### Structure and Problem Solving in ISL

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# **Context of this Project**

Context	<ul> <li>Validated computations have generally matured over the past 40 years.</li> </ul>
Goals	<ul> <li>Standardization is advancing on low-level computational aspects.</li> </ul>
Structure	<ul> <li>Algorithms and computational procedures are maturing.</li> </ul>

- There is a significant history of package building.
- There are numerous commercial examples of general-purpose libraries for non-validated scientific computing.
  - NAG

Examples

Conclusion

Prob. Solving

- Harwell
- LAPACK (for linear systems only)
- IMSL, etc.



# Goals

Context Goals	<ul> <li>Facilitate validated computation within the community of experts</li> <li>Foster wider use and acceptance within the scientific community in general</li> </ul>
Structure	To achieve these goals, it is useful to
Prob. Solving	<ul> <li>standardize behavior of the interval arithmetic itself;</li> </ul>
Examples	<ul> <li>unify low-level utilities and procedure calls across different problem-solving areas;</li> </ul>
Conclusion	<ul> <li>specify at a level that allows easy porting between different languages (e.g. between MATLAB, C++ and Fortran);</li> </ul>
	<ul> <li>provide package simplicity and clarity in the documentation.</li> </ul>
C.C.	To do this, we <i>must</i>
	<ul> <li>incorporate previous work;</li> </ul>

• engender wide participation within our professional community.



### Structure: Building on Previous Work

Context

We envision ISL to be hierarchical. Thus, we will build on

Goals

#### Structure

- ISL Structure
- Interval Arith.
- Extended Arith.
- Arith. Action
- BLAS
- BLAS Action

Prob. Solving

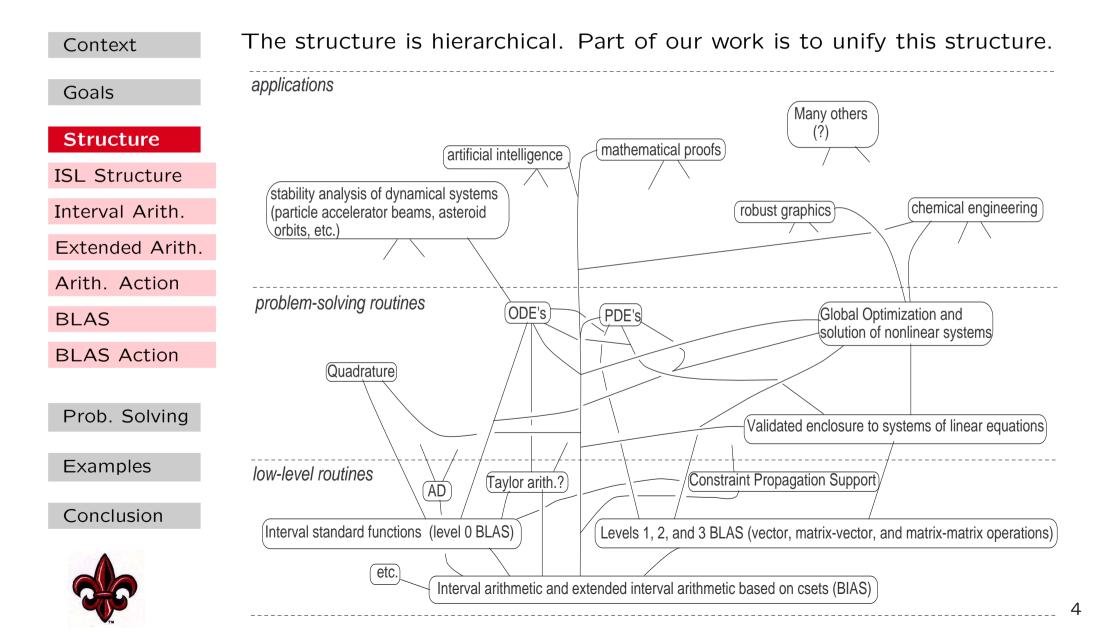
#### Examples



- increasing agreement concerning how low-level interval arithmetic should go;
- maturing refinements in understanding of interval arithmetic with infinite intervals;
- both interval and non-interval work in linear algebra;
- the extensive previous research in problem-solving areas such as
  - validated enclosure to solutions of linear systems
  - quadrature, global optimization and nonlinear systems, ODE's, PDE's, fuzzy logic, etc.



## A Tentative (and evolving) Structure





## **On Interval Arithmetic**

Context

Goals

#### Structure

ISL Structure

Interval Arith.

Extended Arith.

Arith. Action

BLAS

BLAS Action

Prob. Solving

Examples

Conclusion

- 1. Basic properties of interval arithmetic are substantially agreed upon at this point.
  - Previous work on a Fortran interval arithmetic standard has resulted in a document<sup>a</sup> and agreement on most issues.
  - Present work on a C++ interval arithmetic standard is progressing nicely.
- 2. Correct interval I/O is now possible to supply in virtually all languages without too much difficulty (e.g. with David Gay's gdtoa).
- 3. Various small issues remain, such as
  - representation of the empty set and operations with the empty set.
  - evaluation of a standard function when part (but not all of the input domain is outside the domain of definition of the function

These issues will largely be resolved with the cset theory of Pryce, with emerging consensus, and with careful documentation.

