LIBOPT – An environment for testing solvers on heterogeneous collections of problems

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The Libopt environment is both a methodology and a set of tools that can be used for testing, comparing, and profiling solvers on problems belonging to various collections. These collections can be heterogeneous in the sense that their problems can have common features that differ from one collection to the other. Libopt brings a unified view on this composite world by offering, for example, the possibility to run any solver on any problem compatible with it, using the same Unix/Linux command. The environment also provides tools for comparing the results obtained by solvers on a specified set of problems. Most of the scripts going with the Libopt environment have been written in Perl.

Categories and Subject Descriptors: D.2.5 [Software Engineering]: Testing and Debugging— Testing tools; D.2.8 [Software Engineering]: Metrics—Performance measures; G.1.m [Numerical Analysis]: Miscellaneous; G.4 [Mathematical Software]: Efficiency

General Terms: Experimentation, Measurement, Performance

Additional Key Words and Phrases: benchmarking, collection of problems, CUTEr, Libopt, Modulopt, optimization, performance profile, scientific computing, solver comparison, testing environment

1. INTRODUCTION

Two of the issues that come up with software development in scientific computing have to do with benchmarking and profiling solvers on some (possibly large) collections of problems. For example, in the optimization community, these issues are frequently dealt with the *CUTEr testing environment* [Bongartz et al. 1995; Gould et al. 2003]. This one supplies ready-to-use interfaces between some known solvers and a collection of problems encoded with the SIF language [Conn et al. 2003]. It is intended to help developers to test and improve their optimization solver. The Libopt environment has been designed for a similar purpose but, unlike CUTEr, it

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provides neither collections of problems written in a specific format, nor decoders for converting problems written in some language into FORTRAN or C; on the other hand, it is not restricted to optimization. Rather, Libopt has been thought up for organizing and using problems coming from heterogeneous sources. Heterogeneity refers, in particular, to the variety of languages used to write solvers and problems. As a result, Libopt considers CUTEr a particular collection of problems having its own features and solver-collection interface.

Originally, we had in mind to make the problems of the *Modulopt collection* [Lemaréchal 1980] as easily available as the CUTEr problems, despite the diversity of their encoding. The Modulopt collection is formed of problems coming from industrial or scientific computing sources. Because of their complexity, these codes are often not modeled on the academic standard of idealized problems, so that it would have been difficult and tedious to rewrite them in SIF. This state of affairs motivated the development of the Libopt environment, which resulted in a layer covering various collections of problems (including CUTEr and Modulopt) and solvers, organizing and normalizing the communication between them. As a consequence, the Libopt environment also offers to the solver developers who are not familiar with a particular modeling language, the possibility to define their own collection of problems, using their preferred general purpose language, and to run these problems by using the same set of commands as those that can now run the CUTEr and Modulopt problems.

In addition to its solver-collection setting, Libopt also provides a number of programs, mainly Perl scripts, that perform repetitive tasks, such as collecting the results of solvers on problems and comparing these. The features of the solvers and collections are actually encoded in these programs, some of them having to be written for each solver-collection pair. Once these are available, all the results are obtained and compared using the same Unix/Linux commands. This is one of the advantages of the proposed approach. Now, Libopt is an open structure, which can grow, depending on the needs of its users, by incorporating more solvers, problems, or even collections of problems. A large part of a *companion manual* [Gilbert and Jonsson 2009] describes this aspect of the software.

The suffix "opt" of the environment name reflects the fact that Libopt was first introduced to deal with optimization solvers and problems. However, the concepts implemented in this software are sufficiently general for being suitable to other scientific computing fields or even to a larger domain in which the comparison of codes can be based on quantifiable measurements. The tools have been designed with this idea of generality in mind.

The paper is organized as follows. The guided tour of section 2 invites the reader to discover the main aspects of the software. This view of Libopt, from 10,000 feet, essentially presents the tools that are intended to be routinely employed. Section 3 goes a little deeper in the Libopt machinery. Its goal is to shed some light on the techniques used to implement the Libopt commands. As a representative example, the libopt run command, used to run solvers on problems, is decorticated to show how a high level solver-problem-independent command may be decomposed in sub-scripts more and more attached to solvers and collections. The reasons for preceding like this are also discussed. This paper is rather short since we already

give some words of conclusion in section 4. Now, many more details are given in the companion manual [Gilbert and Jonsson 2009], in particular those that are too technical to be presented here or that might change with the evolution of the software.

The current address of the Libopt site is

http://www-rocq.inria.fr/estime/modulopt/libopt/

Notation. We use the following typographical conventions. The typewriter font is used for a text that has to be typed literally and for the name of files and directories that exist as such (without making substitutions). In the same circumstances, a generic word, for which you are supposed to substitute a value depending on the context, is written in *italic typewriter font*.

