

Integral Operator Spectral Computations using PETSc/SLEPc libraries

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Outline

- The Integral Problem
- Approximation and Discretization
- Iterative Refinement
- Multipower Double Iteration
- Implementation Using PETSc and SLEPc.
- Numerical tests
- Conclusions



Use of Parallel Libraries

- Illustrate
 - Advantages of parallel libraries
 - to support programming mathematical models
- Model
 - Integral operator on a very large interval
 - Radiative transfer in stellar atmospheres
 - Spectral computations \leftrightarrow eigenvalues of matrix discretizations



The Integral Problem

- Radiative transfer in stellar atmospheres $Tx - x = f$,
- $T : X \rightarrow X$, where $X = L^1([0, t^*])$

$$(Tx)(t) = \frac{\varpi}{2} \int_0^{t^*} \left(\int_1^\infty \frac{\exp(-|t - t'| \mu)}{\mu} d\mu \right) x(t') dt', \quad t \in [0, t^*].$$

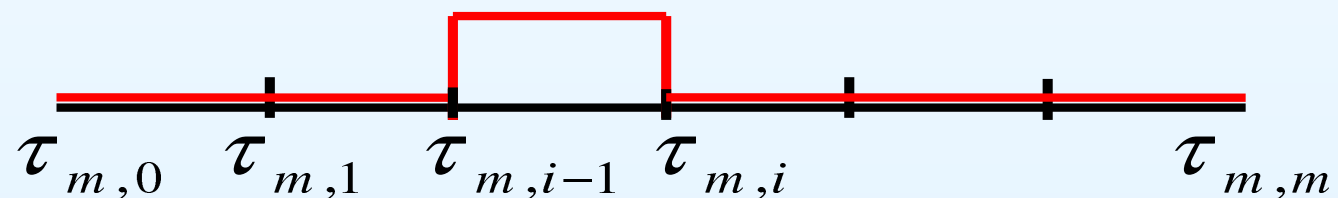
- t^* is the optical depth of the stellar atmosphere
- $\varpi \in]0, 1[$ is the albedo
- T has a singularity at the origin ($t = 0$).

Here we will compute the spectral elements (eigenvalues and eigenfunctions) of the operator T .



Approximation and Discretization

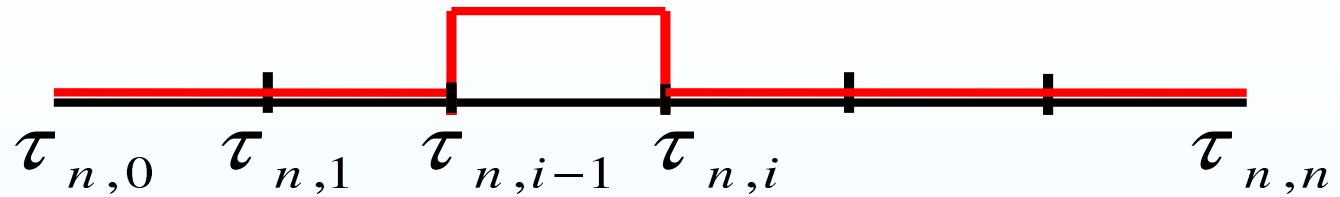
- Mathematical models for Scientific and Engineering problems need to be discretized for computational purposes into large dimensional matrices
- because either they do not have an analytic solution or it is too much complicated to deal with.
- The problem $T\varphi = \lambda\varphi$ defined in a infinite dimensional space X
- is approximated by $T_m\varphi_m = \lambda_m\varphi_m$ in X_m ,
- m large enough.



Iterative Refinement

- To solve the approximating problem $T_m \varphi_m = \lambda_m \varphi_m$ in X_m .
- without solving $A_m x_m = \lambda_m x_m$,
- we use an iterative refinement strategy
- to improve the eigenvalues and vectors of a moderate size matrix A_n corresponding to a discretization in $X_n, n \ll m$.
- The refinement formula uses mainly matrix-vector multiplications with
- $A_m (m \times m)$ representing T in a very fine discretization space X_m .
- Large matrices are built and stored in a distributed manner among the processors,
- The iterative refinement provides accurate eigenpairs corresponding to a larger problem.





- The existence of the operator T linking the subspaces X_m and X_n allows the derivation of formulae to extend or restrict vectors from one of the finite dimensional subspaces to the other.
- The extension procedure will be denoted by E and the restriction by R

Initializations

- Given matrices A_n and A_m of dimensions n and m
- compute eigenpair of A_n (eigenvalue λ and eigenvector u) not necessarily the dominant, computed for instance Arnoldi's method
- The left eigenvector of A_n , say v , will be used as a normalization factor.

