University of Numerical Simulation Laboratory

Time integration with PETSc

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Outline

- 1 Lecture 1: Introduction and Installation
- 2 Lecture 2: Data structures and classes overview
- 3 Lecture 3: Data structures and classes continued
- 4 Lecture 4: Solving ODE IVPs with TS
- 5 Lecture 5: Solving BVPs with TS and SNES
- 6 Lecture 6: Solving DAE IVPs with TS

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Source code for example problems

All example codes from these lectures are available in the

Course Materials / PETSc / Examples

directory on Blackboard.

The (updated) pdf of these slides is also available on Blackboard.

PETSc

```
https://www.mcs.anl.gov/petsc/
```

PETSc (|' petsi:|) stands for the Portable, Extensible Toolkit for Scientific computing.

It provides a suite of libraries for the numerical solution of partial differential equations (PDEs) and related problems.

- Architecture
 - tightly coupled (e.g. Cray, Blue Gene)
 - loosely coupled such as network of workstations
 - GPU clusters (many vector and sparse matrix kernels)
- Operating systems (Linux, Mac, Windows, BSD, proprietary Unix)
- Any compiler
- Real/complex, single/double/quad precision, 32/64-bit int
- Usable from C, C++, Fortran 77/90, Python, and MATLAB
- Free to everyone (2-clause BSD license), open development
- 10¹² unknowns, full-machine scalability on Top-10 systems
- Same code runs performantly on a laptop



Philosophy: Everything has a plugin architecture

- Vectors, Matrices, Coloring/ordering/partitioning algorithms
- Preconditioners, Krylov accelerators
- Nonlinear solvers, Time integrators
- Spatial discretizations/topology

Algorithms, (parallel) debugging aids, low-overhead profiling. Composability

• Try new algorithms by choosing from product space and composing existing algorithms (multilevel, domain decomposition, splitting).

Experimentation

- It is **not** possible to pick the best solver a priori.
 What will deliver best/competitive performance for a given physics, discretization, architecture, and problem size?
- PETSc's response: expose an algebra of composition so new solvers can be created at runtime.
- Important to keep solvers decoupled from physics and discretization because we also experiment with those.



- Computational Scientists
 - PyLith, Underworld, PFLOTRAN, MOOSE, Proteus, PyClaw, CHASTE
- Algorithm Developers (iterative methods and preconditioning)
- Package Developers
 - SLEPc, TAO, Deal.II, Libmesh, FEniCS, PETSc-FEM, MagPar, OOFEM, FreeCFD, OpenFVM
- Hundreds of tutorial-style examples
- Hyperlinked manual, examples, and manual pages for all routines
- Support from petsc-maint@mcs.anl.gov, petsc-users@mcs.anl.gov

Role of PETSc

Developing parallel, nontrivial PDE solvers that deliver high performance is still difficult and requires months (or even years) of concentrated effort.

PETSc is a toolkit that can ease these difficulties and reduce the development time, but it is **not** a black-box PDE solver, nor a silver bullet.

— Barry Smith

PETSc installation

Installing on your own machine (instructions to follow)

Installing on a cluster:

- Don't do it (generally).
- Use pre-built install.
- Consult with computing staff if not available.

Obtaining PETSc source code

- Specific releases, zipped tarballs
 http://www.mcs.anl.gov/petsc/download/
- Git repository [preferred] https://bitbucket.org/petsc/petsc/

Why is Git preferred?

- Public development repository, you can get any development version.
- All releases are just tags: eg. v3.7.6
- Easily rollback changes and releases.

Unpacking PETSc

Clone from repository:

```
$ git clone https://bitbucket.org/petsc/petsc.git
$ git checkout v3.7.6
```

OR

Unpack the archive:

```
$ tar xzf petsc.tar.gz
```

Configuring PETSc

- Set environment variable PETSC_DIR to the installation root directory
- Choose a value for PETSC_ARCH (perhaps c-debug for a standard debug build)
- Run the configuration utility
 - \$PETSC_DIR/configure [--help]
- May require additional dependencies
 - Read the output message if the configure fails, should tell you why, and suggest configure options to help

External libraries

External libraries can be downloaded during the configuration phase.

For example, MUMPS and SuperLU_dist (efficient algorithms for direct solving of linear systems) can be obtained with

--download-mumps --download-scalapack

and

--download-superlu_dist --download-metis --download-parmetis

respectively.

