# Example Programs for KINSOL v6.1.1

Aaron M. Collier and Radu Serban Center for Applied Scientific Computing Lawrence Livermore National Laboratory

February 11, 2022



#### DISCLAIMER

This document was prepared as an account of work sponsored by an agency of the United States government. Neither the United States government nor Lawrence Livermore National Security, LLC, nor any of their employees makes any warranty, expressed or implied, or assumes any legal liability or responsibility for the accuracy, completeness, or usefulness of any information, apparatus, product, or process disclosed, or represents that its use would not infringe privately owned rights. Reference herein to any specific commercial product, process, or service by trade name, trademark, manufacturer, or otherwise does not necessarily constitute or imply its endorsement, recommendation, or favoring by the United States government or Lawrence Livermore National Security, LLC. The views and opinions of authors expressed herein do not necessarily state or reflect those of the United States government or Lawrence Livermore National Security, LLC, and shall not be used for advertising or product endorsement purposes.

This work was performed under the auspices of the U.S. Department of Energy by Lawrence Livermore National Laboratory under Contract DE-AC52-07NA27344.

#### CONTRIBUTORS

The SUNDIALS library has been developed over many years by a number of contributors. The current SUNDIALS team consists of Cody J. Balos, David J. Gardner, Alan C. Hindmarsh, Daniel R. Reynolds, and Carol S. Woodward. We thank Radu Serban for significant and critical past contributions.

Other contributors to SUNDIALS include: James Almgren-Bell, Lawrence E. Banks, Peter N. Brown, George Byrne, Rujeko Chinomona, Scott D. Cohen, Aaron Collier, Keith E. Grant, Steven L. Lee, Shelby L. Lockhart, John Loffeld, Daniel McGreer, Slaven Peles, Cosmin Petra, H. Hunter Schwartz, Jean M. Sexton, Dan Shumaker, Steve G. Smith, Allan G. Taylor, Hilari C. Tiedeman, Chris White, Ting Yan, and Ulrike M. Yang.

# Contents

1	Introduction	1
2	C example problems	4
3	Fortran example problems	12
4	C++ example problems	15
$\mathbf{R}$	eferences	19

### 1 Introduction

This report is intended to serve as a companion document to the User Documentation of KINSOL [1]. It provides details, with listings, on the example programs supplied with the KINSOL distribution package.

The KINSOL distribution contains examples of types: serial C examples, parallel C examples, serial and parallel FORTRAN examples, and an OpenMP example. With the exception of "demo"-type example files, the names of all the examples distributed with SUNDIALS are of the form [slv][PbName]\_[strat]\_[ls]\_[prec]\_[p], where

[slv] identifies the solver (for KINSOL examples this is kin, while for FKINSOL examples, this is fkin);

[PbName] identifies the problem;

[strat] identifies the strategy (absent if "none" or "linesearch");

[ls] identifies the linear solver module used;

[prec] indicates the KINSOL preconditioner module used (only if applicable, for examples using a Krylov linear solver and the KINBBDPRE module, this will be bbd);

[p] indicates an example using the parallel vector module NVECTOR\_PARALLEL.

The following lists summarize all examples distributed with KINSOL.

Supplied in the *srcdir*/examples/kinsol/serial directory are the following serial examples (using the NVECTOR\_SERIAL module):

- kinRoberts\_fp solves the backward Euler time step for a three-species chemical kinetics system, using the fixed point strategy.
- kinFerTron\_dns solves the Ferraris-Tronconi problem.
   This program solves the problem with the SUNLINSOL\_DENSE linear solver and uses different combinations of globalization and Jacobian update strategies with different initial guesses.
- kinFerTron\_klu solves the same problem as in kinFerTron\_dns, but uses the sparse direct solver KLU via the SUNLINSOL\_KLU module.
- kinRoboKin\_dns solves a nonlinear system from robot kinematics.

  This program solves the problem with the SUNLINSOL\_DENSE linear solver and a user-supplied Jacobian routine.
- kinRoboKin\_slu is the same as kinRoboKin\_dns but uses the SuperLUMT sparse direct linear solver via the Sunlinsol\_superlumt module.
- kinLaplace\_bnd solves a simple 2-D elliptic PDE on a unit square.

  This program solves the problem with the SUNLINSOL\_BAND linear solver.
- kinLaplace\_picard\_bnd is the same as kinLaplace\_bnd but uses the Picard strategy.

- kinFoodWeb\_kry solves a food web model.

  This is a nonlinear system that arises from a system of partial differential equations describing a six-species food web population model, with predator-prey interaction and diffusion on the unit square in two dimensions. This program solves the problem with the SUNLINSOL\_SPGMR linear solver module and a user-supplied preconditioner. The preconditioner is a block-diagonal matrix based on the partial derivatives of the
- kinKrylovDemo\_ls solves the same problem as kinFoodWeb\_kry, but with three Krylov linear solvers: SUNLINSOL\_SPGMR, SUNLINSOL\_SPBCGS, and SUNLINSOL\_SPTFQMR.

Supplied in the *srcdir*/examples/kinsol/parallel directory are the following parallel examples (using the NVECTOR\_PARALLEL module):

• kinFoodWeb\_kry\_p is a parallel implementation of kinFoodWeb\_kry.

interaction terms only.

• kinFoodWeb\_kry\_bbd\_p solves the same problem as kinFoodWeb\_kry\_p, with a block-diagonal matrix with banded blocks as a preconditioner, generated by difference quotients, using the KINBBDPRE module.