Throughout this paper, we assume that the operating system is Unix or Linux. The *system prompts* are denoted by the characters '%' and '?' (the latter for multiple lines) and are used to distinguish command lines from other indications. Optional (part of) arguments in a Unix/Linux command line are surrounded by the brackets '[' and ']'.

2. A GUIDED TOUR

The Libopt environment has been designed to make easier and faster the repetitive tasks linked to testing, comparing, and profiling solvers on problems coming from heterogeneous collections of problems. These tasks can be divided into three stages: running solvers on problems, gathering the results, and comparing them. Libopt has three *subcommands* associated with these stages: run, base, and profile. The corresponding Unix/Linux command line has the form

% libopt subcommand ...

where *subcommand* can be **run**, **base**, or **profile** (or many other subcommands described in the companion manual), and the dots stand for the subcommand arguments. This section offers an introduction to these subcommands. But before this, let us start by defining terms that are continually used in this paper.

2.1 A few definitions

The *Libopt hierarchy* is the set of directories (and files) that form the skeleton (and material aspect) of the Libopt environment. The directory from which the Libopt commands are launched is called below the *working directory*. When this is important, the commands take care that this directory is not in the Libopt hierarchy. If this were the case, there would be a danger of incurable destruction. Indeed, the scripts triggered by the libopt run command generally removes several files from the working directory after a problem has been solved.

A *solver* is a computer program that can find the solution to some classes of problems. Well, not sure this is very explicit, but we shall not try to be more precise; in the same vein, we shall take the notion of *problem* as a concept, not requiring any definition.

A *collection* is a set of problems in an arbitrary scientific computing area. Problems in the same collection must differ by their *name*, but two problems belonging

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to two different collections may have the same name (luckily, since usually collection designers do not communicate and may well choose the same name for two different problems). There are good reasons for gathering problems having common features in the same collection. For instance, problems in a collection are often written in the same language (Fortran, C, Matlab [MATHWORKS], Scilab [SCILAB 2008], Gams [Brooke et al. 1988], Ampl [Fourer et al. 2003], SIF [Conn et al. 2003], to mention a few). The motive is that, in the Libopt environment, all the problems of a collection are dealt with the same scripts and that these scripts are easier to conceive if the problems are written in the same language. For the same reason, problems in a collection usually belong to the same scientific computing domain (optimization, linear algebra, differential equations, etc). Another property that is usually shared by all the problems of a collection is the extent to which they are protected against dissemination; this is useful for determining the public to which the collection can be distributed.

A *subcollection* is a subset of problems belonging to the same collection. A collection may contain several subcollections, and a problem may belong to more than one subcollection. The reason why the notion of subcollection is introduced is clear: some solvers can sometimes only solve a part of the problems of a given collection and it is useful to be able to designate them. For example, in optimization, there is some advantages in distinguishing the subcollections of unconstrained problems, of linear problems, of quadratic problems, of bound constrained problems, etc, since there are solvers that are dedicated to these classes of problems.

2.2 Running solvers with libopt run

Libopt can only deal with solvers that are registered in its environment. The procedure to do this is described in the companion manual [Gilbert and Jonsson 2009]. Below, we denote by

solv

the generic name of such a solver. Similarly, Libopt can only consider collections of problems that are installed in its hierarchy. This simply means that some directory (or a symbolic link to it) has to contain the problems of the collection (these can be in an arbitrary format) and some files and scripts have to tell how to use the collection (this is why the format can be arbitrary). Below, we denote by

coll, subc, and prob

the generic names of a collection, subcollection, and problem, respectively.

The simplest way of running the solver *solv* on the problem *prob* of the collection *coll* in the Libopt environment is by entering

% libopt run "solv coll prob"

We quote a few advantages to have at our disposal such a command to run solvers on problems.

• First, the form of the command for running any solver on any problem of any collection is invariant: it does not depend on the solver, the collection, or the problem. In our experience, this property saves much memorization effort. In

particular, it gives to a collection, which is not used often and is coded in a manner that is difficult to remember, more chance to be tested, even after it has been abandoned for several years.

- Second, it defines a standard, to which solver developers can contribute by providing the interfaces between their solver and various collections.
- Also, the possibility to consider a large diversity of collections should allow the environment to accept problems coming from various sources.

Libopt can deal with collections whose problems may have several data sets. If *prob* in the libopt run command above is made of two strings linked by a dot, like in

pnam.pdat,

Libopt considers that the *radical* of the problem name is *pnam* and that this problem has to be solved with a data set identified by the string *pdat*. How the data set is built from this string depends on the collection and its installation. The Modulopt collection [Gilbert 2007], which stores each of its problems in a different directory, takes advantage of this feature to avoid duplicating a problem directory and its contents for each of its data sets.