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Lecture resource Overview Installation Using Exercises

Buidling PETSc

After successful configure, run

- \$ make
- \$ make test
- \$ make streams

Enabling PETSc

PETSc requires a couple of environment variables to be set:

- PETSC_DIR the top level directory of PETSc
- PETSC_ARCH the architecture for which PETSc has been built

Allows multiple ARCH types built on a given system, which can easily be swapped for your specific application code.

ie., having a version configured with debugging flags enabled, and a version without.

Generally on a cluster, PETSC_ARCH is left empty, and only an optimized build is maintained.



Using PETSc on plato.usask.ca

I've built a version of PETScfor use throughout these lectures. Add the following to your ~/.bashrc file:

source /home/krg958/petsc/math314.env

This sets up the required environment for compiling PETSc application programs. The programs can then be run as any other MPI programs. eg. with the Slurm job scheduler (template given with examples):

\$ sbatch submit_template.slurm

More info about submitting jobs on plato can be found here

It is important that you edit at least the following for each submission:

- executable name
- maximum runtime
- maximum RAM

Installing yourself

Exercise 1: Personal installation

Install PETSc v3.7.6 on a machine you use regularly. Set it up with the following properties

- configured with MUMPS with debugging symbols
- PETSC_ARCH=MUMPS-debug

Install a second version with

- configured with MUMPS and no debugging symbols
- PETSC_ARCH=MUMPS-opt

Testing your PETSc environment

Exercise 2: Testing memory bandwidth of your system

With PETSC_DIR and PETSC_ARCH set appropriately for your current system:

- Build the MPIVersion.c example code.
- Run the MPIVersion executable. What kind of memory bandwidth does it show? What does memory bandwidth mean?
- Try running with 1, 2, 4, 8, 16, 32 cores.

Recall that running jobs on a cluster should be done by submission with the appropriate job scheduler.

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Objects Vectors (Vec) Matrices (Mat) Linear system solvers (KSP) Exercises Additional info

PETSc data types

Examples.

- PetscInt
 - defaults to 32bit integer
 - can be 64bit int if you're dealing with many unknowns (--with-64-bit-indices)
- PetscScalar
 - Primary type for your unknowns, depending on configuration can be:
 - Double precision real (default) or complex
 - Single precision
 - Quad precision
- PetscReal
 - Same precision as PetscScalar, but always real

PETSc hierarchy

Chapter ?? TS - Initial value solvers Chapter ?? SNES - Nonlinear solvers Chapter ?? KSP - Linear solvers PC - Preconditioners Chapter ?? Vec - Vectors Mat - Matrices DM - Data management MPI BLAS LAPACK

PetscObject

Every object in PETSc supports a basic interface

Function	Operation
Create()	create the object
<pre>Get/SetName()</pre>	name the object
<pre>Get/SetType()</pre>	set the implementation type
<pre>Get/SetOptionsPrefix()</pre>	set the prefix for all options
SetFromOptions()	customize object from command line
SetUp()	perform other initialization
View()	view the object
Destroy()	cleanup object allocation

Also, all objects support the -help option.

Options

Ways to set options:

- Command line
- Filename in the third argument of PetscInitialize()
- ~/.petscrc
- \$PWD/.petscrc
- \$PWD/petscrc
- PetscOptionsInsertFile()
- PetscOptionsInsertString()
- PETSC_OPTIONS environment variable
- command line option -options_file [file]

Vectors (Vec)

- Extension of arrays.
 - Parallel (global) representations
 - Serial (local) representations
- Think of them just like vectors in linear algebra.
- Used most often to store:
 - solution to your problem
 - residuals nonlinear and linear
- Can be used to hold location dependent field data for the problem as well.
- Can extract data as arrays for manipulation.