As part of the FKINSOL module, in the directories *srcdir*/examples/kinsol/fcmix\_serial and *srcdir*/examples/kinsol/fcmix\_parallel, respectively, are the following examples for the FORTRAN-C interface:

- fkinDiagon\_kry is a serial example, which solves a nonlinear system of the form  $u_i^2 = i^2$  using an approximate diagonal preconditioner.
- fkinDiagon\_kry\_p is a parallel implementation of fkinDiagon\_kry.

Supplied in directory *srcdir*/examples/kinsol/C\_openmp is an example using the OpenMP NVECTOR module. kin\_FoodWeb\_kry\_omp solves the same problem as kin\_FoodWeb\_kry but uses the OpenMP module.

Supplied in directory <code>srcdir/examples/kinsol/CXX\_parallel</code> is an example using the <code>NVECTOR\_PARALLEL</code> module. <code>kin\_heat2D\_nonlin\_p</code> solves a steady-state 2D heat equation with an additional nonlinear term. This problem is solved via fixed point iteration with Anderson acceleration. This example highlights the availability of various orthogonalization methods for use within Anderson acceleration.

Supplied in directory *srcdir*/examples/kinsol/CXX\_parhyp are examples using the NVECTOR\_PARALLEL module and incorporating use of *hypre* preconditioners and solvers. These example problems are solved via fixed point iteration with Anderson acceleration. They highlight the availability of various orthogonalization methods for use within Anderson acceleration.

• kin\_heat2D\_nonlin\_hypre\_pfmg solves the same problem as kin\_heat2D\_nonlin\_p but with a different fixed point iteration setup requiring a linear solve that uses hypre's PFMG preconditioner.

• kin\_bratu2D\_hypre\_pfmg solves a 2D Bratu equation [3] requiring a linear solve that uses hypre's PFMG preconditioner.

In the following sections, we give detailed descriptions of some (but not all) of these examples. We also give our output files for each of these examples, but users should be cautioned that their results may differ slightly from these. Differences in solution values may differ within the tolerances, and differences in cumulative counters, such as numbers of Newton iterations, may differ from one machine environment to another by as much as 10% to 20%.

In the descriptions below, we make frequent references to the KINSOL User Document [1]. All citations to specific sections (e.g. §4.2) are references to parts of that User Document, unless explicitly stated otherwise.

Note. The examples in the KINSOL distribution are written in such a way as to compile and run for any combination of configuration options used during the installation of SUNDIALS (see Appendix A in the User Guide). As a consequence, they contain portions of code that will not be typically present in a user program. For example, all C example programs make use of the variables SUNDIALS\_EXTENDED\_PRECISION and SUNDIALS\_DOUBLE\_PRECISION to test if the solver libraries were built in extended or double precision, and use the appropriate conversion specifiers in printf functions.

## 2 C example problems

## 2.1 A serial dense example: kinFerTron\_dns

As an initial illustration of the use of the KINSOL package for the solution of nonlinear systems, we give a sample program called kinFerTron\_dns.c. It uses the KINSOL dense linear solver module SUNLINSOL\_DENSE and the NVECTOR\_SERIAL module (which provides a serial implementation of NVECTOR) for the solution of the Ferraris-Tronconi test problem [2].

This problem involves a blend of trigonometric and exponential terms:

$$0 = 0.5 \sin(x_1 x_2) - 0.25 x_2 / \pi - 0.5 x_1$$

$$0 = (1 - 0.25 / \pi) (e^{2x_1} - e) + ex_2 / \pi - 2ex_1$$
subject to
$$x_{1 \min} = 0.25 \le x_1 \le 1 = x_{1 \max}$$

$$x_{2 \min} = 1.5 \le x_2 \le 2\pi = x_{2 \max}.$$
(1)

The bounds constraints on  $x_1$  and  $x_2$  are treated by introducing four additional variables and using KINSOL's optional constraints feature to enforce non-positivity and non-negativity:

$$l_1 = x_1 - x_{1 \min} \ge 0$$

$$L_1 = x_1 - x_{1 \max} \le 0$$

$$l_2 = x_2 - x_{2 \min} \ge 0$$

$$L_2 = x_2 - x_{2 \max} \le 0$$

The Ferraris-Tronconi problem has two known solutions. We solve it with KINSOL using two sets of initial guesses for  $x_1$  and  $x_2$  (first their lower bounds and secondly the middle of their feasible regions), both with an exact and modified Newton method, with and without line search.

Following the initial comment block, this program has a number of #include lines, which allow access to useful items in CVODE header files. The kinsol.h file provides prototypes for the KINSOL functions to be called (excluding the linear solver selection function), and also a number of constants that are to be used in setting input arguments and testing the return value of KINSol. The nvector\_serial.h file is the header file for the serial implementation of the NVECTOR module and includes definitions of the N\_Vector type, a macro to access vector components, and prototypes for the serial implementation specific machine environment memory allocation and freeing functions. The sunmatrix\_dense.h file provides the prototype for the SUNDenseMatrix function. The sunlinsol\_dense.h file provides the prototype for the SUNLinSol\_Dense function. The sundials\_types.h file provides the definition of the type realtype (see §4.2 for details). For now, it suffices to read realtype as double. Finally, sundials\_math.h is included for the definition of the exponential function RExp.

Next, the program defines some problem-specific constants, which are isolated to this early location to make it easy to change them as needed. This program includes a user-defined accessor macro, Ith, that is useful in writing the problem functions in a form closely matching the mathematical description of the system, i.e. with components numbered from 1 instead of from 0. The Ith macro is used to access components of a vector of type N\_Vector with a serial implementation. It is defined using the NVECTOR\_SERIAL accessor macro NV\_Ith\_S which numbers components starting with 0. The program prologue ends with prototypes of the user-supplied system function func and several private helper functions.

