## The GlobSol Project: Rigorous Global Solutions (Overview and Recent Developments)

by

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## This talk will

- Highlight the nature of deterministic global optimization
- Review capabilities of the GlobSol software package
- Review an example of how to use GlobSol
- Outline improvements to GlobSol in 1998–1999
- Give an example of GlobSol's use on imprecisely known data
- Outline GlobSol's new installation procedure

# Deterministic Global Optimization

- involves some kind of systematic global search over the domain.
- The various algorithms rely on estimates of the range of the objective function over subdomains.
- Some algorithms (due to Mladineo, Schubert, Wood, etc.) rely on <u>Lipschitz constants</u> to obtain estimates of ranges.
- Bounds on ranges or approximate bounds on ranges are also obtained with outwardly rounded interval arithmetic or non-rigorous interval arithmetic, respectively.

# Deterministic Global Optimization

## Interval Methods

- Evaluation of a an objective function  $\phi(X)$ at an interval vector  $\boldsymbol{X}$  gives bounds on the actual range of  $\phi$  over  $\boldsymbol{X}$ .
  - If <u>directed rounding</u> is used, the bounds rigorously contain the mathematical range.
  - The bounds, in general, are overestimates.
- If the lower bound of  $\phi(\mathbf{X})$  is greater than a previously computed objective value  $\phi(X)$ , then  $\mathbf{X}$  can be discarded.
- <u>Interval Newton Methods</u>, combined with directed rounding, can *prove* existence and uniqueness of critical points, as well as reduce the size of regions **X**.

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# On the State of the Art

- Minimizing a function over a compact set in  $\mathbb{R}^n$  is an NP-complete problem.
- Thus, barring monumental discoveries, any *general* algorithm will fail for some high-dimensional problems.
- There are many practical problems that can be solved in low-dimensional spaces.
- Some low-dimensional problems are difficult.
- Advances in computer speed and algorithm construction have allowed many more practical problems to be solved, including high-dimensional ones.

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# What is GlobSol?

- A Fortran 90 package
  - well-tested.
  - self-contained.
- Solves constrained and unconstrained global optimization problems
- Separate program solves square algebraic systems of equations.
- Utility programs for interval and point evaluation, etc.
- Subroutine / module libraries for interval arithmetic, automatic differentiation, etc.
- Publicly available free of charge http://interval.usl.edu/GLOBSOL/GlobSol.tar.Z

# GlobSol

## Special Features

- Objective function and constraints are coded as Fortran 90 programs
- Can use <u>constraint propagation</u> (substitution/iteration) on the intermediate quantities in objective function, equality, and inequality constraint evaluation.
- Can use an overestimation-reducing "peeling" process for bound-constraints.
- Uses an effective point method to find approximate feasible points.
- Has a special augmented system mode for least squares problems.

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# GlobSol

### Special Features, continued

- Uses epsilon-inflation and set-complementation, with carefully controlled tolerances,
  - to avoid singularity problems.
  - to facilitate verification.

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# **GlobSol Features**

(continued)

- Has extensive error-checking (user input, internal errors, etc.)
- Has on-line web page documentation.
- The algorithm is configurable.
- Has various levels of printing, for various algorithm aspects.
- Source code and libraries for components are available.
  - Automatic differentiation access.
  - Interval arithmetic access.
  - User-modifiable, with adequate study.
- Gives performance statistics, both in report form and for input to spreadsheets.

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## Use of GlobSol

An Example

The following Fortran 90 program defines the objective function

minimize  $\phi(X) = -2 * x_1^2 - x_2^2$ 

subject to constraints

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## Use of GlobSol

An Example, continued

```
PROGRAM SIMPLE_MIXED_CONSTRAINTS
USE CODELIST_CREATION
PARAMETER (NN = 2)
TYPE(CDLVAR), DIMENSION(NN) :: X
TYPE(CDLLHS), DIMENSION(1) :: PHI
TYPE(CDLINEQ), DIMENSION(2) :: G
TYPE(CDLEQ), DIMENSION(1) :: C
```

OUTPUT\_FILE\_NAME = 'MIXED.CDL'
CALL INITIALIZE\_CODELIST(X)

PHI(1) = -2\*X(1)\*\*2 - X(2)\*\*2 G(1) = X(1)\*\*2 + X(2)\*\*2 - 1 G(2) = X(1)\*\*2 - X(2)C(1) = X(1)\*\*2 - X(2)\*\*2

#### CALL FINISH\_CODELIST END PROGRAM SIMPLE\_MIXED\_CONSTRAINTS

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(continued)

- 1. Running the above program produces an internal representation, or <u>code list</u>.
- 2. The optimization code interprets the code list at run time to produce floating point and interval evaluations of the objective function, gradient, and Hessian matrix.
- 3. A separate data file defines the initial search box, the bound constraints, and the initial guess, if any.
- 4. Separate data files supply algorithm options, such as which interval Newton method to use and how to precondition the linear systems.

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### The Data File

1D-5		!	General domain tolerance
0	1	!	Bounds on the first variable
0	1	!	Bounds on the second variable
FΓ		!	X(1) has no bound constraints
FΓ		!	X(2) has no bound constraints

Subsequent optional lines can give an initial guess point.