Distributed Vec

Parallel vector stored on 3 processors, as an example

$$\mathbf{u}_{global} = \begin{bmatrix} u_0 \\ u_1 \\ u_2 \\ u_3 \\ u_4 \\ u_5 \\ u_6 \\ u_7 \end{bmatrix}$$

$$\mathbf{u}_{global} = \begin{bmatrix} u_0 \\ u_1 \\ u_2 \\ u_3 \\ u_4 \\ u_5 \\ u_6 \\ u_7 \end{bmatrix} \qquad \begin{cases} \mathbf{u}_{local}^{(0)} = \begin{bmatrix} u_0 & u_1 & u_2 & \mathbf{u}_{ghost}^{(0)T} \end{bmatrix}^T \\ \mathbf{u}_{local}^{(1)} = \begin{bmatrix} u_3 & u_4 & u_5 & \mathbf{u}_{ghost}^{(1)T} \end{bmatrix}^T \\ \mathbf{u}_{local}^{(2)} = \begin{bmatrix} u_6 & u_7 & \mathbf{u}_{ghost}^{(2)T} \end{bmatrix}^T \end{cases}$$

Vec operations

```
Man pages:
```

http:

//www.mcs.anl.gov/petsc/petsc-current/docs/manualpages/Vec/index.html

- Things you expect with vectors:
 - axpy, norms, dot products, etc.
- Explicit access to entries:
 - VecGetArray(), VecRestoreArray()
 - and their read only variants
- Parallel communication:
 - assembly, scatter, gather

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Matrices (Mat)

What are PETSc matrices?

• Linear operators on finite dimensional vector spaces.

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Matrices (Mat)

What are PETSc matrices?

- Linear operators on finite dimensional vector spaces.
- Fundamental objects for storing stiffness matrices and Jacobians
- Each process locally owns a contiguous set of rows
- Supports many data types
 - AIJ, Block AIJ, Symmetric AIJ, Block Diagonal, etc.
- Supports structures for many packages
 - MUMPS, SuperLU, UMFPack, Hypre, Elemental

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Distributed Mat

Nonzero entries of a matrix stored on 3 processors.

Γ	1	2	0	3	0	0	4	0]
	5	6	7	0	0	8	9	0
	0	10	11	12	0	0	13	14
	0	0	15	16	17	0	0	18
	19	0	0	20	21	22	23	0
	0	24	0	0	25	26	27	28
	0	29	0	0	0	30	31	32
L	33	0	0	34	35	0	36	37

Proc 0

Proc 1

Proc 2

Matrix Polymorphism

The PETSc Mat has a single user interface,

- Matrix assembly: MatSetValues()
- Matrix-vector multiplication: MatMult()
- Matrix viewing: MatView()

but multiple underlying implementations.

- AIJ, Block AIJ, Symmetric Block AIJ,
- Dense, Elemental
- Matrix-Free
- etc.

A matrix is defined by its interface, not by its data structure.



How to create matrices

- MatCreate(MPI_Comm, Mat *)
- MatSetSizes(Mat, int m, int n, int M, int N)
- MatSetType(Mat, MatType typeName)
- MatSetFromOptions(Mat)
 - Can set the type at runtime
- MatSetBlockSize(Mat, int bs)
- MatXAIJSetPreallocation(Mat,...)
- MatSetValues(Mat,...)
 - MatSetValuesLocal, MatSetValuesStencil
 - MatSetValuesBlocked
- MatAssemblyBegin/End

What can we do with a matrix that doesn't have entries?

Iterative solvers for Au = b

• Finding solutions in the Krylov subspace:

$$\{b, Ab, A^2b, A^3b, \dots\}$$

- Convergence rate depends on the spectral properties of the matrix
 - Existence of small polynomials $p_n(A) < \epsilon$ where $p_n(0) = 1$.
 - condition number $\kappa(A) = ||A|| ||A^{-1}|| = \sigma_{\mathsf{max}}/\sigma_{\mathsf{min}}$
 - ullet distribution of singular values, spectrum Λ_ϵ pseudospectrum Λ_ϵ

Krylov subspace problem (KSP)

Solving linear systems:

$$Au = b$$

- Various Krylov methods:
 - GMRES (gmres)
 - Conjugate gradient (cg)
 - Biconjugate gradient stabilized (bcgs)
 - etc
- Direct methods (external packages recommended):
 - LU factorization
 - Cholesky factorization

How to set up a linear solver

- KSPCreate(MPI_Comm, KSP *)
- KSPSetOperators(KSP, Mat A, Mat A_p)
- KSPSetFromOptions(KSP)
 - Can set all aspects of solver at runtime
- KSPGetPC(KSP,PC *)
 - Explicitly get the preconditioner to manipulate
 - can be set from command line if KSPSetFromOptions was used
- KSPSolve(KSP, Vec b, Vec u)

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Preconditioning?

Definition (Preconditioner)

A preconditioner \mathbf{P} is a method for constructing a matrix (just a linear function, not assembled!) $P^{-1} = \mathbf{P}(A, A_p)$ using a matrix A and extra information A_p , such that the spectrum of $P^{-1}A$ (or AP^{-1}) is well-behaved.