The main program begins with some dimensions and type declarations, including use of the type  $N\_Vector$ , initializations, and allocation and definitions for the user data structure data which contains two arrays with lower and upper bounds for  $x_1$  and  $x_2$ . Next, we create five serial vectors of type  $N\_Vector$  for the two different initial guesses, the solution vector u, the scaling factors, and the constraint specifications.

The initial guess vectors  ${\tt u1}$  and  ${\tt u2}$  are set by the private functions  ${\tt SetInitialGuess1}$  and  ${\tt SetInitialGuess2}$  and the constraint vector  ${\tt c}$  is initialized to [0,0,1,-1,1,-1] indicating that there are no additional constraints on the first two components of  ${\tt u}$  (i.e.  $x_1$  and  $x_2$ ) and that the 3rd and 5th components should be non-negative, while the 4th and 6th should be non-positive.

The calls to N\_VNew\_Serial, and also later calls to various KIN\*\*\* functions, make use of a private function, check\_flag, which examines the return value and prints a message if there was a failure. The check\_flag function was written to be used for any serial SUNDIALS application.

The call to KINCreate creates the KINSOL solver memory block. Its return value is a pointer to that memory block for this problem. In the case of failure, the return value is NULL. This pointer must be passed in the remaining calls to KINSOL functions.

The next four calls to KINSOL optional input functions specify the pointer to the user data structure (to be passed to all subsequent calls to func), the vector of additional constraints, and the function and scaled step tolerances, fnormtol and scsteptol, respectively.

Solver memory is allocated through the call to KINInit which specifies the system function func and provides the vector u which will be used internally as a template for cloning additional necessary vectors of the same type as u. The use of the dense linear solver is specified by calling SUNDenseMatrix to create the template Jacobian matrix (which also specifies the problem size NEQ), then calling SUNLinSol\_Dense to create the dense-direct linear solver, and finally calling KINSetLinearSolver to attach these to KINSOL.

The main program proceeds by solving the nonlinear system eight times, using each of the two initial guesses u1 and u2 (which are first copied into the vector u using N\_VScale\_Serial from the NVECTOR\_SERIAL module), with and without globalization through line search (specified by setting glstr to KIN\_LINESEARCH and KIN\_NONE, respectively), and applying either an exact or a modified Newton method. The switch from exact to modified Newton is done by changing the number of nonlinear iterations after which a Jacobian evaluation is enforced, a value mset= 1 thus resulting in re-evaluating the Jacobian at every single iteration of the nonlinear solver (exact Newton method). Note that passing mset= 0 indicates using the default KINSOL value of 10.

The actual problem solution is carried out in the private function SolveIt which calls the main solver function KINSol after first setting the optional input mset. After a successful return from KINSol, the solution  $[x_1, x_2]$  and some solver statistics are printed.

The function func is a straightforward expression of the extended nonlinear system. It uses the macro NV\_DATA\_S (defined by the NVECTOR\_SERIAL module) to extract the pointers to the data arrays of the N\_Vectors u and f and sets the components of fdata using the current values for the components of udata. See §4.6.1 for a detailed specification of f.

The output generated by kinFerTron\_dns is shown below.

kinFerTron\_dns sample output

Ferraris and Tronconi test problem
Tolerance parameters:

```
fnormtol = 1e-05
scsteptol = 1e-05
-----
Initial guess on lower bounds
[x1, x2] = 0.25 1.5
Exact Newton
Solution:
 [x1, x2] = 0.299449 2.83693
Final Statistics:
nni = 3 nfe = 4
 nje =
        3 	 nfeD = 18
Exact Newton with line search
Solution:
 [x1, x2] = 0.299449 2.83693
Final Statistics:
nni = 3 nfe = 4
 nje =
        3 	 nfeD = 18
Modified Newton
Solution:
 [x1, x2] = 0.299449 2.83693
Final Statistics:
nni = 11 nfe = 12
nje = 2 nfeD = 12
 nje =
Modified Newton with line search
Solution:
 [x1, x2] = 0.299449 2.83693
Final Statistics:
nni = 11 nfe = 12
 nje = 2 \quad nfeD = 12
-----
Initial guess in middle of feasible region
 [x1, x2] = 0.625 \quad 3.89159
Exact Newton
Solution:
 [x1, x2] = 0.5 \quad 3.14159
Final Statistics:
nni = 5 	 nfe =
 nje =
        5 	 nfeD = 30
Exact Newton with line search
Solution:
 [x1, x2] = 0.5 \quad 3.14159
Final Statistics:
nni = 5 nfe = 6
nje = 5 nfeD = 30
 nje =
Modified Newton
Solution:
 [x1, x2] = 0.500003 3.1416
Final Statistics:
```

```
nni = 12    nfe = 13
nje = 2    nfeD = 12

Modified Newton with line search
Solution:
    [x1,x2] = 0.500003     3.1416
Final Statistics:
    nni = 12     nfe = 13
    nje = 2     nfeD = 12
```

## 2.2 A serial Krylov example: kinFoodWeb\_kry

We give here an example that illustrates the use of KINSOL with the Krylov method SPGMR, via the SUNLINSOL\_SPGMR module, as the linear system solver.

