Resurrecting GSLIB by code optimization and multi-core programming

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Outline

Motivation

Methodology

Step 1: Re-design

Step 2: Profiling and code optimization

Step 3: Multi-core execution

Conclusions and Future work



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• GSLIB: open-source software package (applications + utilities) used in the geostatistical community for more than 30 years.



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 Significant efforts have been developed to accelerate/enhance the scope of the original package (SGEMS, WinGSLIB), but according to the authors' knowledge, few efforts have been reported in order to accelerate the GSLIB package by itself.

How can we accelerate an application by itself?
 Optimizing its code and using multiple threads (cores) of execution



 Code optimization: set of techniques and code modifications (machine-independent and machine-dependent) that can help us to accelerate an application using a general-purpose CPU.



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GSLIB + Code optimization

faster GSLIB!



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GSLIB + Code optimization + Multi-core programming

even faster GSLIB!!!



Objective

Develop a new open-source version of GSLIB, that uses optimized code and multiple threads (cores) of execution.



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Let's see these steps using gamv as example...



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Step 1: Re-design

• Inline important subroutines (readparm and gamv in this case):

```
subrountine foo(a)
                               csubrountine foo(a)
   integer a
                                   integer a
   a=a+2
end subroutine foo
                               cend subroutine foo
program main
                               program main
   integer a,b
                                  integer a,b
   a=1
   call foo(a)
                                   call foo(a)
   b=a
                                  b=a+2
end program main
                               end program main
```



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- Move global variables from module geostat and common blocks (include file.inc) to main program.
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- Avoid side-effects in each subroutine, passing all necessary data as explicit subroutine parameters.

Maybe the re-designed code doesn't look pretty, but the *data-flow* path of each variable can be easily identified (important for multi-core programming).



Example: gamv

Original code:	Re-designed code:
<pre>module geostat real, allocatable:: x(:),y(:),z(:) end module geostat program main use geostat call readparm call gamv call writeout stop end end program main</pre>	<pre>program main c move module vars into main real, allocatable:: x(:),y(:),z(:) c inlined code of readparm c inlined code of gamv c writeout is not inlined call writeout stop end end program main</pre>



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• Compile the code using the *debug* flag (-g).



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- Select a Fortran profiler tool (well-known tools for Linux: gprof and oprofile).
- Identify bottle-necks looking at the performance profiles obtained (sampling in hardware events).
- Optimize the code removing or minimizing those bottle-necks.



Example: oprofile output over gamv

```
#events %total : line of code
                          if(hs.gt.dismxs) go to 4
 1663 14.7954 :
                          if(hs.lt.0.0) hs = 0.0
    1 0.0089:
                          h = sart(hs)
              :c Determine which lag this is and skip if outside the defined
               :c distance tolerance:
                           if(h.le.EPSLON) then
                                 lagbeg = 1
    1 0 0089 •
                                 lagend = 1
                           else
                                 lagbeg = -1
                                 lagend = -1
 2510 22 3310 .
                                 do ilag=2.nlag+2
 3813 33.9235 :
                                       if (h.ge. (xlag*real(ilag-2)-xltol).and.
                                           h.le.(xlag*real(ilag-2)+xltol)) then
  254 2 2598 •
                                              if(lagbeg.lt.0) lagbeg = ilag
    4 0.0356:
                                              lagend = ilag
                                       end if
                                 end do
    1 0.0089:
                                 if(lagend.lt.0) go to 4
                           endif
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              :c distance tolerance:
                         if (h.le.EPSLON) then Too many "if"
    1 0 0089 •
                               lagend = 1
                                                instructions
                          else
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Example: oprofile output over gamv optimized