A slightly more powerful use of the libopt run command is

```
% libopt run "solv coll.subc"
```

where *subc* is a subcollection of the collection *coll*. By this command the solver *solv* is run on all the problems of the subcollection *subc*. The *libopt run* command can also take into account more than a single directive "*solv coll prob*" or even a file listing such directives.

Another interesting way of running a solver on a collection of problems is by entering

% libopt run "solv.tag coll"

where tag is some string tagging the solver name. This feature can be useful to mark the results obtained with a particular version of the solver solv or the one corresponding to a particular set of options (see the companion manual for the details and section 2.5 for an example of use).

2.3 Gathering results with libopt base

By the libopt run command a solver-problem pair writes its output on its usual files, which probably include the Unix/Linux standard output. In order to compare solvers, which is one of the main goals of the Libopt environment, there is no reason to save all these files, which mainly interest the developer of the problem code. In fact, the standard Libopt scripts normally remove these files after having run a solver on a problem. This is because, Libopt has been designed to *compare* the results of various solvers and does not provide any tool to *analyze* them. For this reason, Libopt is interested in the value of various counters that reflect the performance of a solver on a particular problem. In optimization, these counters are often the number of function or derivative evaluations, the CPU time, the precision of the obtained solution, and many others.

In order to be able to make comparisons, Libopt imposes that the results relevant to a comparison be condensed on the standard output in a string of the form

```
libopt%solv%coll%prob%sequence-of-token-number-pairs
```

This one is called the *Libopt line*. It is formed of a sequence of fields separated by the character '%'.

- The first field is the string "libopt". It is present to make it easy to locate the Libopt line in the standard output (using the command grep for example).
- The next three fields give in order the name of the solver (solv), the name of the collection (coll), and the name of the problem (prob), whose relevant results are given in the following fields.

These first four fields are positional, i.e., their order is imposed. This is not the case for the following ones.

• The *sequence-of-token-number-pairs* is a string formed of a sequence of token-number pairs, again separated by the character '%'. A *token-number pair* is a string of the form

token = number

The character '=' must separate the *token* (an arbitrary string) from the *number* (a string representing a real number). There must be at least two token-number pairs, one of which is used to compare the results (it must be a *performance* token-number pair actually, see section 2.4) and another one must have the form

info=number

where the string "info" is imposed and a *number* equal to 0 means that the solver *solv* has successfully solved the problem *prob*.

Note that, since the Libopt line is written by some program provided by the developer of a solver, it is that program that decides whether the solver has successfully solved a given problem; Libopt has no means to take such a decision. In the Modulopt collection, each problem helps the solver to take that decision by specifying criteria that must be satisfied for deciding whether the problem has been solved [Gilbert 2007].

An example of Libopt line in optimization could be

```
libopt%m1qn3%modulopt%u1mt1%n=1875%nfc=587%nga=587%info=0
```

to mean that the solver M1qn3 has been run on the problem u1mt1 of the collection modulopt, that this problem has 1875 variables (n=1875) and that a solution has been found (info=0) using 587 function and gradient evaluations (nfc=587 and nga=587).

The concept of Libopt line, close to the notion of *trace files* used by the PAVER server [Mittelmann and Pruessner 2003], introduces some standardization that could be viewed as an unnecessary constraint. As we shall see below, it plays however a crucial role in avoiding the duplication of results, which would bias the information contained in performance profiles.

Now, the command

```
ACM Transactions on Mathematical Software, Vol. V, No. N, Month 20YY.
```

% libopt run -1 "solv coll.subc" > solv_coll_subc.lbt

gathers in the file *solv_coll_subc*.lbt a sequence of Libopt lines describing the behavior of the solver *solv* on the problems of the subcollection *subc* of the collection *coll*. The option -1 greps indeed the Libopt lines in the standard output.

There may be many files of results like *solv_coll_subc.lbt* and there is some advantages in gathering all the results they contain in a single file. This gathering operation is also a good opportunity to verify that the Libopt lines in the result files are consistent and that there is at most one result for each (solver, collection, problem) triple. This is exactly what the libopt base command with the option -a does (more generally, the libopt base command deals with the operations in connection with the result databases). If one enters

% libopt base -a *solv_coll_subc*.lbt

the Libopt lines in the result file are decoded, checked, and stored in a database, whose default name is libopt_database in the working directory. This database is no longer an ascii file, but a binary file or a pair of binary files, depending on the operating system. By entering the libopt base -a command for all the relevant result files, one can obtain a database containing all the results of interest, without duplicated or contradictory data. The database can be managed, using the options of the libopt base command.

2.4 Comparing results with libopt profile

The libopt profile command has been designed to make comparisons between solvers on a selected set of problems. The comparison is based on the results stored in a database, one generated by the libopt base -a command. A single criterion can be used for making this comparison, and it must be one of the tokens present in the Libopt lines summarizing the results to compare. This comparison made by libopt profile produces files that can be subsequently dealt with Matlab or Gnuplot. These files describe the *performance profiles* à la Dolan and Moré [Dolan and Moré 2002] of the solvers.