This program solves a nonlinear system that arises from a discretized system of partial differential equations. The PDE system is a six-species food web population model, with predator-prey interaction and diffusion on the unit square in two dimensions. Given the dependent variable vector of species concentrations  $c = [c_1, c_2, ..., c_{n_s}]^T$ , where  $n_s = 2n_p$  is the number of species and  $n_p$  is the number of predators and of prey, then the PDEs can be written as

$$d_i \cdot \left(\frac{\partial^2 c_i}{\partial x^2} + \frac{\partial^2 c_i}{\partial y^2}\right) + f_i(x, y, c) = 0 \quad (i = 1, ..., n_s),$$
(2)

where the subscripts i are used to distinguish the species, and where

$$f_i(x, y, c) = c_i \cdot \left( b_i + \sum_{j=1}^{n_s} a_{i,j} \cdot c_j \right). \tag{3}$$

The problem coefficients are given by

$$a_{ij} = \begin{cases} -1 & i = j \\ -0.5 \cdot 10^{-6} & i \le n_p, \ j > n_p \\ 10^4 & i > n_p, \ j \le n_p \\ 0 & \text{all other } \end{cases}$$

$$b_i = b_i(x, y) = \begin{cases} 1 + \alpha xy & i \le n_p \\ -1 - \alpha xy & i > n_p \end{cases},$$

and

$$d_i = \begin{cases} 1 & i \le n_p \\ 0.5 & i > n_p \end{cases}.$$

The spatial domain is the unit square  $(x, y) \in [0, 1] \times [0, 1]$ .

Homogeneous Neumann boundary conditions are imposed and the initial guess is constant in both x and y. For this example, the equations (2) are discretized spatially with standard central finite differences on a  $8 \times 8$  mesh with  $n_s = 6$ , giving a system of size 384.

Among the initial #include lines in this case are lines to include sunlinsol\_spgmr.h and sundials\_math.h. The first contains constants and function prototypes associated with the SPGMR solver module. The inclusion of sundials\_math.h is done to access the SUNMAX

and SUNRabs macros, and the SUNRsqrt function to compute the square root of a realtype number.

The main program calls KINCreate and then calls KINInit with the name of the user-supplied system function func and solution vector as arguments. The main program then calls a number of KINSet\* routines to notify KINSOL of the user data pointer, the positivity constraints on the solution, and convergence tolerances on the system function and step size. It calls SUNLinSol\_SPGMR (see §4.5.2) to create the SPGMR linear solver module, supplying the maxl value of 15 as the maximum Krylov subspace dimension. It then calls KINSetLinearSolver to attach this solver module to KINSOL. Next, a maximum value of maxlrst = 2 restarts is imposed through a call to SUNLinSol\_SPGMRSetMaxRestarts. Finally, the user-supplied preconditioner setup and solve functions, PrecSetupBD and PrecSolveBD, are specified through a call to KINSetPreconditioner (see §4.5.4). The data pointer passed to KINSetUserData is passed to PrecSetupBD and PrecSolveBD whenever these are called.

Next, KINSol is called, the return value is tested for error conditions, and the approximate solution vector is printed via a call to PrintOutput. After that, PrintFinalStats is called to get and print final statistics, and memory is freed by calls to N\_VDestroy\_Serial, FreeUserData and KINFree. The statistics printed are the total numbers of nonlinear iterations (nni), of func evaluations (excluding those for Jv product evaluations) (nfe), of func evaluations for Jv evaluations (nfeSG), of linear (Krylov) iterations (nli), of preconditioner evaluations (npe), and of preconditioner solves (nps). All of these optional outputs and others are described in §4.5.5.

Mathematically, the dependent variable has three dimensions: species number, x mesh point, and y mesh point. But in NVECTOR\_SERIAL, a vector of type N\_Vector works with a one-dimensional contiguous array of data components. The macro IJ\_Vptr isolates the translation from three dimensions to one. Its use results in clearer code and makes it easy to change the underlying layout of the three-dimensional data. Here the problem size is 384, so we use the NV\_DATA\_S macro for efficient N\_Vector access. The NV\_DATA\_S macro gives a pointer to the first component of a serial N\_Vector which is then passed to the IJ\_Vptr macro.

The preconditioner used here is the block-diagonal part of the true Newton matrix and is based only on the partial derivatives of the interaction terms f in (3) and hence its diagonal blocks are  $n_s \times n_s$  matrices ( $n_s = 6$ ). It is generated and factored in the PrecSetupBD routine and backsolved in the PrecSolveBD routine. See §4.6.7 for detailed descriptions of these preconditioner functions.

The program  $kinFoodWeb\_kry.c$  uses the "small" dense functions for all operations on the  $6 \times 6$  preconditioner blocks. Thus it includes  $sundials\_dense.h$ , and calls the small dense matrix functions newDenseMat, denseGETRF, and denseGETRS. The small dense functions are generally available for KINSOL user programs (for more information, see the comments in the header file  $sundials\_dense.h$ ).

In addition to the functions called by KINSOL, kinFoodWeb\_kry.c includes definitions of several private functions. These are: AllocUserData to allocate space for the preconditioner and the pivot arrays; InitUserData to load problem constants in the data block; FreeUserData to free that block; SetInitialProfiles to load the initial values in cc; PrintHeader to print the heading for the output; PrintOutput to retreive and print selected solution values; PrintFinalStats to print statistics; and check\_flag to check return values for error conditions.