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PC idea

Idea: improve the conditioning of the Krylov operator

Left preconditioning

$$(P^{-1}A)u = P^{-1}b$$

 $\{P^{-1}b, (P^{-1}A)P^{-1}b, (P^{-1}A)^2P^{-1}b, \dots\}$

PC idea

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$$(P^{-1}A)u = P^{-1}b$$

 $\{P^{-1}b, (P^{-1}A)P^{-1}b, (P^{-1}A)^2P^{-1}b, \dots\}$

Right preconditioning

$$(AP^{-1})Pu = b$$

 $\{b, (AP^{-1})b, (AP^{-1})^2b, \dots\}$

PC idea

Idea: improve the conditioning of the Krylov operator

Left preconditioning

$$(P^{-1}A)u = P^{-1}b$$

 $\{P^{-1}b, (P^{-1}A)P^{-1}b, (P^{-1}A)^2P^{-1}b, \dots\}$

Right preconditioning

$$(AP^{-1})Pu = b$$

 $\{b, (AP^{-1})b, (AP^{-1})^2b, \dots\}$

• The product $P^{-1}A$ or AP^{-1} is *not* formed.



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LU factorization

• Handled as a preconditioner.

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LU factorization

- Handled as a preconditioner.
- Logic: LU factorization with back/forward substitution is a *perfect* left preconditioner.

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LU factorization

- Handled as a preconditioner.
- Logic: LU factorization with back/forward substitution is a *perfect* left preconditioner.
- PETSc only provides a serial LU preconditioner...
- But we can use external packages for parallel solves: MUMPS, SuperLU_dist

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Vec exercise

Exercise 3: Basic vector routines

- Investigate the source code examples/Lecture_02/ex1.c, and the structure of its makefile.
- Set the vector size to 1000 using a command-line option.
- Investigate other options available to this program with the -help option.
- Can you get the program to output the line:
 Total flops over all processors 32991. ?

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KSP direct solver exercise

Exercise 4: Simple linear solve

- Looking at the code in examples/Lecture_02/ex2.c, determine:
 - Where the matrix values are set.
 - Where the solver type is set.
 - How the error is computed.
- What are the default KSP type and PC type?
 - Don't forget about -help

Exercise 5: Solve with LU factorization

- Use the options:
 - -pc_type lu -pc_factor_mat_solver_package mumps to solve using LU factorization.
- Look at -ksp_view to see what info this gives you.

Message passing interface (MPI)

Typically, user does not call MPI functions directly.

At most, MPI_Comm_size() and MPI_Comm_rank() can be used. All other MPI communication functions are wrapped within PETSc functions.

However, some degree of understanding how MPI works is needed to create PETSc code that can scale well.

MPI communicators in PETSc

- PETSc objects need an MPI_Comm in their constructor
 - PETSC_COMM_SELF for serial objects
 - PETSC_COMM_WORLD common, but not required
- Can split communicators, spawn processes on new communicators, etc
- Operations are one of
 - Not Collective: ie., VecGetLocalSize(), MatSetValues()
 - Logically Collective: ie., KSPSetType()
 - checked when running in debug mode
 - Neighbor-wise Collective: VecScatterBegin(), MatMult()
 - Point-to-point communication between two processes
 - Collective: VecNorm(), MatAssemblyBegin(), KSPCreate()
 - Global communication, synchronous
- Deadlock if some process doesn't participate (e.g. wrong order)

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Structured nonlinear equation solver (SNES)

Standard form of a nonlinear system

$$F(u) = 0$$

Newton iteration

Solve:
$$J(u)w = -F(u)$$

Update: $u^+ \leftarrow u + w$

- ullet Quadratically convergent near a root: $|u^{n+1}-u^*|\in \mathcal{O}ig(|u^n-u^*|^2ig)$
- Quasi-Newton methods can use a different J(u)

How to set up a SNES I

- SNESCreate(SNES *)
- The SNES interface is based upon callback functions
 - FormFunction(...), set by SNESSetFunction()
 - FormJacobian(...), set by SNESSetJacobian()
- When PETSc needs to evaluate F and J,
 - Solver calls the user's function
 - User function gets application state through the ctx variable
 - cast to/from a void pointer (see upcoming exercise)
 - PETSc never sees application data
- SNESSetFromOptions(SNES) SNESSolve(SNES, Vec b, Vec u)