In the Libopt line, one finds descriptive token-number pairs (or descriptive tokens) and performance ones. The semantics behind this distinction is rather intuitive: a *performance token* is a token that can be used to compare solvers, while a *descriptive token* is a non-performance token. A performance token-number pair must have the following properties:

- the token-number pair must, obviously, depend on the solver (not only on the problem, like the one specifying the number of unknowns),
- the number in the token-number pair must be positive (> 0),
- the number in the token-number pair is *better* (i.e., indicates a better performance) when it is *smaller*.

In the example given on page 6, n=1875 must be considered as a descriptive tokennumber pair (the dimension of the problem is not a property of the solver), while nga=587 is normally a performance one, since an optimization solver can be considered to be better when it requires less derivative evaluations. Libopt cannot verify that these rules have been observed (except for the positivity of the number), but the performance profiles that libopt profile generates assume that they hold; they would have no meaning otherwise.

Descriptive tokens are not useless. In addition to giving information on the problems, they can be used for selecting the problems on which a comparison is made. For example, one can be interested in making a comparison of solvers on problems with more (or less) than 1000 variables, and/or those with (or without) inequality constraints, etc. Read the companion manual or the libopt manual page to learn how to specify a selection of problems.

The easiest way of using the command libopt profile is by entering

% libopt profile

Then, the script scrutinizes the database (its default name is libopt_database in the working directory) and reads the specification file libopt_profile.spc in the working directory to know what it has to do. This file is described in detail in the companion manual. It can contain many *directives*. Three of the most important ones are those that specify the solvers that have to be compared, the problems on which they have to be compared, and the performance token chosen for the comparison. For example

```
solver bosch klee durer
collection painting.selfportraiture
performance criterion $time
```

is understood by libopt profile as a requirement to compare the execution time for the three solvers bosch, klee, and durer, on the problems from the subcollection selfportraiture of the collection painting (the solver names do not refer to the painters with the same names: painters never work on the same "problems" and comparing their works on their execution time would not be a good idea). Then libopt profile generates performance profiles like those in figure 1 (a few



Fig. 1. Typical performance profiles for three solvers; relative performance (abscissa) in log₂ scale

additional tunings in the specification file are necessary to get precisely that graph). We refer the reader to the paper by Dolan and Moré [Dolan and Moré 2002] (or to the companion manual) for the meaning of the performance profiles in the figure.

When developing a solver, one is often led to make harmless modifications, which should have no effect on the performance of the solver. To be more confident on the fact that these innocuous modifications have indeed no side effect, one can see whether the solver provides the same results on a more or less large collection of problems. Libopt provides a convenient way of realizing this. Suppose that the file res_before.lbt (resp. res_after.lbt) contains the Libopt lines obtained on this collection of problems before (resp. after) having made the modifications. Then the command

% libopt diff -p perf res_before.lbt res_after.lbt

will tell whether the performance perf has been affected by the modification and, in case the answer is affirmative, for which problems.

2.5 An example of use

To make the guided tour more concrete, we present an example in which the Libopt environment is used to compare two options of an optimization piece of software. The chosen solver is M1qn3, a largely diffused unconstrained optimization code using the ℓ -BFGS formula [Gilbert and Lemaréchal 1989]. This example will show in the same time the usefulness of tagging a solver name, with the optional string ". tag" in the libopt run command (see the end of section 2.2).

We want to compare the scalar and diagonal running modes of M1qn3 on 143 unconstrained CUTEr problems (identified by the list unc.lst in the cuter directory). For this, we start by running M1qn3 with its default setting (diagonal running mode):

% libopt run -1 "m1qn3.diag cuter.unc" | libopt base -a

Note that the name of the solver has been tagged with the string ".diag" to remember the M1qn3 option used in the run. The only effect of this tagging is to generate Libopt lines in which the name "m1qn3" of the solver is suffixed with the string ".diag". Note also that the option -1 has been used to grep the libopt lines from the standard output of the libopt run command. Then, these lines are piped to the standard input of the libopt base command, which stores (option -a) their contents in the default database. We assume here that the default database is empty at the beginning of our experiment; otherwise the option -r of the libopt base command could have been more appropriate to replace possibly already existing and obsolete results. The previous command takes some time to be completed and it does not store the Libopt lines in an intermediate file, which is not particularly cautious. An alternative way of proceeding, in which the Libopt lines are saved in the file m1qn3diag-cuter-unc.lbt, could be

% libopt run -l "m1qn3.diag cuter.unc" > m1qn3diag-cuter-unc.lbt % libopt base -a -v m1qn3diag-cuter-unc.lbt

The option -v has been added in the second command to get more information on the results inserted in the database.