We have examined several high-quality packages; we intend to utilize these, modifying them as necessary.





### **On Extended Interval Arithmetic**

#### Context

Goals

#### Structure

ISL Structure

Interval Arith.

Extended Arith.

Arith. Action

BLAS

BLAS Action

Prob. Solving

Examples



- 1. Interval arithmetic involving division by zero or other function ranges that are infinite is useful in various contexts:
  - in interval Newton methods, when the complement of an interval is intersected with an interval.
  - in constraint propagation, when overestimation gives infinite extents, but subsequent intersection results in ordinary intervals.
- 2. Starting from work of Kahan (1968, "A more complete interval arithmetic," Tech. rep. Univ. Toronto), various extended interval arithmetics have been developed.
  - The extended floating arithmetic in the IEEE 754 floating point standard was motivated partially to support such an extended interval arithmetic.
- 3. Various revisions and corrections of this extended arithmetic have been proposed since Kahan.
  - Proposed systems have not given expected or consistent results in all problem-solving contexts.
  - Even if correct, existing systems are not optimally sharp, often giving  $[-\infty,\infty]$ .



### **ISL Actions: Extended Interval Arithmetic**

#### Context

We intend to

Goals

#### **Structure**

**ISL** Structure

Interval Arith.

Extended Arith.

Arith. Action

**BLAS** 

**BLAS** Action

Prob. Solving

#### Examples



- - use Pryce's cset theory to define the arithmetic clearly and unambiguously:
  - document the assumptions clearly where necessary, in the implementation incorporated into ISL, so users know exactly what to expect:
  - enable sharper bounds, especially when intersected with finite intervals;
  - forge a consensus within our community;
  - provide a reference implementation in our library, eventually to be incorporated into all problem-solving routines.



### The BLAS

#### Context

#### Goals

#### Structure

#### **ISL** Structure

#### Interval Arith.

#### Extended Arith.

#### Arith. Action

BLAS

#### BLAS Action

Prob. Solving

#### Examples



- The <u>Basic Linear Algebra Subroutines</u>, were originally by Lawson, Hanson, Kincaid and Krough (1979, see <u>http://portal.acm.org/citation.cfm?doid=355841.355848</u>), and were developed and championed by Dongarra et al in the LINPACK (see <u>http://www.netlib.org/linpack/</u>) and later LAPACK (see <u>http://www.netlib.org/lapack/</u>) packages.
- 2. Their nearly universal acceptance (due to simplicity and utility) has made them into a de-facto standard. Their standardization process has more recently proceeded formally in the BLAST fora, with a resulting multi-programming-language standards document (see <a href="http://www.netlib.org/blas/blast-forum/">http://www.netlib.org/blas/blast-forum/</a>).
- 3. The Interval BLAS, championed by Chenyi Hu (see http://www.cs.uca.edu/faculty\_files/Hu.htm), is in the "Journal of Development."



### **BLAS** Issues to be Resolved

#### Context

#### Goals

#### Structure

#### ISL Structure

Interval Arith.

Extended Arith.

- Arith. Action
- BLAS

#### **BLAS** Action

Prob. Solving

#### Examples



- Most issues were resolved.
- Issues remain concerning exceptions in interval vector and matrix operations when operations with the empty set or operations with infinities are encountered.
- There was not a consensus among interval arithmetic experts at the time the overall BLAS standard was adopted.
- The issues are important in the overall BLAS standardization effort, since a focus is efficiency of vector and matrix operations in advanced architectures.



### Action on Interval BLAS in ISL

#### Context

Goals

#### Structure

ISL Structure

Interval Arith.

Extended Arith.

Arith. Action

BLAS

BLAS Action

Prob. Solving

#### Examples



- 1. We will provide a reference (not necessarily optimal) implementation of the BLAS.
- 2. Our analysis and implementation of the fundamentals of extended interval arithmetic, including arithmetic involving the empty set, should clarify procedures for handling exceptions in interval vector and matrix operations (or else indicate how it can be done exception-free).
- 3. Participation of a large part of our community and fostering simplicity and clarity will lead to:
  - wide use of the library,
  - consensus on procedure,
  - standardization,
  - ease of porting,
  - widespread application.

(Structure and Problem Solving in ISL)



### **Problem Solving Routines**

Context	<ul> <li>Problem-solving routines are the numerical routines above the low-level routines and BLAS but below user-applications.</li> </ul>
Goals	• These routines correspond to chapters in a numerical analysis text.
Structure	<ul> <li>Examples of collections of problem-solving routines include the Karlsruhe toolboxes.</li> </ul>
Prob. Solving	<ul> <li>Problem-solving routines include various helper routines more specific than the low-level routines, but possibly of use on their own in further algorithmic research.</li> </ul>
Examples	<ul> <li>For ISL to be powerful enough for a maximum of applications,</li> </ul>
Conclusion	<ul> <li>participation of experts among us will be encouraged and facilitated,</li> </ul>
	<ul> <li>existing work should be incorporated, and</li> <li>formal testing and quality assurance (as to be introduced by Spencer Smith) should be included.</li> </ul>



### **Two Examples: Problem-Solving**

Context Goals Structure Prob. Solving **Examples** Linear Systems Lin. Sys. Helpers

#### Conclusion



- Validated enclosure of systems of linear equations.
- Global Optimization and validated solution of nonlinear systems.

