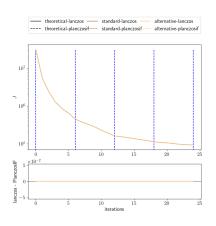
#### Content

- Non linearity induced by H operator :  $(Hx = (1 \alpha)x + \alpha x^3)$ .
- Number of outer loops vs. inner loops.
- Non linearity induced by changing the resolution at outer loop level.
- Varying the projective B matrix option.
- Varying the interpolation method.

# Non linearity induced by H operator :

Full resolution, varying  $\alpha$  parameter with the same relinearization scheme : no=4, ni=6, spectral interpolation and projective B matrix,  $\sigma^o=0.01$ 



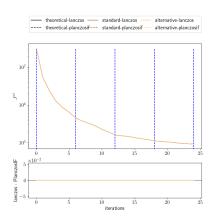
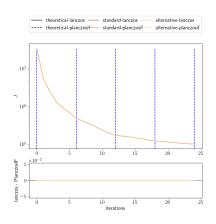


Figure –  $\alpha = 0$ 

FIGURE – 
$$\alpha = 0$$



#### Full resolution; non linear H; J vs J<sup>nl</sup>

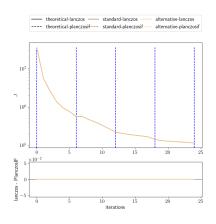


--- theoretical-planczosif--- standard-planczosif--- alternative-planczosif  $10^{7}$  $10^{6}$  $10^{5}$ 15 10 20 lanczos - PlanczosIF iterations

FIGURE –  $\alpha = 0.01$ 

FIGURE –  $\alpha = 0.01$ 



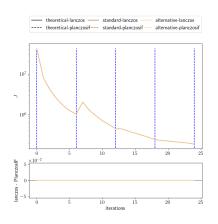


--- theoretical-planczosif--- standard-planczosif--- alternative-planczosif  $10^{7}$  $10^{6}$  $10^{5}$ 15 10 20 lanczos - PlanczosIF iterations

FIGURE –  $\alpha = 0.02$ 

FIGURE –  $\alpha = 0.02$ 



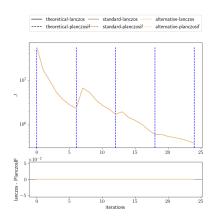


--- theoretical-planczosif--- standard-planczosif--- alternative-planczosif  $10^{7}$ Jul  $10^{6}$ 15 10 20 lanczos - PlanczosIF  $5 \stackrel{\times 10^{-2}}{\leftarrow}$ 

FIGURE –  $\alpha = 0.05$ 

FIGURE – 
$$\alpha = 0.05$$





10<sup>6</sup> - 5 10 15 10

FIGURE –  $\alpha = 0.1$ 

Figure –  $\alpha = 0.1$ 

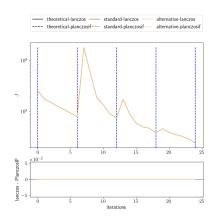
--- theoretical-planczosif--- standard-planczosif--- alternative-planczosif



108

 $\stackrel{}{\mathbb{Z}}$   $10^7$ 

20

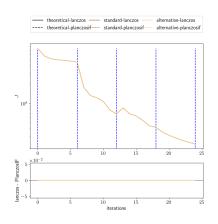


--- theoretical-planczosif--- standard-planczosif--- alternative-planczosif  $10^{11}$  $10^{10}$  $10^{9}$ 15 10 20 lanczos - PlanczosIF iterations

FIGURE –  $\alpha = 0.5$ 

FIGURE –  $\alpha = 0.5$ 





 $10^{9}$ Jul  $10^{8}$ 15 10 20 lanczos - PlanczosIF  $5 \stackrel{\times 10^{-2}}{\leftarrow}$ iterations

--- theoretical-lanczos --- standard-lanczos --- alternative-lanczosi
--- theoretical-planczosif--- standard-planczosif--- alternative-planczosif

FIGURE –  $\alpha = 1$ 

Figure –  $\alpha = 1$ 



#### Conclusion on the non linearity induced by H

- ullet Very sensitive to lpha even for small values.
- The case with  $\alpha=1$  seems better than the case with  $\alpha=0.5...$ 
  - → What could be the reason for it?
- It seems that there are too much inner loops before relinearization but the iteration at which the "jump" occurs seems NOT correlated to the value of  $\alpha$ .
- $\longrightarrow$  Need to study the number of inner iterations vs. outer iterations.