To get the results of the M1qn3 solver in scalar running mode, one has to modify the specification file

\$CUTER/common/src/pkg/m1qn3/m1qn3.spc,

by replacing the key-value pair "imode1 0" by "imode1 1". The results with this running mode are then inserted in the database by the commands

% libopt run -1 "m1qn3.scal cuter.unc" | libopt base -a -v

Observe that, this time, the solver name has been tagged with the string ".scal" to distinguish the presently generated Libopt lines from those generated by the previous commands. Actually, libopt run considers that the solver is still M1qn3, while libopt base considers that the libopt lines with m1qn3.diag are different from those with m1qn3.scal, so that the latter will indeed be inserted into the database.

We are now ready to produce performance profiles, comparing the two running modes of M1qn3. In order to compare them on the number of gradient evaluations, identified by the token nga in the Libopt lines, we have to adapt the solver and performance directives of the specification file libopt_profile.spc as follows:

```
solver m1qn3.diag m1qn3.scal
performance criterion $nga
gnuplot filetype epsc
```

The performance criterion directive expects to find a Perl expression; this is why, above, nga has been prefixed by the character '\$' to make it a Perl variable. The next gnuplot directive asks to generate an encapsulated postscript file for color printers, using the Gnuplot plotting software (while Matlab was used to draw the picture in figure 1). Now the command

% libopt profile

generates the performance profiles shown in figure 2. A reader used to this kind of



Fig. 2. Performance profiles of the diagonal (m1qn3.diag, red top curve) and scalar (m1qn3. scal, green bottom curve) running modes of M1qn3 on 143 unconstrained problems of the CUTEr collection, comparing the number of function evaluations; relative performance (abscissa) in \log_2 scale

curves can deduce that the diagonal mode of M1qn3 can be considered slightly more efficient than the scalar mode (its profile is higher). This is an average estimation, since the plot with its 2-logarithmic abscissa reveals that, if the scalar mode can

require about 4 times more function evaluations than the diagonal mode on some problems, the latter can also require sometimes about 2.5 times more function evaluations than the former on other problems.

Now that the experiment has revealed that the diagonal running mode is usually better than the scalar running mode, it is probably a good idea to switch back the option imode1 to 0 in the specification file m1qn3.spc.

3. BEHIND THE SCENERY

The goal of this section is to shed some light on the techniques used to implement the commands introduced in the guided tour of section 2. We restrict ourselves to the aspects of the software that are unlikely to change with its evolution, letting the companion manual [Gilbert and Jonsson 2009] give an account of the details and the last improvements.

Libopt can be viewed as a rigid empty shell (the core of its directory structure sketched in section 3.1) and a flexible methodology (embodied in its scripts). Some scripts are permanent, independent of the considered problem collection and solver. These are called the Libopt *commands* and cannot be modified by the user. Other scripts, triggered by the Libopt commands, depend on the considered problem collection and solver, on the way they are installed in the Libopt hierarchy, on their features. Some of them must be installed at definite places in the Libopt can be very permissive on the kinds of problem collection and solver installation, and should be easily adaptable to various situations. This organization in execution levels is encountered in various Libopt subcommands, such as **run**, **addcell**, and **addproblem**. We examine the case of the **run** subcommand in section 3.2; the other ones are considered in the companion manual.

3.1 Structure of the Libopt hierarchy

The Libopt hierarchy is formed of a tree of subdirectories, whose root name is libopt, which is identified by the Unix/Linux environment variable

LIBOPT_DIR.

This top-level directory contains the directories **bin** (Perl scripts of the Libopt commands), **collections** (problem collections), and **solvers** (solver descriptions and interfaces), as well as other directories and plain files; see figure 3.

The collections directory gathers a set of subdirectories, each of them corresponding to an installed collection of problems. The standard distribution includes the collections CUTEr [Gould et al. 2003] in cuter and Modulopt [Lemaréchal 1980; Gilbert 2007] in modulopt. More generically, the directory collections/ coll contains the description of the collection coll. What this actually means is reflected in the scripts that use this collection, so that these directories can be organized with a great freedom, as far as Libopt is concerned.

It is natural to put in these collection directories (the subdirectories of collections) some *lists of problems*. These are files whose name must have the suffix ".lst". Two of these lists are mandatory:

• all.1st is the list of all the problems of the collection;

Level	0	Level	1	Level	2	Description
bin collec [.]	tions	cuter				Libopt scripts Collection directory CUTEr collection Modulopt collection
solver	s	mlqn3	····	bin .	· · · · · · · ·	Solver directory M1qn3 directory M1qn3 binary directory
		sqplat	o	cuter modulo	opt .	M1qn3/CUTEr interface M1qn3/Modulopt interface Sqplab directory Sqplab/CUTEr interface

Fig. 3. Part of the Libopt hierarchy

• default.lst is a list of a subset of the problems of the collection; this list is chosen by the run subcommand when no list is specified as one of its arguments (see section 3.2.2); it is sometimes a symbolic link to the list all.lst.

