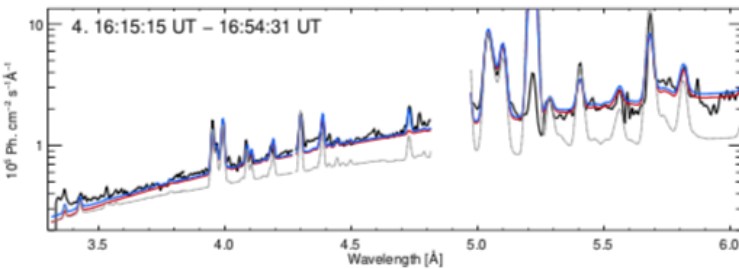
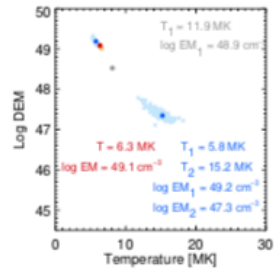
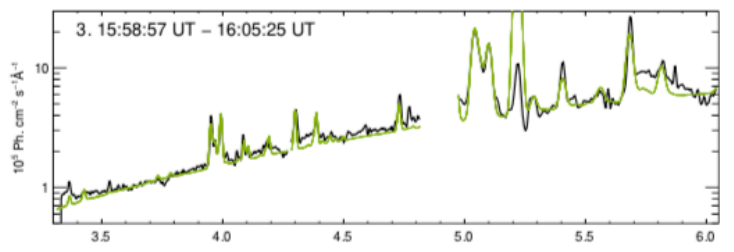
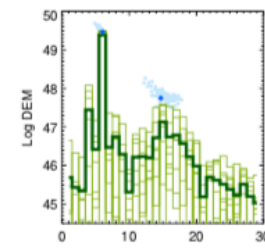
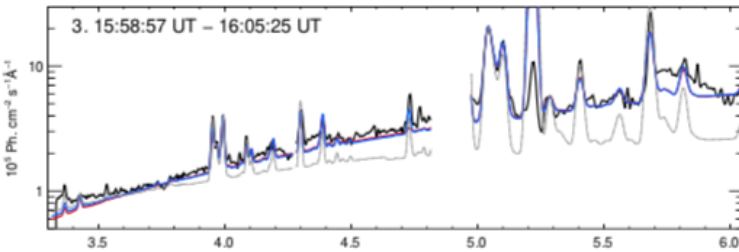
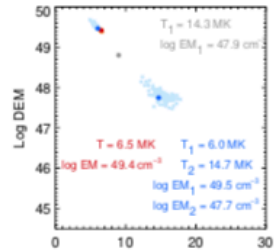
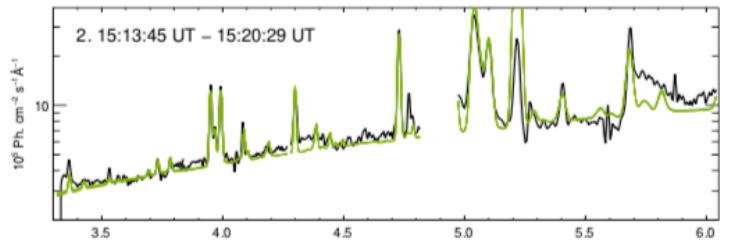
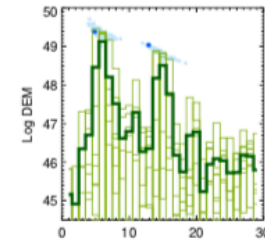
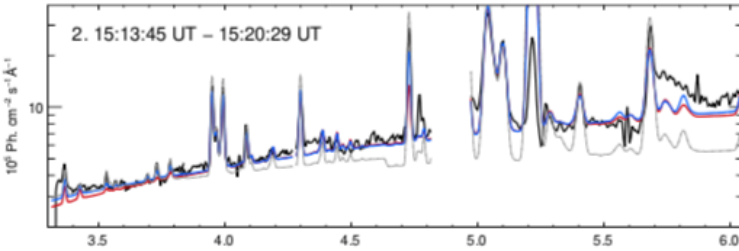
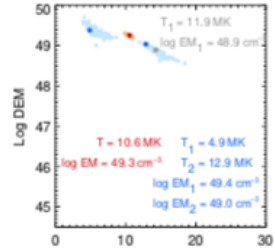
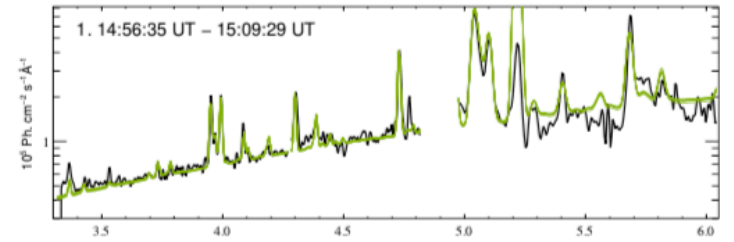
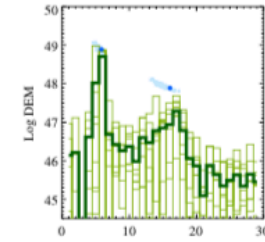
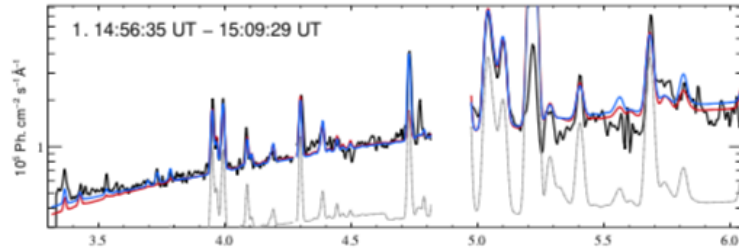
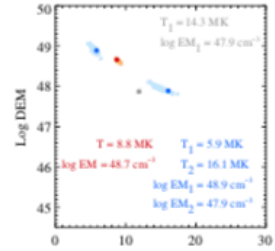
Abu Si = 7.70  
 Abu S = 7.10  
 Abu Ar = 6.50  
 Abu K = 5.9