We will describe

- work on which we hope to build,
- tentative structure, and
- helper routines

for these two examples.



### Validated Enclosure of Linear Systems

### Context

Goals

Structure

Prob. Solving

#### Examples

Linear Systems

Lin. Sys. Helpers

Optimization

Opt. Helpers



- Siegfried Rump has produced much good work over the years, and has embodied it in INTLAB (a MATLAB toolbox; see http://www.ti3.tu-harburg.de/~rump/intlab/); we hope to build upon much of that.
- We can also incorporate our improved extended arithmetic to bound infinite solution sets for non-regular problems.
- We can include routines for computing exact bounds (for small systems).
- Longer term: We can include routines for specially structured systems, as with packages for non-validated floating point solvers.



# Helper Routines: Linear Systems

Context	1. Non-validated floating point routines from other packages
Goals	<ul> <li>Linear system solvers</li> <li>Linear and quadratic programming solvers</li> </ul>
Structure	2. Preconditioner set-up and solve routines
Prob. Solving	<ul><li>Inverse midpoint</li><li>Optimal width</li></ul>
Examples	<ul> <li>Mignitude optimal</li> <li>S-preconditioners, left-optimal, and right-optimal preconditioners</li> </ul>
Linear Systems	<ul> <li>Various heuristic combinations</li> </ul>
Lin. Sys. Helpers	3. Solver routines
Optimization	<ul> <li>Computation of exact hulls</li> </ul>
Opt. Helpers	<ul> <li>Gaussian elimination</li> </ul>
	Application of a Gauss–Seidel step
Conclusion	<ul> <li>Gauss–Seidel iteration and validation</li> </ul>
	4. Epsilon-inflation routines
	5. Etc.



### Nonlinear Systems; Global Optimization

Context	<ul> <li>Previous work includes that of Jansson et al, Arnold Neumaier and the COCOS project (see http: //www.mat.univie.ac.at/users/neum/public_html/glopt/coconut/), GlobSol, constraint solvers such as ICOS (see</li> </ul>
Goals	
Structure	http://www-sop.inria.fr/coprin/ylebbah/icos/), etC.
	<ul> <li>These systems represent many years of work.</li> </ul>
Prob. Solving	<ul> <li>Initially, nonlinear systems and global optimization capability in ISL</li> </ul>
Examples	may need to be represented by one or more of these packages, essentially unchanged.
Linear Systems	<ul> <li>With work, we will improve the portability, maintainability, etc. of</li> </ul>
Lin. Sys. Helpers	these packages by integrating them more fully with the lower-level support routines of GlobSol.
Optimization	<ul> <li>Research into algorithms is continuing, and will result in significant improvements in years to come.</li> </ul>
Opt. Helpers	
Conclusion	



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### Validated Optimization: Helpers

Context
Goals
Structure
Prob. Solving

#### Examples

Linear Systems

Lin. Sys. Helpers

Optimization

Opt. Helpers

Conclusion



• Many lower-level ISL routines

- constraint propagation support
- automatic differentiation
- (possibly) Taylor arithmetic
- various routines from the linear systems chapter

will be useful.

- Routines for rigorous linear underestimators, such as described in Borradaile and van Hentenryck (see <a href="http://www.mat.univie.ac.at/~neum/glopt/mss/BorH04.pdf">http://www.mat.univie.ac.at/~neum/glopt/mss/BorH04.pdf</a>) Or Hongthong et al (see <a href="http://interval.louisiana.edu/preprints/estimates\_of\_powers.pdf">http://interval.louisiana.edu/preprints/estimates\_of\_powers.pdf</a>)
- Interval Newton routines (partially or totally based on linear system solving routines)
- Routines to support processing lists of boxes
- Routines implementing stopping criteria
- Routines to do tessellation (bisection, taking the complement of a box in a list of boxes, etc.)
- One or more routine representing the overall branch and bound process.
- Etc.



### Conclusion

- 1. We envision a comprehensive, universally used <u>library</u><sup>a</sup>. In this way, we hope to go beyond previous efforts.
- 2. Problem solving routines from all areas of numerical analysis will eventually be represented.
- 3. We view the effort as promoting standardization, portability, and re-use.
- 4. To attain these goals with a practical number of resources, the following are important:
  - Cooperation, discussion, consensus, and participation within our professional community
  - Participation from professional software vendors, such as NAG.
  - Support from home institutions and granting agencies (travel grants, release time, etc.)

### Quality, comprehensive libraries are not compiled by a single person or small group of people over a short time.

<sup>a</sup>This is in contrast to offering general languages, such as in the CO-CONUT project or GAMS, or offering graphical user interfaces such as in various commercial packages

#### Context

Goals

Structure

Prob. Solving

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Examples
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