It is also natural (but not mandatory) to have in collections/coll a subdirectory, usually called probs, which contains all the problems of the collection. For example, in the standard distribution, collections/modulopt/probs contains a subdirectory for each of the problems of the Modulopt collection, which describes this problem by programs, data, Perl scripts, and a makefile. Of course probs can be a symbolic link to the actual problem directory.

The directory collections provides no information on the solvers. This information is given by the directory solvers, which has a subdirectory for each solver known to the Libopt environment. The directory solvers is actually very rich, since, in some sense, it reflects the structure of the Cartesian product

$$\{\texttt{solv_1}, \dots, \texttt{solv_m}\} \times \{\texttt{coll_1}, \dots, \texttt{coll_n}\}$$
(3.1)

corresponding to the interfaces between the solvers and collections. An element (*solv*, *coll*) of this Cartesian product, where *solv* is some solver *solv_i* and *coll* is some collection *coll_j*, is called a *cell* below. For each cell (*solv*, *coll*), the directory *solvers/solv/coll* contains information describing how to run the solver *solv* on the problems of the collection *coll*. This directory includes the following mandatory files/scripts (see figure 4):



Fig. 4. A single cell of the $\{\text{solvers}\} \times \{\text{collections}\}$ Cartesian product

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- all.lst is the list of all the problems of the collection *coll* that the solver *solv* is structurally able to solve (note that this meaning is quite different from the one of the file collections/*coll*/all.lst described above); for instance, the file solvers/m1qn3/cuter/all.lst is a symbolic link to the list of unconstrained problems of the CUTEr collection;
- default.lst lists a subset of the problems in all.lst; this list is used by some scripts when no list is specified as one of its arguments (see section 3.2.2);
- *solv_coll* is a script that tells how to run the solver *solv* on a problem of the collection *coll*; it essentially takes care of the operating system commands that are required to launch *solv* (see section 3.2.3); note that the name of the script depends on the directory where it is placed.

The directory may also contain other files, like the source code of a main program *solv_coll_main.src* able to run the solver *solv* on a single problem of the collection *coll*, which takes care of the instructions that cannot be written in a Unix/Linux script, and a makefile Makefile (see section 3.2.4).

3.2 The libopt run command

3.2.1 Overview. The libopt run command, with its dependent scripts and programs, is probably one of the most complex commands offered by the Libopt environment. It is used to run solvers on problems (see section 2.2 for an introduction). Because of its genericity, this command cannot perform by itself all the details of this operation. Indeed, it cannot know all the features of any possible solver and any possible collection of problems, especially those that are still not installed in the hierarchy! For this reason, the libopt run command must delegate part of the operations to other scripts/programs, some of them being written by the persons introducing new solvers and collections into the Libopt environment.

The operation of running solvers on problems is actually decomposed in three levels of scripts/programs.

• The Libopt level.

The first level is formed of the operations implemented in the script

\$LIBOPT_DIR/bin/libopt_run.

These operations are those that are independent of any solver and any problem collection. The aim of this level is to analyze the libopt run command line and to decompose it in a sequence of elementary operations of the form

run the solver *solv* on the problem *prob* of the collection *coll*. (3.2)

There are as many elementary operations as there are combinations of solvers, collections, and problems expressed by the libopt run command line. To execute each elementary operation, the libopt_run script calls the *solv_coll* script of the second level.

The libopt_run script is further described in section 3.2.2.

• The operating-system level.

The second level is the one that takes in charge the elementary operation (3.2).

It is performed by the programs

\$LIBOPT_DIR/solvers/solv/coll/solv_coll

These are actually Perl scripts in the standard distribution. There is a third level since, by choice and for more flexibility and readability, the $solv_coll$ scripts are restricted to the necessary operations at the operating system level. However, unlike the libopt_run script, these operations depend here on the solver solv and the problem collection coll. Typical operations consist in copying data files in the working directory, running makefiles to get executable programs, launching the main program, and removing data and result files from the working directory on exit from the main program. For some collections of problems (like CUTEr), a part of these operations may also have been delegated to other programs intimately incorporated into the collection.

More is said about the *solv_coll* scripts in section 3.2.3.

• The main program level.

Running a program on a problem does not only depend on operations done at the operating system level. A main program has to be written, which reads the data, calls the solver, and delivers diagnostics. It is at this level that the *Libopt line* is generally written to standard output. This is the part of the Libopt environment that is the most interlinked with the solver and collection structures. As a result, such a program has to be written for each new solver-collection pair.

This level is further described in section 3.2.4.

3.2.2 The libopt_run script. The libopt run command calls the libopt_run script to execute the required operations (both libopt and libopt_run are located in the bin directory of the Libopt hierarchy). We have said that the latter is independent of any solver and problem, so that it need not be adapted when the Libopt environment is enriched with new solvers or new collections of problems.