The procedure S returns y , given a vector w

- Solve the $(n + 1) \times n$ linear system

$$\begin{cases} (A_n - \lambda I)t = R w - (v^T R(w))u \\ v^T t = 0 \end{cases}$$

- compute the extension $y = E(A_n t) / \lambda$.



Multipower Double Iteration

Algorithm:

1. Compute the eigenpair of A_n to be refined: λ, u and the left eigenvector v .
2. Extend eigenvalue: $x = E(u)$;
3. Compute the residual: $residual = norm(A_m x - \lambda x)$
4. While $residual$ less or equal a given tolerance
 - (a) for $j=1,2,\dots,itpower$
 - i. $\mu = v^T R(A_m x)$
 - ii. $x = A_m x / \mu$
 - (b) $w = A_m x - \mu x$
 - (c) Update refined eigenvector: $x = x - S(w)$
 - (d) compute the new residual: $residual = norm(A_m x - \lambda x)$



PETSc/SLEPc

PETSc: Portable, Extensible Toolkit for Scientific Computation

SLEPc: Scalable Library for Eigenvalue Problem Computations

PETSc

| | | | | | | |
|--------------------------------|-----------------------------|----------------|----------------------|----------------|------------------|-----------------|
| Nonlinear Systems | | | Time Steppers | | | |
| Line Search | Trust Region | Other | Euler | Backward Euler | Pseudo Time Step | Other |
| Krylov Subspace Methods | | | | | | |
| GMRES | CG | CGS | Bi-CGSTab | TFQMR | Richardson | Chebyshev Other |
| Preconditioners | | | | | | |
| Additive Schwarz | Block Jacobi | Jacobi | ILU | ICC | LU | Other |
| Matrices | | | | | | |
| Compressed Sparse Row | Block Compressed Sparse Row | Block Diagonal | Dense | Other | | |
| Vectors | Index Sets | | | | | |
| | Indices | Block Indices | Stride | Other | | |

SLEPc

| | | | |
|---------------------------|------------------|---------|--------------------|
| SVD Solvers | | | |
| Cross Product | Cyclic Matrix | Lanczos | Thick Res. Lanczos |
| Eigensolvers | | | |
| Krylov-Schur | Arnoldi | Lanczos | Other |
| Spectral Transform | | | |
| Shift | Shift-and-invert | Cayley | Fold |

Libraries and the Algorithm

- Computation of initial approximations: eigenvalue and the corresponding right and left eigenvectors of matrix A_n
 - carried out only once with SLEPc, for instance with Arnoldi eigensolver
- Matrix-vector products with matrices A_n and A_m (also used in the restriction and extension from one grid to the other),
 - computed in a distributed way, are performed in PETSc with MatMult operation ;
(all matrices are sparse and distributed)



Libraries and the Algorithm (cont)

- Vector operations, inner product, norm, addition and scaling,
 - are performed with the VecNorm, VecAXPY and VecScale routines from PETSc.
- Solution of linear systems (involved in procedure S)
 - are also carried out in PETSc.
 - Either by an LU decomposition of dimension $(n + 1) \times n$ with partial pivoting.
(This requires a modification of the corresponding routine in PETSC).
 - or by an iterative solver.



Libraries and the Algorithm (cont)

- Iterative solver.

We use GMRES applied to $A_n - \lambda_n I$.

- In order to get t satisfying $v^T t = 0$, we apply $I - uv^T$ to all Krylov vectors built by GMRES.

(An implementation of the above scheme requires a modification of GMRES)

- $(A_n - \lambda I)q$, the candidate vector to be added to the basis, is pre-multiplied by the projector $I - uv^T$.
 - Instead of $I - uv^T$, we consider the projector $I - vv^T$, since it can be implemented very easily in PETSc with function `KSPSetNullSpace` and it also guarantees $v^T t = 0$.
- PETSc provides many other iterative linear solvers and some preconditioners to improve the convergence .



Computer System Used

Odin cluster, located at Universidad Politécnica de Valencia.

- 55 dual-processor nodes
- 2.8 GHz Pentium Xeon processors , 1 GB of memory per node.
- interconnected with a high-speed SCI network with 2-D torus topology
- only one processor per node was used in the tests.



Numerical Tests

Performance analysis of the algorithm.