The output generated by kinFoodWeb\_kry is shown below. Note that the solution involved 10 Newton iterations, with an average of about 38 Krylov iterations per Newton iteration.

```
kinFoodWeb_kry sample output
Predator-prey test problem -- KINSol (serial version)
Mesh dimensions = 8 X 8
Number of species = 6
Total system size = 384
Flag globalstrategy = 0 (0 = None, 1 = Linesearch)
Linear solver is SPGMR with maxl = 15, maxlrst = 2
Preconditioning uses interaction-only block-diagonal matrix
Positivity constraints imposed on all components
Tolerance parameters: fnormtol = 1e-07
                                        scsteptol = 1e-13
Initial profile of concentration
                             30000 30000 30000
At all mesh points: 1 1 1
Computed equilibrium species concentrations:
At bottom left:
1.16428 1.16428 1.16428 34927.5 34927.5 34927.5
At top right:
1.25797 1.25797 1.25797 37736.7 37736.7 37736.7
Final Statistics..
         9 nli
                           329
nni
nfe
           10
                nfeSG =
                           338
          338
nps
                 npe
                                    ncfl =
```

#### 2.3 A parallel example: kinFoodWeb\_kry\_bbd\_p

In this example, kinFoodWeb\_kry\_bbd\_p, we solve the same problem as with kinFoodWeb\_kry above, but in parallel, and instead of supplying the preconditioner we use the KINBBDPRE module.

In this case, we think of the parallel MPI processes as being laid out in a rectangle, and each process being assigned a subgrid of size  $\texttt{MXSUB} \times \texttt{MYSUB}$  of the x-y grid. If there are NPEX processes in the x direction and NPEY processes in the y direction, then the overall grid size is  $\texttt{MX} \times \texttt{MY}$  with  $\texttt{MX} = \texttt{NPEX} \times \texttt{MXSUB}$  and  $\texttt{MY} = \texttt{NPEY} \times \texttt{MYSUB}$ , and the size of the nonlinear system is  $\texttt{NUM\_SPECIES.MX.MY}$ .

The evaluation of the nonlinear system function is performed in func. In this parallel setting, the processes first communicate the subgrid boundary data and then compute the local components of the nonlinear system function. The MPI communication is isolated in the private function <code>ccomm</code> (which in turn calls <code>BRecvPost</code>, <code>BSend</code>, and <code>BRecvWait</code>) and the subgrid boundary data received from neighboring processes is loaded into the work array <code>cext</code>. The computation of the nonlinear system function is done in <code>func\_local</code> which starts by copying the local segment of the <code>cc</code> vector into <code>cext</code>, and then by imposing the boundary conditions by copying the first interior mesh line from <code>cc</code> into <code>cext</code>. After this, the nonlinear system function is evaluated by using central finite-difference approximations using the data in <code>cext</code> exclusively.

KINBBDPRE uses a band-block-diagonal preconditioner, generated by difference quotients.

The upper and lower half-bandwidths of the Jacobian block generated on each process are both equal to  $2 \cdot n_s - 1$ , and that is the value passed as mudq and mldq in the call to KINBBDPrecInit. These values are much less than the true half-bandwidths of the Jacobian blocks, which are  $n_s$ ·MXSUB. However, an even narrower band matrix is retained as the preconditioner, with half-bandwidths equal to  $n_s$ , and this is the value passed to KINBBDPrecInit for mukeep and mlkeep.

The function func\_local is also passed as the gloc argument to KINBBDPrecInit. Since all communication needed for the evaluation of the local approximation of f used in building the band-block-diagonal preconditioner is already done for the evaluation of f in func, a NULL pointer is passed as the gcomm argument to KINBBDPrecInit.

The main program resembles closely that of the kinFoodWeb\_kry example, with particularization arising from the use of the parallel MPI NVECTOR\_PARALLEL module. It begins by initializing MPI and obtaining the total number of processes and the rank of the local process. The local length of the solution vector is then computed as NUM\_SPECIES·MXSUB·MYSUB. Distributed vectors are created by calling the constructor defined in NVECTOR\_PARALLEL with the MPI communicator and the local and global problem sizes as arguments. All output is performed only from the process with id equal to 0. Finally, after KINSol is called and the results are printed, all memory is deallocated, and the MPI environment is terminated by calling MPI\_Finalize.

The output generated by kinFoodWeb\_kry\_bbd\_p is shown below. Note that 9 Newton iterations were required, with an average of about 51.6 Krylov iterations per Newton iteration.

```
_ kinFoodWeb_kry_bbd_p sample output -
Predator-prey test problem -- KINSol (parallel-BBD version)
Mesh dimensions = 20 \times 20
Number of species = 6
Total system size = 2400
Subgrid dimensions = 10 X 10
Processor array is 2 X 2
Flag globalstrategy = 0 (0 = None, 1 = Linesearch)
Linear solver is SPGMR with max1 = 20, max1rst = 2
Preconditioning uses band-block-diagonal matrix from KINBBDPRE
 Difference quotient half-bandwidths: mudq = 11, mldq = 11
 Retained band block half-bandwidths: mukeep = 6, mlkeep = 6
Tolerance parameters: fnormtol = 1e-07 scsteptol = 1e-13
Initial profile of concentration
At all mesh points: 1 1 1
                             30000 30000 30000
Computed equilibrium species concentrations:
At bottom left:
1.165 1.165 1.165 34949 34949 34949
At top right:
1.25552 1.25552 1.25552 37663.2 37663.2 37663.2
Final Statistics..
    = 9 nli =
                           464
```

## 3 Fortran example problems

The FORTRAN example problem programs supplied with the KINSOL package are all written in standard F77 Fortran and use double precision arithmetic. Before running any of these examples, the user should make sure that the FORTRAN data types for real and integer variables appropriately match the C types. See §5.3 in the KINSOL User Document for details.