This paper might not the right place to describe in large the libopt_run script. However, a rather detailed description of the command should give a good idea of the possibilities of the Libopt environment.

The general form of the libopt_run script is the following

It is here equivalent to enter 'libopt run' instead of 'libopt_run', since the former is transformed into the latter by the libopt command.

Let us start by describing the options. If the option -h (help) is present, the other arguments of the command are ignored and a short help message is given. This is probably the best way of getting a reminder of any libopt subcommand. The option -v (verbose) sets the command in verbose mode, which is interesting when one has to debug the installation of a new solver or collection, or the activation of a cell. The option -t (test) is similar to the verbose option, except that nothing is executed; the command just tells what it would do without doing it. This is also interesting to check new installations, with an additional degree of safety. We have already encountered the option -1 (libopt line), which filters the libopt

lines from the standard output. The option -k (keep) can be used to prevent the command from removing files once they are no longer useful. In that case, all the files generated during the run remain in the working directory. With the option -g (debug), the final executable program that can solve a given problem with a given solver is not executed but saved in the working directory with symbolic debug information to allow debugging.

If *directives* is present, it must be formed of one or more *directives*, separated by blanks. Each directive must be surrounded by quotes (") and must be a string of the form

```
solv[.tag] coll[.subc] [list-of-problems]
```

where solv is the name of a solver installed in the Libopt hierarchy, tag is an optional string that will tag the solver name in the Libopt line (the usefulness of this option was illustrated in section 2.5 and is further discussed in the companion manual), coll is the name of a collection installed in the Libopt hierarchy, subc is the name of a subcollection of the collection coll, and list-of-problems is a list of strings separated by blank characters, which selects some problems from the considered (sub)collection. If the option '-f DFile' is present, each line of the file DFile must be formed of at most one directive of the form above. Then the libopt run command considers the directives in directives and those in the file DFile in sequence. For each of them, it runs the solver solv on each of the problems of the collection coll from the list-of-problems.

For each directive, the list of problems that are passed over to solv depends on the presence of the strings subc and list-of-problems in the command line. In addition, the subcollection subc may refer to lists of problems with the same name in one of the directories

\$LIBOPT_DIR/collections/coll
\$LIBOPT_DIR/solvers/solv/coll,

or in the working directory. To determine the final list of problems to solve, the run subcommand follows a number of rules with a certain logic, in which the all.lst and default.lst lists, with their directory-dependent meaning (see section 3.1), play a key role. These rules are explained in the companion manual.

3.2.3 The solv_coll scripts. A solv_coll script must exist for each solver solv that has been installed in the Libopt environment to run problems from the collection coll. It must be placed in the directory

```
$LIBOPT_DIR/solvers/solv/coll
```

and is launched by the libopt_run script discussed in section 3.2.2. It must accept the following command line structure

% solv_coll [-g] [-k] [-1] [-t] [-v] prob

The command options, inherited from the libopt run command that launches *solv_coll*, have been described in section 3.2.2. It is the libopt run command that determines the problem *prob* to solve.

As discussed in section 3.2.1, the *solv_coll* script is in charge of the operations, at the operating system level, for running the solver *solv* on the problem *prob* of the collection *coll*. Let us describe the tasks that the script has to perform.

1. It must build in the working directory the executable program, say *solv_coll_* main (a binary code that will solve the problem *prob* using the solver *solv*), and must construct into the working directory, from information stored somewhere in the directory \$LIBOPT_DIR/collections/coll, the data files that are useful for running *solv_coll_*main.

These operations strongly depend on the installation of the collection coll. We consider two cases.

• For the Modulopt collection (see [Gilbert 2007]), a problem name *prob* may have the form

pnam[.pdat],

where *pnam* is the *radical* of the problem name, referencing to a directory name, and *pdat* is an optional string, referencing to a data set. For this collection, the operations mentioned above are encoded first in the Perl script

\$LIBOPT_DIR/collections/modulopt/probs/pnam/Makebin,

which takes care of the data selection or construction, and next as appropriate targets in the makefiles

\$LIBOPT_DIR/collections/modulopt/probs/pnam/Makefile \$LIBOPT_DIR/solvers/solv/modulopt/Makefile.

The target *pnam* in the first makefile builds an archive with the procedures describing the problem and the target *solv_modulopt_main* in the second one takes care of the solver dependent procedures and of the main program.

- For the CUTEr collection, this first task could have been skipped, since the CUTEr command sdsolv (or something similar) takes it in charge. However, for allowing to store the problems in a compressed format, a symbolic link to the file prob.SIF[.gz] is created in the working directory and decompressed there if necessary.
- 2. It must run the executable program *solv_coll_main* (or the script *sdsolv* for the CUTEr collection) in the working directory.
- 3. It must remove from the working directory the now useless executable program *solv_coll_main* (not necessary for the CUTEr collection), the data files, and the output files that have been generated during the execution of the program. This task also depends on the collection *coll* and the solver *solv*. For the CUTEr collection, part of the task is taken in charge by the command *sdsolv* itself.