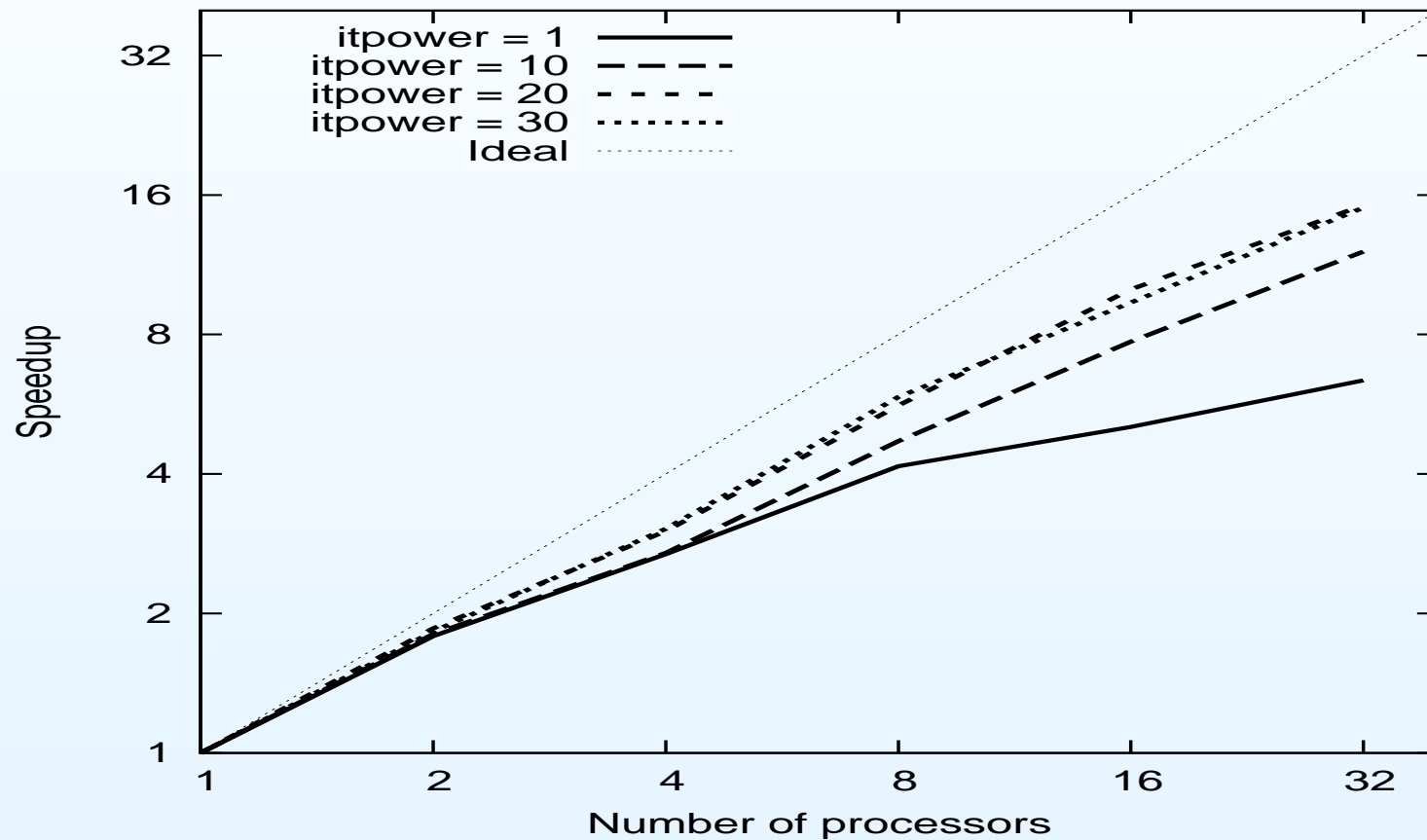
Several tests varying the number of processors and the algorithmic choices:

- influence of parameter *itpower* (number of power iterations inside the refinement formula)
- influence of the dimension of initial problem
- effect of different preconditioners.