```
#events %total : line of code
                          if(hs.at.dismxs) go to 4
 1452 17.8356 :
                          if(hs.lt.0.0) hs = 0.0
    2 0.0246:
                          h = sart(hs)
               :c Determine which lag this is and skip if outside the defined
               :c distance tolerance:
                           if(h.le.EPSLON) then
                                 lagbeg = 1
                                 lagend = 1
                           else
                                 lagbeg = -1
                                 lagend = -1
                                 liminf=(ceiling((h-xltol)*xlaginv)+2)
                                 limsup=(floor((h+xltol)*xlaginv)+2)
  270 3.3165 :
 1022 12.5537 :
                                 do ilag=liminf,limsup
  700 8 5985 -
                                              if(lagbeg.lt.0) lagbeg = ilag
  350 4.2992 :
                                              lagend = ilag
                                  end do
  350 4.2992 :
                                 if(lagend.lt.0) go to 4
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                                lagbeg = 1 Acceleration
                          else
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                                lagend = -1
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                                end do
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  350 4.2992 :
                          endif
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Example: oprofile output over gamv

```
#events %total : line of code
              ·c MAIN LOOP OVER ALL PAIRS.
                    irepo = max(1, min((nd/10), 1000))
                   do 3 i=1.nd
                      if((int(i/irepo)*irepo).eq.i) write(*,103) i,nd
  488 2.7767 :
                 do 4 j=i,nd
              :c Definition of the lag corresponding to the current pair:
 1500 8.5349 :
                          dx = x(i) - x(i)
  901 5 1266 .
                          dy = y(j) - y(i)
 1666 9.4794 :
                        dz = z(i) - z(i)
   88 0.5007:
                        dxs = dx*dx
  811 4.6145 :
                       dys = dy*dy
 1964 11.1750 :
                        dzs = dz*dz
 5610 31.9203 :
                       hs = dxs + dys + dzs
 3837 21.8321 :
                     if(hs.gt.dismxs) go to 4
    8 0.0455:
                     if(hs.lt.0.0) hs = 0.0
    2 0.0114:
                         h = sart(hs)
```



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                  do 4 j=i,nd
             :c Definition of the lag corresponding to the current pair:
                                               Too many
                         dx = x(i) - x(i)
 1500 8 5349 ·
  901
                         dv = v(i) - v(i)
     9.4794 :
                         dz = z(i) - z(i)
 1666
                                                 memory
   88 0.5007:
                         dxs = dx*dx
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                          xi=x(i)
                         yi=y(i)
                         zi=z(i)
  291 1.3619 : do 4 j=i,nd
              c Definition of the lag corresponding to the current pair:
                         dx = x(i) - xi
  802 3 7535 -
 1040 4 8673 -
                         dv = v(i) - vi
 1368 6.4024 :
                        dz = z(j) - zi
  785 3.6739 :
                        dxs = dx*dx
  595 2.7847 :
                       dvs = dv*dv
  148 0.6927 :
                       dzs = dz*dz
                      hs = dxs + dys + dzs
 5881 27.5238 :
 3574 16 7267 .
                    if(hs.gt.dismxs) go to 4
    6 0.0281:
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                         h = sart(hs)
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- Compile the code using the openmp flag (-fopenmp for GCC or -openmp for Intel compilers).
- Identify the most time consuming parts of the code, looking the previous performance profiles obtained.
- Add OpenMP directives in order to parallelize those parts using multiple threads of execution (ideally, 1 thread must run in 1 CPU core).



Example: +100% faster gamv

```
C MAIN LOOP OVER ALL PAIRS:
      irepo = max(1,min((nd/10),1000))
      do 3 i=1, nd
        if((int(i/irepo)*irepo).eq.i) write(*,103) i,nd
            xi = x(i)
            vi=v(i)
            zi=z(i)
      do 4 i=i.nd
c Definition of the lag corresponding to the current pair:
            dx = x(j) - xi
            dy = y(j) - yi
            dz = z(j) - zi
            dxs = dx*dx
            dvs = dv*dv
            dzs = dz*dz
. . .
```



Example: +100% faster gamv

```
MAIN LOOP OVER ALL PAIRS:
   irepo = max(1,min((nd/10),1000))
   do 3 i=1, nd
     if((int(\vec{1}\)irepo)*irepo).eq.i) write(*.103) i.nd
         xi=x(i
         vi=v(i)
         zi=z(i)
                Na Corresponding to the current pair:
Definition of the
            = x(j)
                            nd*(nd+1) pairs of points
            = z(i) - zi
         dxs = dx*dx
         dvs = dv*dv
                                                to process
         dzs = dz*dz
```



```
C MAIN LOOP OVER ALL PAIRS:
      irepo = max(1,min((nd/10),1000))
c$omp parallel default(firstprivate) shared(x,v,z,reducedVariables)
#ifdef OPENMP
      threadId = int(OMP get thread num())+1
#endif
c$omp do schedule(runtime)
      do 3 i=1, nd
        if((int(i/irepo)*irepo).eq.i) write(*,103) i.nd
            xi = x(i)
            vi=v(i)
            zi=z(i)
      do 4 j=i.nd
c Definition of the lag corresponding to the current pair:
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            dy = y(j) - yi
            dz = z(i) - zi
            dxs = dx*dx
            dvs = dv*dv
            dzs = dz*dz
c$ omp end do
c$ omp end parallel
```