Full resolution, varying the number of inner and outer loops with a non linear H and the same total number of iterations ( $n_o \times n_i = 24$ ) (spectral interpolation and projective B matrix,  $\sigma^o = 0.01$ )

## Full resolution; non linear $H(\alpha = 0.05)$ : $J^{nl}$

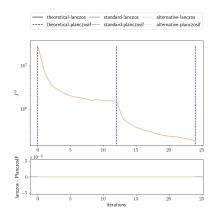


FIGURE –  $n_0 = 2, n_i = 12$ 

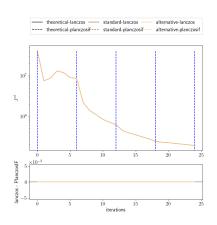


FIGURE –  $n_o = 4$ ,  $n_i = 6$ 



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## Full resolution; non linear $H(\alpha=0.05)$ : $J^{nl}$

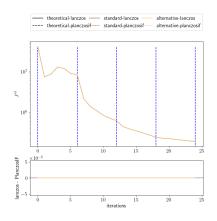


FIGURE – 
$$n_o = 4$$
,  $n_i = 6$ 

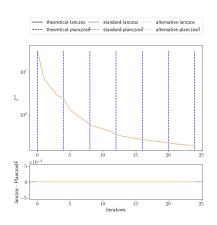


FIGURE – 
$$n_o = 6$$
,  $n_i = 4$ 



#### Full resolution; non linear H ( $\alpha = 0.05$ ): J

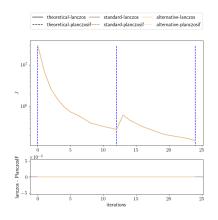


FIGURE –  $n_0 = 2, n_i = 12$ 

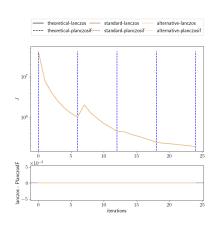


FIGURE –  $n_o = 4$ ,  $n_i = 6$ 



#### Full resolution; non linear H ( $\alpha = 0.05$ ): J

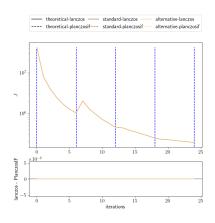


FIGURE –  $n_o = 4$ ,  $n_i = 6$ 

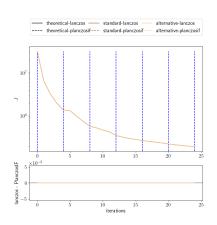


FIGURE – 
$$n_o = 6$$
,  $n_i = 4$ 



## Full resolution; non linear H $(\alpha = 0.1)$ : $J^{nl}$

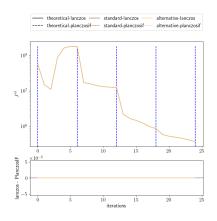


FIGURE –  $n_o = 4$ ,  $n_i = 6$ 

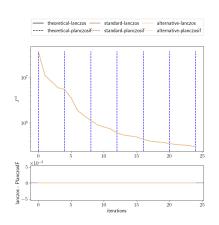


FIGURE – 
$$n_o = 6$$
,  $n_i = 4$ 



#### Full resolution; non linear H ( $\alpha = 0.1$ ): J

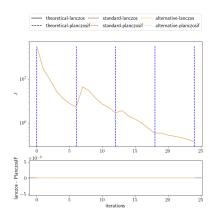


FIGURE –  $n_o = 4$ ,  $n_i = 6$ 

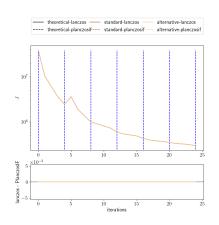


FIGURE – 
$$n_o = 6$$
,  $n_i = 4$ 



## Full resolution ; non linear H (lpha=1) : $J^{nl}$

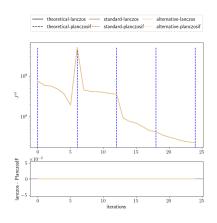


FIGURE –  $n_o = 4$ ,  $n_i = 6$ 

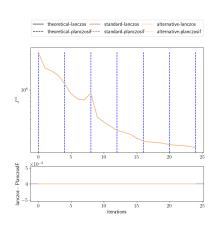


FIGURE –  $n_o = 6$ ,  $n_i = 4$ 



#### Full resolution; non linear H ( $\alpha = 1$ ): J

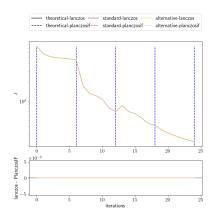


FIGURE –  $n_o = 4$ ,  $n_i = 6$ 

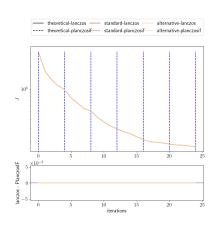


FIGURE – 
$$n_o = 6$$
,  $n_i = 4$ 

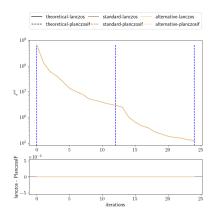


#### Conclusion on the number of inner and outer loops

- As expected, the assimilation scheme with the more outer loops is equal or better than the others.
- There is often a "jump" in the linear cost functions just after relinearization, BUT it seems not necessarily correlated to the behaviour of the non linear cost function (or it is not trivial).
- Problem: The first inner iterations in the first case with 12 inner iterations seems better than the case with 6 inner iterations whereas the case with 4 inner iterations seems better than the case with 6 inner iterations:
  - $\longrightarrow$  The problem is too much dependant on the initial background and observation states that are randomly generated (?): there is a difference of  $10^7-10^8$  in the cost function at the beggining in these cases!