However, when the FORTRAN examples are built, the source code is automatically modified according to the configure options supplied by the user and the system type. Integer variables are declared as INTEGER\*n, where n denotes the number of bytes in the corresponding C type (long int or int). Floating-point variable declarations remain unchanged if double precision is used, but are changed to REAL\*n, where n denotes the number of bytes in the SUNDIALS type realtype, if using single precision. Also, if using single precision, declarations of floating-point constants are appropriately modified, e.g. 0.5D-4 is changed to 0.5E-4.

The two examples supplied with the FKINSOL module are very simple tests of the FORTRAN-C interface module. They solve the nonlinear system

$$F(u) = 0$$
, where  $f_i(u) = u_i^2 - i^2$ ,  $1 \le i \le N$ .

### 3.1 A serial example: fkinDiagon\_kry

The fkinDiagon\_kry program solves the above problem using the NVECTOR\_SERIAL module.

The main program begins by calling frvinits to initialize computations with the NVEC-TOR\_SERIAL module. Next, the array uu is set to contain the initial guess  $u_i = 2i$ , the array scale is set with all components equal to 1.0 (meaning that no scaling is done), and the array constr is set with all components equal to 0.0 to indicate that no inequality constraints should be imposed on the solution vector.

The KINSOL solver is initialized and memory for it is allocated by calling fkinmalloc, which also specifies the iout and rout arrays which are used to store integer and real outputs, respectively (see Table 5.4). Also, various integer, real, and vector parameters are specified by calling the fkinsetiin, fkinsetrin, and fkinsetvin subroutines, respectively. In particular, the maximum number of iterations between calls to the preconditioner setup routine (msbpre = 5), the tolerance for stopping based on the function norm (fnormtol =  $10^{-5}$ ), and the tolerance for stopping based on the step length (scsteptol =  $10^{-4}$ ) are specified.

Next, the SUNLINSOL\_SPGMR linear solver module is attached to KINSOL by calling fsunspgmrinit, which also specifies the maximum Krylov subspace dimension (maxl = 10). This is then attached to KINSOL by calling fkinlsinit. The maximum number of restarts allowed for SPGMR is then updated to maxlrst = 2 by calling fsunspgmrsetmaxrs. The SUNLINSOL\_SPGMR module is then directed to use the supplied preconditioner by calling the fkinlssetprec routine with a first argument equal to 1. The solution of the nonlinear system is obtained after a successful return from fkinsol, which is then printed to unit 6 (stdout). Finally, memory allocated for the KINSOL solver is released by calling fkinfree.

The user-supplied routine fkfun contains a straightforward transcription of the nonlinear system function f, while the routine fkpset sets the array pp (in the common block pcom) to contain an approximation to the reciprocals of the Jacobian diagonal elements. The components of pp are then used in fkpsol to solve the preconditioner linear system Px = v through simple multiplications.

The following is sample output from fkinDiagon\_kry, using N = 128.

```
_{-} fkinDiagon_kry sample output _{-}
Example program fkinDiagon_kry:
This FKINSOL example solves a 128 eqn diagonal algebraic system.
Its purpose is to demonstrate the use of the Fortran interface
in a serial environment.
globalstrategy = KIN_NONE
FKINSOL return code is
The resultant values of uu are:
                            3.000000
      1.000000
                 2.000000
                                       4.000000
      5.000000
                6.000000
                            7.000000
                                       8.000000
      9.000000 10.000000 11.000000
                                     12.000000
     13.000000 14.000000 15.000000
                                      16.000000
 13
  17
     17.000000 18.000000 19.000000
                                      20.000000
  21
     21.000000 22.000000
                           23.000000
                                      24.000000
     25.000000 26.000000
                           27.000000
                                      28.000000
 25
     29.000000 30.000000
  29
                           31.000000
                                      32.000000
     33.000000 34.000000
  33
                           35.000000
                                      36.000000
     37.000000 38.000000
  37
                           39.000000
                                      40.000000
     41.000000 42.000000
                           43.000000
                                      44.000000
  45
     45.000000 46.000000 47.000000
                                      48.000000
  49
     49.000000 50.000000 51.000000
                                     52.000000
  53 53.000000 54.000000 55.000000
                                     56.000000
     57.000000 58.000000 59.000000
  57
                                      60.000000
     61.000000 62.000000 63.000000
  61
                                      64.000000
     65.000000 66.000000 67.000000
                                      68.000000
  69 69.000000 70.000000 71.000000
                                      72.000000
 73
     73.000000 74.000000
                           75.000000
                                      76.000000
 77
    77.000000 78.000000 79.000000
                                      80.000000
     81.000000 82.000000 83.000000
 81
                                      84.000000
                           87.000000
 85
     85.000000 86.000000
                                      88.000000
 89
     89.000000 90.000000
                           91.000000
                                      92.000000
     93.000000
                94.000000
                           95.000000
                                      96.000000
     97.000000 98.000000
 97
                           99.000000 100.000000
101 101.000000 102.000000 103.000000 104.000000
105 105.000000 106.000000 107.000000 108.000000
109 109.000000 110.000000 111.000000 112.000000
113 113.000000 114.000000 115.000000 116.000000
117 117.000000 118.000000 119.000000 120.000000
121 121.000000 122.000000 123.000000 124.000000
125 125.000000 126.000000 127.000000 128.000000
Final statistics:
         7, nli
 nni =
 nfe =
         8, npe
 nps = 28, ncfl =
```

## 3.2 A parallel example: fkinDiagon\_kry\_p

The program fkinDiagon\_kry\_p is a straightforward modification of fkinDiagon\_kry to use the MPI-enabled NVECTOR\_PARALLEL module.