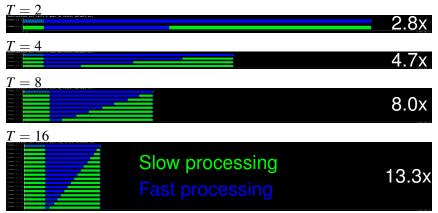


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c$omp do schedule(runtime)
     do 3 i=1, nd
      if((int(Xirepo)*irepo).eq.i) write(*,103) i,nd
          xi = x(i)
         vi=v(i)
          zi=z(i)
     do 4 j=i.nd
c Definition of the lag orresponding to the current pair:
                           Outer-loop is divided
          dx = x(i) - xi
          dv = v(i) - vi
                           among T threads using
          dz = z(j) - zi
          dxs = dx*dx
          dvs = dv*dv
                           a load-balance policy
         dzs = dz*dz
c$ omp end do
                           defined at runtime
c$ omp end parallel
```



Runtime policy: "static" (default)

Each thread process nd/T contiguous iterations

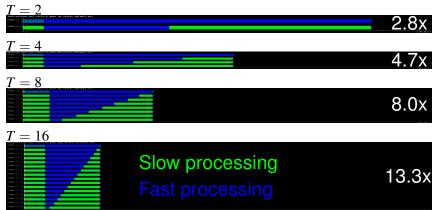


Can we run faster?



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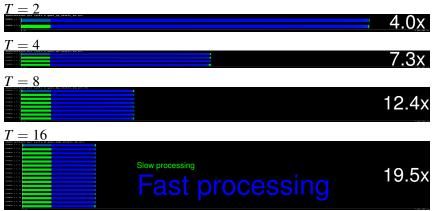


Can we run faster?



Runtime policy: "static, 16"

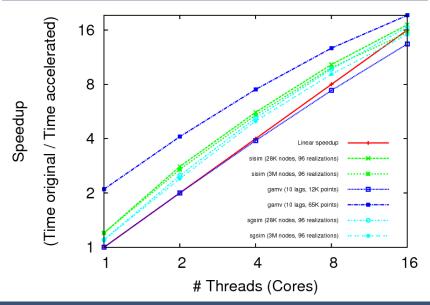
Each thread process 16 contiguous iterations (interleaved)



Yesl



Other results: gamv, sisim and sgsim





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Conclusions

- The proposed methodology accelerates the runtime execution of GSLIB applications, without changing the classical usability (parameter files).
- Many code optimization techniques can be applied to the target code, in a combined way.
- Different speedup results can be obtained using different load-balancing policies, so we must choose the best for our problem.
- Current developments: gamv, sisim and sgsim
 - Linux: openSUSE 12.2, GNU Fortran compiler 4.7 (gfortran)
 - Windows: Windows 7, Visual Studio 2013, Intel Parallel Studio XE 2013 (ifort.exe)



Future work

- Apply this methodology to the most important GSLIB applications and utilities.
- Other GSLIB-based applications can also be benefited from this effort (following a similar acceleration methodology).
- If more processing power is needed, we can use hardware acceleration devices or distributed computing:
 - Early experiments using Intel Xeon Phi (MICs) co-processors (60 cores of execution).
 - Nvidia CUDA-based GSLIB which can use GPUs as back-end compute engines.
 - For really large computations, we are planning to implement an MPI-based GSLIB which can run in a cluster of distributed general-purpose computers.



Thanks for your attention!

Check for new updates and the latest release in:

```
http://gslib.alges.cl
```

Contact: operedo [at] alges.cl