Writing a *solv_coll* script is not an easy task. Luckily, this one can often be adapted from a similar script existing in the Libopt hierarchy. For example, all the *solv_modulopt* scripts only differ by a few character strings, at such a point that it can actually be generated by the command activating the cell (*solv*, modulopt), namely

% libopt addcell -s *solv* -c modulopt

using the template

\$LIBOPT_DIR/collections/modulopt/templates/SOLV_modulopt

and the generating script

\$LIBOPT_DIR/collections/modulopt/bin/libopt_addcell_modulopt.

This quasi-independence of the *solv_coll* scripts from the solver *solv* looks like a general rule. It is therefore the charge of the designer of the collection *coll* to provide a SOLV_coll template and a generating script libopt_addcell_coll. If these are not found in the appropriate directories, the *solv_coll* script is not generated by the addcell subcommand and must be written by hand.

3.2.4 The main programs. This is the main program that would have to be written if one had to run the solver solv on a particular problem prob of the collection coll. The required genericity of this main program (it has to be able to consider any problem prob of the collection) can be obtained in the following way. All the problems of the collection are described by procedures with a name that depends on its function but is identical for all the problems. Typically, one finds

- *initialization procedures*, which specify the dimensions of the problem, possibly its name, initialize the variables, read the data, etc,
- a *simulator*, which gives the state of the system to solve at a given iterate when the problem is nonlinear and the solver has an iterative nature,
- *auxiliary procedures*, which precise the way some objects are computed (for example, the procedure that performs the inner product used for computing a gradient),
- and possibly *post-solution procedures*, which can do some post-solution computations.

The connection between the main program and the problem is then made by the linker, to which the object files associated with the main program and the procedures describing the selected problem are given by the *solv_coll* script described in section 3.2.3.

It is normally the main program that prints the *Libopt line* on the standard output. It can do this after the problem has been solved by collecting the various features of the problem and the various counters that depict the behavior of the solver *solv* on the problem *prob*.

4. DISCUSSION AND PERSPECTIVE

In this short paper, we have presented the Libopt environment and have decorticated one of its main commands. The software has been designed to make more pleasant the tedious, but essential, task of solver developers that consists in routinely running solvers on problems and comparing their results using performance profiles. Now, adding solvers and collections to the environment and activating (solver, collection) pairs are still delicate operations, despite our effort to automate them. Even though these do not occur often, we expect to make them more user-

friendly in the future, when we will have acquired more experience with a larger variety of solvers and collections.

The Libopt software would certainly deserve other improvements: we think, for instance, to the introduction of modularity in the Perl scripts, to the notion of platform (see the companion manual), to the efficiency of the *solv_coll* script generation from templates (see section 3.2.3), to the normalization of the tokens in the Libopt line for a specific scientific computing domain (see section 2.3), to the development of a Web interface with the environment (either for using it [Mittelmann and Pruessner 2003] or for downloading part of it), to the implementation of other measures of performance [Mittelmann and Pruessner 2003; Moré and Wild 2008], to the uniformization of the solver stopping criteria (see [Dolan et al. 2006] and the Examiner tool in [GAMS 2003]), and to the many other subjects that today are out of our imagination. Another breach of the current version of Libopt is that it does not provide tools, or even concepts, for avoiding to consider as different a problem that would be present in more than one collection (for example the Hock and Schittkowski problems [Hock and Schittkowski 1981] are present in the CUTEr and Schittkowski [Schittkowski 2002] collections). Clearly, such a duplication biases the performance profiles. In the same vein, it would be interesting to be able to qualify what is a good selection of problems, since taking in such a selection many problems with similar features would also degrade the relevance of performance profiles based on it.

Only very few collections and solvers are incorporated in the standard distribution of the current version of the software. Installing new collections (like [COPS], to mention another parameterizable collection in nonlinear optimization) and solvers (they are numerous) in a consistent way, maintaining the compatibility with the possible evolution of Libopt, may require some expertise and obstinacy. Note, indeed, that a change in the Libopt software may affect all the cells of the {solvers} × {collections} Cartesian product. We intent to provide these new installations in the future versions of Libopt, at least in the nonlinear optimization domain, taking advantage of the possible contributions of generous users.

ACKNOWLEDGMENTS

We thank Jorge Nocedal for having offered the second author hospitality at Northwestern University (Evanston, USA) when this work was initiated and François Clément for his careful reading of the manuscript. Many thanks also to two referees, whose remarks lead us to propose a largely rethought version of the environment.

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Received March 2007; revised November 2007; accepted ----