After initialization of MPI, the NVECTOR\_PARALLEL module is initialized by calling fnvinitp with the default MPI communicator mpi\_comm\_world and the local and global vector sizes as its first three arguments. The rank of the local process, mype, is used in both the initial guess and the system function, inasmuch as the global and local indices to the vector u are related by the equation iglobal = ilocal + mype\*nlocal. In other respects, the problem setup (KINSOL initialization, SUNLINSOL\_SPGMR specification) and solution steps are the same as in fkinDiagon\_kry. Upon successful return from fkinsol, the solution segment local to the process with id equal to 0 is printed to unit 6. Finally, the KINSOL memory is released and the MPI environent is terminated.

For this simple example, no inter-process communication is required to evaluate the non-linear system function f or the preconditioner. As a consequence, the user-supplied routines fkfun, fkpset, and fkpsol are basically identical to those in fkinDiagon\_kry.

Sample output from fkinDiagon\_kry\_p, for N = 128, follows.

```
_ fkinDiagon_kry_p sample output .
Example program fkinDiagon_kry_p:
This FKINSOL example solves a 128 eqn diagonal algebraic system.
Its purpose is to demonstrate the use of the Fortran interface
in a parallel environment.
FKINSOL return code is
The resultant values of uu (process 0) are:
      1.000000
                2.000000
                          3.000000
                                     4.000000
  5
      5.000000
               6.000000
                          7.000000
                                    8.000000
  9
      9.000000 10.000000 11.000000
                                   12.000000
 13
    13.000000 14.000000 15.000000 16.000000
    17.000000 18.000000 19.000000 20.000000
 17
 21 21.000000 22.000000 23.000000 24.000000
 29 29.000000 30.000000 31.000000 32.000000
Final statistics:
                    21
 nni =
         7, nli
       8, npe
 nfe =
                     2
 nps = 28,
            ncfl =
```

## 4 C++ example problems

## 4.1 A parallel matrix-free example: kin\_heat2D\_nonlin\_p

As an illustration of the use of the KINSOL package for the solution of nonlinear systems in parallel, we give a sample program called kin\_heat2D\_nonlin\_p.cpp. It uses the KINSOL KINFP iteration with Anderson Acceleration and the NVECTOR\_PARALLEL module (which provides a parallel implementation of NVECTOR) for the solution of the following test problem. This example highlights the use of the various orthogonalization routine options within Anderson Acceleration, passed to the example problem via the --orthaa flag. Available options include 0 (KIN\_ORTH\_MGS), 1 (KIN\_ORTH\_ICWY), 2 (KIN\_ORTH\_CGS2), and 3 (KIN\_ORTH\_DCGS2).

This problem involves solving a steady-state 2D heat equation with an additional nonlinear term defined by c(u):

$$b = \nabla \cdot (D\nabla u) + c(u) \quad \text{in} \quad \mathcal{D} = [0, 1] \times [0, 1] \tag{4}$$

where D is a diagonal matrix with entries  $k_x$  and  $k_y$  for the diffusivity in the x and y directions respectively. The boundary conditions are

$$u(0,y) = u(1,y) = u(x,0) = u(x,1) = 0.$$
(5)

We chose the analytical solution to be

$$u_{\text{exact}} = u(x, y) = \sin^2(\pi x)\sin^2(\pi y), \tag{6}$$

hence, we define the static term b as follows

$$b = k_x 2\pi^2 (\cos^2(\pi x) - \sin^2(\pi x)) \sin^2(\pi y) + k_y 2\pi^2 (\cos^2(\pi y) - \sin^2(\pi y)) \sin^2(\pi x) + c(u_{\text{exact}})$$
(7)

The spatial derivatives are computed using second-order centered differences, with the data distributed over  $n_x \times n_y$  points on a uniform spatial grid. The problem is set up to use spatial grid parameters  $n_x = 64$  and  $n_y = 64$ , with heat conductivity parameters  $k_x = 1.0$  and  $k_y = 1.0$ .

This problem is solved via a fixed point iteration with Anderson acceleration, where the fixed point is function formed by adding u to both sides of the equation i.e.,

$$b + u = \nabla \cdot (D\nabla u) + c(u) + u, \tag{8}$$

so that the fixed point function is

$$G(u) = \nabla \cdot (D\nabla u) + c(u) + u - b. \tag{9}$$

The problem is run using a tolerance of  $10^{-8}$ , and a starting vector containing all ones. The following tables contains all available input parameters when running the example problem.

Table 1: Optional input parameter flags.

Flag	Description		
	*		
mesh <nx> <ny></ny></nx>	mesh points in the x and y directions		
np <npx> <npy></npy></npx>	number of MPI processes in the x and y directions		
domain <xu> <yu></yu></xu>	domain upper bound in the x and y direction		
k <kx> <ky></ky></kx>	diffusion coefficients		
rtol <rtol></rtol>	relative tolerance		
maa <maa></maa>	number of previous residuals for Anderson Acceleration		
damping <damping></damping>	damping parameter for Anderson Acceleration		
orthaa <orthaa></orthaa>	orthogonalization routine used in Anderson Acceleration		
maxits <maxits></maxits>	max number of iterations		
c <cu></cu>	nonlinear function choice (integer between 1 - 17)		
timing	print timing data		
help	print available input parameters and exit		

Table 2: Input parameter flags for setting the nonlinear function c(u).