How to set up a SNES II

The user provided function which calculates the **nonlinear residual** has signature

PetscErrorCode (*func)(SNES snes, Vec u, Vec r, void *ctx)

u: The current solution

r: The residual

ctx: The user context passed to SNESSetFunction()

• Use this to pass application information, e.g. physical constants

How to set up a SNES III

Similar story for the function to evaluate Jacobian:

```
PetscErrorCode (*func)(SNES snes, Vec u, Mat J,
Mat Jpre, void *ctx)
```

u: The current solution

J: The Jacobian

Jpre: The Jacobian preconditioning matrix (possibly J itself)

ctx: The user context passed to SNESSetFunction()

• Use this to pass application information, e.g. physical constants

How to set up a SNES III

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PetscErrorCode (*func)(SNES snes, Vec u, Mat J,
Mat Jpre, void *ctx)
```

u: The current solution

J: The Jacobian

Jpre: The Jacobian preconditioning matrix (possibly J itself)

ctx: The user context passed to SNESSetFunction()

• Use this to pass application information, e.g. physical constants

Alternatively, you can use

• a built-in sparse finite difference approximation ("coloring")

SNES global strategies

Newton's method can diverge if not close to a solution.

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Newton's method can diverge if not close to a solution.

Line search (newtonls):

- Update direction determined by linear solve in Newton method
- Update size chosen by maximizing decrease in nonlinear residual in the update direction

SNES global strategies

Newton's method can diverge if not close to a solution.

Line search (newtonls):

- Update direction determined by linear solve in Newton method
- Update size chosen by maximizing decrease in nonlinear residual in the update direction

Trust region (newtontr):

- Trust region size chosen based on how well a local approximation matches F
- ② Update **direction** chosen by maximizing the decrease in nonlinear residual within the trust region

Timestepping (TS)

Typically applied to *method of lines* discretizations of PDEs.

PETSc permits 2 forms for initial value problems

Standard ODE IVP form:

$$\dot{u} = F(t, u)$$

OAE and IMEX methods:

$$G(t, u, u) = F(t, u)$$
$$J_{\alpha} = \alpha G_{u} + G_{u}$$

Single Step interface so user can control their own time loop, or one-shot Solve to produce a solution at some desired final time.

Some TS methods

TSTHETA Theta methods

TSALPHA Alpha methods

TSRK Runge-Kutta methods

TSARKIMEX 2-Additive Runge-Kutta methods

TSBDF Backward differentiation methods

TSROSW Rosenbrock-W methods

TSSSP Strong stability methods (Total variation diminishing)

TSGL General linear methods - multi-stage/multi-step

TSSUNDIALS SUNDIALS (external) ode integrators

How to set up a TS I

- TSCreate(TS *)
- User provides functions for:
 - Explicit rhs TSSetRHSFunction()
 - Implicit lhs TSSetIFunction(), TSSetIJacobian()
- TSSetFromOptions(TS)
- TSSolve(TS, Vec u)

How to set up a TS II

Function signatures:

- FormRHSFunction(ts,t,u,F,void *ctx);
- FormIFunction(ts,t,u,udot,G,void *ctx);
- FormIJacobian(ts,t,u,udot,alpha,J,J_p,void *ctx);

How to set up a TS II

Function signatures:

- FormRHSFunction(ts,t,u,F,void *ctx);
- FormIFunction(ts,t,u,udot,G,void *ctx);
- FormIJacobian(ts,t,u,udot,alpha,J,J_p,void *ctx);

Can also supply:

• FormRHSJacobian(ts,t,u,F,J,J_p,void *ctx); to use fully implicit methods.

SNES exercise

Exercise 6: Simple nonlinear solve

- Investigate the code in examples/Lecture_03/ex1.c (note this is a serial example!), determine:
 - How the residual is evaluated.
 - How the Jacobian is evaluated.
- What are the default methods employed?
- Can you get the program to output the reason for convergence?
- Can you monitor the linear system solves as well?

TS exercise

Exercise 7: DAE benchmark problems for TS

- Investigate the source code in examples/Lecture_03/ex8.c, determine:
 - What problems are being solved?
 - How do you select a problem from command line?
- What types of time integration methods can you use, what is the default? (-ts_view)
- Run the program with LU factorization for the linear system solves.

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