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Output File – abridged first part

Output from FIND\_GLOBAL\_MIN on 04/06/1999 at 08:03:52. Version for the system is: March 20, 1999

Codelist file name is: MIXEDG.CDL Box data file name is: MIXED.DT1

Initial box: 0.0000E+0

0.0000E+00, 0.1000E+01 ] [ 0.0000E+00, 0.1000E+01 ]

BOUND\_CONSTRAINT: F F F F

-----

CONFIGURATION VALUES:

EPS\_DOMAIN: 0.1000E-04 MAXITR: 60000 DO\_INTERVAL\_NEWTON: T QUADRATIC: T FULL\_SPACE: F VERY\_GOOD\_INITIAL\_GUESS:F USE\_SUBSIT:T OUTPUT UNIT:7 PRINT\_LENGTH:1 Default point optimizer was used.

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Output File – abridged second part

THERE WERE NO BOXES IN COMPLETED\_LIST. LIST OF BOXES CONTAINING VERIFIED FEASIBLE POINTS: Box no.:1 Box coordinates: [ 0.7071E+00, 0.7071E+00 ] [ 0.7071E+00, 0.7071E+00 ] PHI: [ -0.1500E+01, -0.1500E+01 ] Level: 3 Box contains the following approximate root: 0.7071E+00 0.7071E+00 OBJECTIVE ENCLOSURE AT APPROXIMATE ROOT: [ -0.1500E+01, -0.1500E+01 ] UO: [ 0.3852E+00, 0.3852E+00 ] U: [ 0.5777E+00, 0.5777E+00 ] [ 0.0000E+00, 0.1000E+01 ] V: 0.1926E+00, 0.1926E+00 ] Γ INEQ\_CERT\_FEASIBLE: FΤ NIN\_POSS\_BINDING:1 Number of bisections: 1 BEST\_ESTIMATE: -0.1500E+01 Total number of boxes processed in loop: 4 Overall CPU time: 0.5000D-01

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# Recent Improvements to GlobSol

- Simplified installation
- Provided makefiles for several compiler / operating system combinations
- Eliminated many bugs
- Incorporated numerical techniques for interval constants in objective and constraint definitions
- Enabled constraint propagation for equality and inequality constraints

## Simple Example of "Thick" Constants

```
minimize (x_1 - [1, 2])^2 + (x_2 - [3, 4])^2
```

PROGRAM THICK\_PARAMETER\_EXAMPLE USE CODELIST\_CREATION IMPLICIT NONE

INTEGER, PARAMETER:: NN=2
TYPE(CDLVAR), DIMENSION(NN):: X
TYPE(CDLLHS) :: PHI

OUTPUT\_FILE\_NAME='thick\_parameter\_example.CDL'
CALL INITIALIZE\_CODELIST(X)

PHI = (X(1) - INTERVAL(1,2))\*\*2 &
 + (X(2)-INTERVAL(3,4))\*\*2

CALL FINISH\_CODELIST END PROGRAM THICK\_PARAMETER\_EXAMPLE

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## Example with Thick Constants

(continued)

The "solution" is the set of all possible minima with constants in [1, 2] and [3, 4]. Thus, a minimum minimum and maximum minimum are obtained. The solution is

 $x_1 \in [1, 2], \quad x_2 \in [3, 4], \text{ and } \phi = 0.$ With initial box ([-10,10], [-10,10]), GlobSol gives

Box no.: 1 Box coordinates: [0.1000D+01, 0.1500D+01] [0.3000D+01, 0.4000D+01] PHI: [ 0.0000D+00, 0.2000D+01 ] Box no.: 2 Box coordinates: [0.1500D+01, 0.2000D+01] [0.3000D+01, 0.4000D+01] PHI: [ 0.0000D+00, 0.2000D+01 ] BEST\_ESTIMATE: 0.5000D+00 Total number of boxes processed in loop: 4 Overall CPU time: 0.0000D+00 GlobSol update May, 1999 SIAM-18

# Thick Constants

The basic idea

• The algorithm is made practical by stopping bisection when

w(value at center) >  $\beta$ w(interval image)

for adjustable parameter  $\beta \in [0, 1]$ .

- Smaller  $\beta$  leads to less work, but may lead to additional overestimation.
- Detailed experimental results will be given elsewhere.

## A Practical Application

- This is being applied to a non-trivial maintenance interval optimization problem.
- This is ongoing work with Claudio Rocco.

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## **GlobSol Installation and Use**

Installation and use has been greatly simplified.

- 1. Create a root directory for GlobSol.
- 2. Obtain the GlobSol file from http://interval.usl.edu/GLOBSOL/GlobSol.tar.Z and extract it into the GlobSol root directory.
- 3. Select an appropriate makefile and system-dependent file set (e.g. Sun with Sun compiler, Sun with NAG compiler), and extract these.
- 4. Edit a line in the makefile to specify the GlobSol root directory.
- 5. Edit a line in the macro (e.g. **unix\_fmake**) that creates internal representations from user-supplied objective function programs.
- 6. Run "make".
- 7. All executable, macro, and library files are now either in the GlobSol root directory or the subdirectory executables.

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## **GlobSol References**

- For the source, installation instructions, user guide, etc.: http://www.mscs.mu.edu/~globsol/
- Rigorous Global Search: Continuous Problems, R. B. Kearfott, Kluwer Academic Publishers, 1996. Contains
  - Most of the basic ideas underlying GlobSol.
  - Structure of the research code that eventually became GlobSo.
- For these transparencies: http://interval.usl.edu/preprints/1999\_SIAM.ps (Postscript)

<code>http://interval.usl.edu/preprints/1999\_SIAM.dvi</code>  $(T_{\ensuremath{E\!X}} \ensuremath{\,\mathrm{DVI}})$ 

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