Table 2: Input parameter flags for setting the nonlinear function $c(u)$ .				
Flag	Function			
c 1	c(u) = u			
c 2	$c(u) = u^3 - u$			
c 3	$c(u) = u - u^2$			
c 4	$c(u) = e^u$			
c 5	$c(u) = u^4$			
c 6	$c(u) = \cos^2(u) - \sin^2(u)$			
c 7	$c(u) = \cos^2(u) - \sin^2(u) - e^u$			
c 8	$c(u) = e^u u^4 - u e^{\cos(u)}$			
c 9	$c(u) = e^{(\cos^2(u))}$			
c 10	$c(u) = 10(u - u^2)$			
c 11	c(u) = -13 + u + ((5 - u)u - 2)u			
c 12	$c(u) = \sqrt{5}(u - u^2)$			
c 13	$c(u) = (u - e^{u})^{2} + (u + u\sin(u) - \cos(u))^{2}$			
c 14	$c(u) = u + ue^u + ue^{-u}$			
c 15	$c(u) = u + ue^{u} + ue^{-u} + (u - e^{u})^{2}$			
c 16	$c(u) = u + ue^{u} + ue^{-u} + (u - e^{u})^{2} + (u + u\sin(u) - \cos(u))^{2}$			
c 17	$c(u) = u + ue^{-u} + e^{u}(u + \sin(u) - \cos(u))^{3}$			

## 4.2 A parallel example using hypre: kin\_heat2D\_nonlin\_hypre\_pfmg

As an illustration of the use of the KINSOL package for the solution of nonlinear systems in parallel and using *hypre* linear solvers, we give a sample program called

kin\_heat2D\_nonlin\_hypre\_pfmg.cpp. It uses the KINSOL KINFP iteration and the NVECTOR\_PARALLEL module (which provides a parallel implementation of NVECTOR) for the solution of the following test problem. This example highlights the use of the various orthogonalization routine options within Anderson Acceleration, passed to the example problem via the --orthaa flag. Available options include 0 (KIN\_ORTH\_MGS), 1 (KIN\_ORTH\_ICWY), 2 (KIN\_ORTH\_CGS2), and 3 (KIN\_ORTH\_DCGS2).

This problem involves solving a steady-state 2D heat equation with an additional nonlinear term defined by c(u):

$$b = \nabla \cdot (D\nabla u) + c(u) \quad \text{in} \quad \mathcal{D} = [0, 1] \times [0, 1] \tag{10}$$

where D is a diagonal matrix with entries  $k_x$  and  $k_y$  for the diffusivity in the x and y directions respectively. The boundary conditions are

$$u(0,y) = u(1,y) = u(x,0) = u(x,1) = 0$$
(11)

We chose the analytical solution to be

$$u_{\text{exact}} = u(x, y) = \sin^2(\pi x)\sin^2(\pi y), \tag{12}$$

hence, we define the static term b as follows

$$b = k_x 2\pi^2 (\cos^2(\pi x) - \sin^2(\pi x)) \sin^2(\pi y) + k_y 2\pi^2 (\cos^2(\pi y) - \sin^2(\pi y)) \sin^2(\pi x) + c(u_{\text{exact}})$$
(13)

The spatial derivatives are computed using second-order centered differences, with the data distributed over  $n_x \times n_y$  points on a uniform spatial grid. The problem is set up to use spatial grid parameters  $n_x = 64$  and  $n_y = 64$ , with heat conductivity parameters  $k_x = 1.0$  and  $k_y = 1.0$ .

This problem is solved via a fixed point iteration with Anderson acceleration, where the fixed point function formed by implementing the Laplacian as a matrix-vector product,

$$b = Au + c(u), \tag{14}$$

and solving for u results to get the fixed point function

$$G(u) = A^{-1}(b - c(u)). (15)$$

The problem is run using a tolerance of  $10^{-8}$ , and a starting vector containing all ones. The linear system solve is executed using the SUNLINSOL\_PCG linear solver with the *hypre* PFMG preconditioner. The setup of the linear solver can be found in the Setup\_LS function, and setup of the *hypre* preconditioner can be found in the Setup\_Hypre function within the main file.

All input parameter flags available for Example 4.1 are also available for this problem. In addition, all runtime flags controlling the linear solver and *hypre* related parameters are set using the flags in the following table.

Table 3: Optional input parameter flags for setting hypre related parameters.

Flag	Description	
lsinfo	output residual history for PCG	
liniters <liniters></liniters>	max number of iterations for PCG	
epslin <epslin></epslin>	linear tolerance for PCG	
pfmg_relax <pfmg_relax></pfmg_relax>	relaxation type in PFMG	
pfmg_nrelax <pfmg_nrelax></pfmg_nrelax>	pre/post relaxation sweeps in PFMG	

# References

- [1] A. M. Collier, A. C. Hindmarsh, R. Serban, and C.S. Woodward. User Documentation for KINSOL v6.1.1. Technical Report UCRL-SM-208116, LLNL, 2022.
- [2] C. Floudas, P. Pardalos, C. Adjiman, W. Esposito, Z. Gumus, S. Harding, J. Klepeis, C. Meyer, and C. Schweiger. *Handbook of Test Problems in Local and Global Optimization*. Kluwer Academic Publishers, Dordrecht, 1999.
- [3] D. A. Frank-Kamenetskii and N. Thon. Diffusion and Heat Exchange in Chemical Kinetics. Princeton University Press, 1955.