## 5. Observations





# 6. Results



1T, 2T, GOES

2T, 30T



## 6. Results



	$A_{Si}$	$A_S$	$A_K$	$A_{Ar}$
1. 14:56:35 UT - 15:09:01 UT	$7.43 \pm 0.07$ (1T)	$6.99 \pm 0.05$ (1T)	$5.00 \pm 0.03$ (1T)	$6.37 \pm 0.05$ (1T)
	$7.51 \pm 0.07$ (2T)	$7.10 \pm 0.08$ (2T)	$5.04 \pm 0.22$ (2T)	$6.38 \pm 0.08$ (2T)
	$7.50 \pm 0.04$ (30T)	$7.10 \pm 0.02$ (30T)	$5.03 \pm 0.10$ (30T)	$6.40 \pm 0.01$ (30T)
2. 15:13:45 UT - 15:20:29 UT	$7.29 \pm 0.09$ (1T)	$6.90 \pm 0.05$ (1T)	$5.00 \pm 0.00$ (1T)	$6.37 \pm 0.05$ (1T)
	$7.40 \pm 0.15$ (2T)	$7.03 \pm 0.09$ (2T)	$5.10 \pm 0.29$ (2T)	$6.38 \pm 0.06$ (2T)
	$7.42 \pm 0.05$ (30T)	$7.05 \pm 0.02$ (30T)	$5.06 \pm 0.16$ (30T)	$6.38 \pm 0.01$ (30T)
3. 15:58:57 UT - 16:05:25 UT	$7.45 \pm 0.05$ (1T)	$7.01 \pm 0.03$ (1T)	$5.00 \pm 0.00$ (1T)	$6.40 \pm 0.06$ (1T)
	$7.50 \pm 0.05$ (2T)	$7.04 \pm 0.06$ (2T)	$5.07 \pm 0.21$ (2T)	$6.42 \pm 0.06$ (2T)
	$7.51 \pm 0.01$ (30T)	$7.05 \pm 0.01$ (30T)	$5.03 \pm 0.07$ (30T)	$6.42 \pm 0.01$ (30T)
4. 16:15:15 UT - 16:42:01 UT	$7.48 \pm 0.05$ (1T)	$7.02 \pm 0.04$ (1T)	$5.00 \pm 0.00$ (1T)	$6.40 \pm 0.07$ (1T)
	$7.50 \pm 0.07$ (2T)	$7.04 \pm 0.04$ (2T)	$5.07 \pm 0.33$ (2T)	$6.41 \pm 0.07$ (2T)
	$7.51 \pm 0.01$ (30T)	$7.05 \pm 0.01$ (30T)	$5.03 \pm 0.14$ (30T)	$6.41 \pm 0.02$ (30T)

$A_{Si}=7.53$ ,  $A_S=6.97$ ,  $A_{Ar}=6.35$  - elemental abundances obtained by Sylwester et al. (2015a)

## 7. Conclusions:



- The values of temperature and emission measure calculated based on GOES fluxes using isothermal model of plasma do not allow to reproduce RESIK spectra.
- This (most probably) indicate that coronal set of abundances used by goes ssw analysis package is not generally applicable for detailed analysis of every coronal source.
- The two-components model of plasma better describes RESIK observations then isothermal model (as expected).
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- The values of the average temperatures and the total emission measure (30T model) are very similar to those obtained for the 2T model.
- The values of abundance for silicon, sulphur, and argon don't change during flare evolution.
- Best fit DE abundance values are within uncertainties the same to these obtained by [Sylwester et al. \(2015a\)](#) for the same flare using different approach.
- It was not possible to determine the potassium abundance based the RESIK spectra used in this study (too small potassium line contribution).