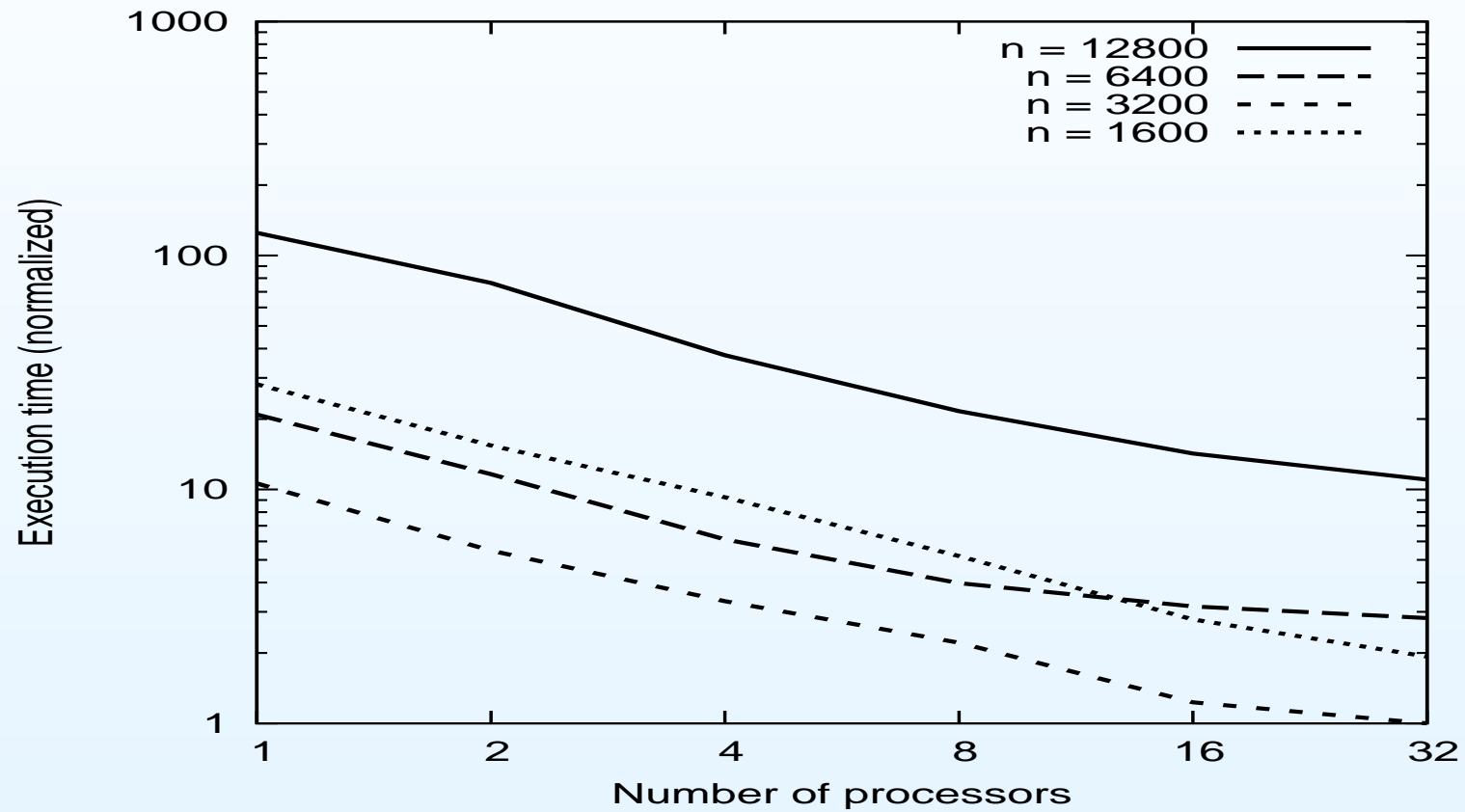
A tolerance of 10^{-12} on the residual



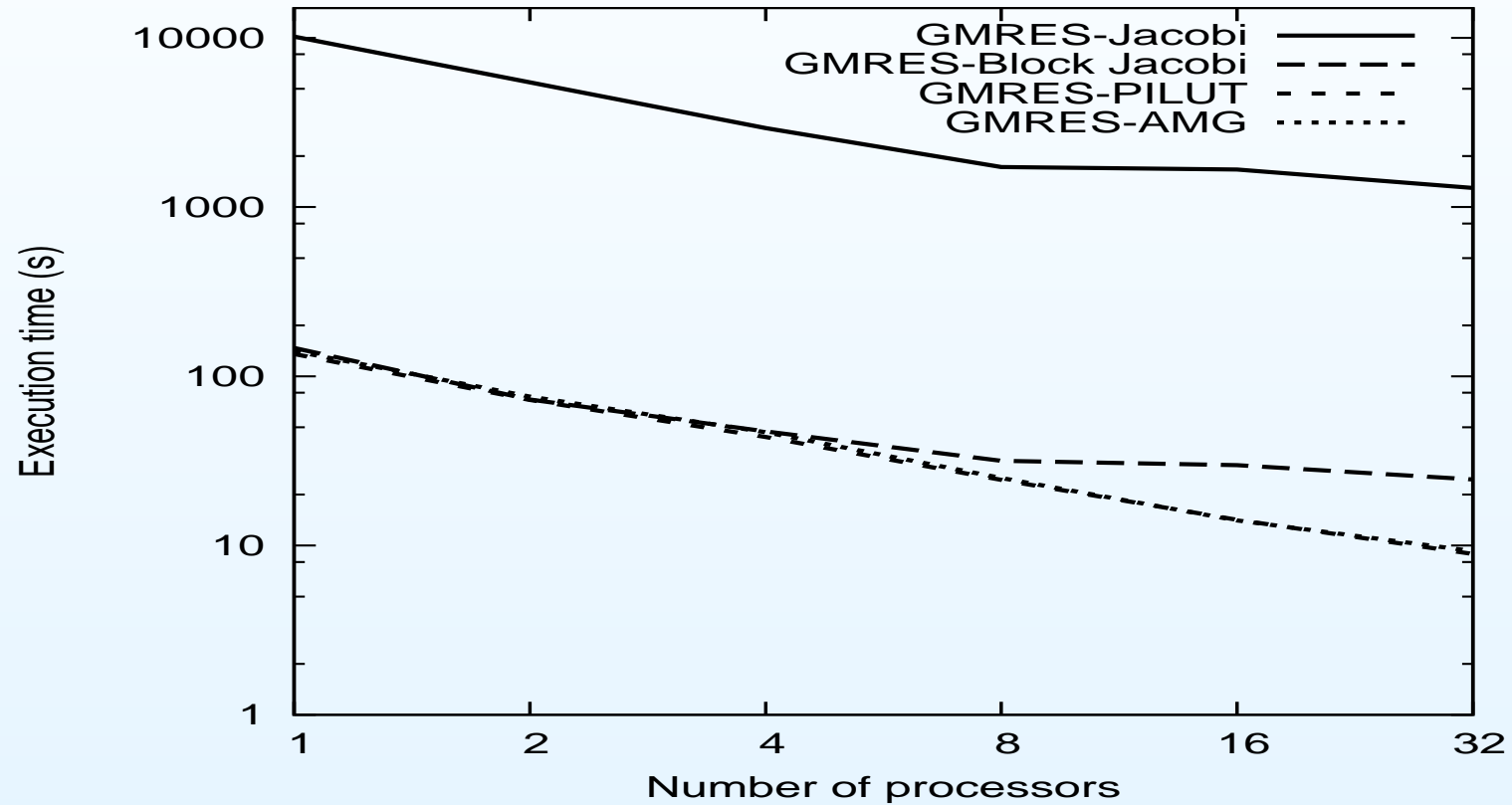
Speedup with different values of itpower



Times for a refined solution $m = 64000$, with several values of n



Several preconditioners to accelerate GMRES



Conclusions

- We presented a parallel code for the Multipower Defect Correction Method
 - refines eigenvalues/eigenfunctions from rough approximations
 - is effective for the computation of specific eigenvalues
- An implementation using libraries PETSc/SLEPc
 - shows good behaviour on a distributed parallel environment



References

- [1] M. Ahues, F. D. d'Almeida, A. Largillier, P. B. Vasconcelos, "Defect correction for spectral computations for a singular integral operator", *Communications on Pure and Applied Analysis* **5(2)** pp. 241–250 (2006).
- [2] F. D. d'Almeida and P. B. Vasconcelos, "Spectral Computations: from Operators to Matrices", *Proc. Appl. Math. Mech.* **7** 1022801–1022802 (2008).
- [3] S. Balay, K. Buschelman, V. Eijkhout, W. D. Gropp, D. Kaushik, M. Knepley, L. C. McInnes, B. F. Smith, H. Zhang. "PETSc users manual", Tech. Rep. **ANL-95/11 - Revision 2.3.3**, Argonne National Laboratory (2007).
- [4] V. Hernandez, J. E. Roman, V. Vidal. "SLEPc: A scalable and flexible toolkit for the solution of eigenvalue problems", *ACM Transactions on Mathematical Software* **31 (3)** pp.351–362 (2005).
- [5] V. Hernandez, J. E. Roman, A. Tomas, V. Vidal, "SLEPc users manual", Tech. Rep, **DSIC-II/24/02 - Revision 2.3.3**", D. Sistemas Informáticos y Computación, Universidad Politécnica de Valencia (2007).