# Non linearity induced by the change of resolution between the outer loops :

(Linear H operator, spectral interpolation and projective B matrix,  $\sigma^o = 0.01$ , no = 2, ni = 12)



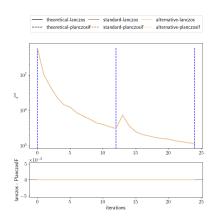
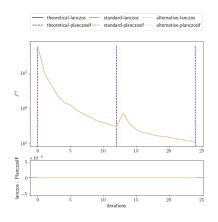


FIGURE – resolutions : 11 > 101FIGURE – resolutions : 51 > 101(The jump is also present in the  $J^o$  and the residue)



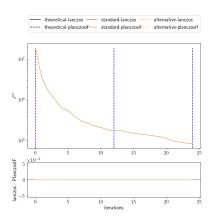
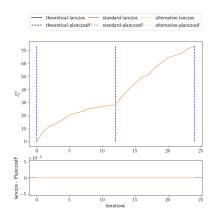


FIGURE – resolutions : 51 > 101

FIGURE – resolutions : 91 > 101



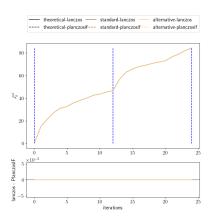
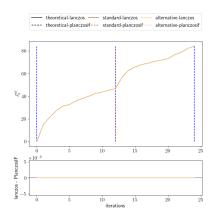


FIGURE – resolutions : 11 > 101

FIGURE – resolutions : 51 > 101



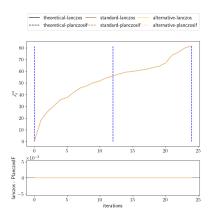
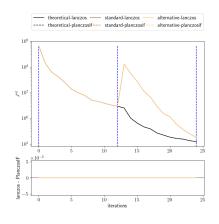


FIGURE – resolutions : 51 > 101

FIGURE – resolutions : 91 > 101

# Varying the projective B matrix option :

(Linear H operator, spectral interpolation,  $\sigma^o = 0.01$ , no = 2, ni = 12)



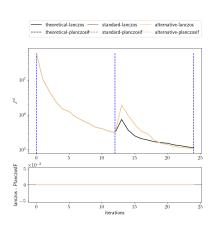
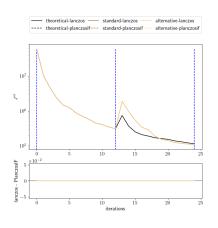


FIGURE – resolutions : 11 > 101

FIGURE – resolutions : 51 > 101



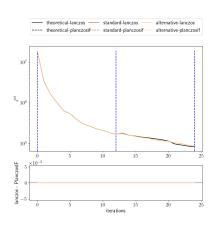
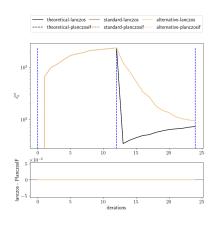


FIGURE – resolutions : 51 > 101

FIGURE – resolutions : 91 > 101



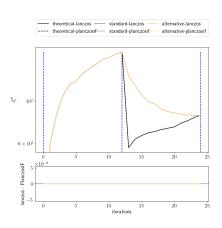
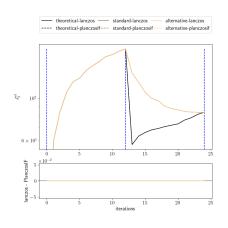


FIGURE – resolutions : 11 > 101

FIGURE – resolutions : 51 > 101



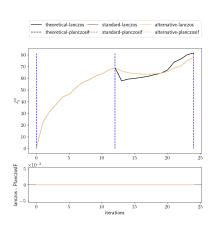


FIGURE – resolutions : 51 > 101

FIGURE – resolutions : 91 > 101

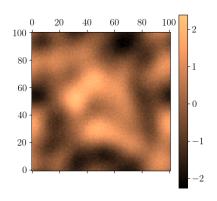
#### Short conclusions on the projective B matrix (1)

- There might be a jump in the cost function at the first inner iteration of a new outer loop which is also present in the residue and in the  $J^o$  and seems due to the change of resolution..
- There is no differences between the methods if the B matrix is projective and if the interpolation is transitive (spectral).
- There are differences if the B matrix is not projective, and it occurs after the first outer loop.
- The higher the change of resolution, the higher the difference between the methods.

#### Short conclusions on the projective B matrix (2)

- In these cases, the alternative and standard methods give the same results and differ from the theoretical one when the B matrix is not projective.
- The theoretical method seems to give the same results for the  $J^o$  with or without a projective B matrix while the  $J^b$  is different (and shows a decrease after the first outer loop).

### Checking the effects of $\sigma_{\it var}^b$



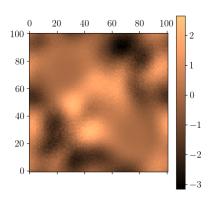


Figure – 
$$\sigma_{var}^b = 0.1$$

Figure –  $\sigma_{var}^b = 1$ 



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