An Introduction to Computational Lattice QCD

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Contents

- Introductory Lecture
- A lecture on Solvers (we'll write a solver)
- A lecture on 'optimization'
- A lecture on Hybrid Monte Carlo (we'll write an HMC)
- A lecture on data analysis
- There will also be exercises





Lattice QCD

- Lattice QCD is the only known model independent, nonperturbative technique for carrying out QCD calculations.
 - Move to Euclidean Space, Replace space-time with lattice
 - Move from Lie Algebra su(3) to group SU(3) for gluons
 - Gluons live on links (Wilson Lines) as SU(3) matrices
 - Quarks live on sites as 3-vectors.
 - Produce Lattice Versions of the Action







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Large Scale LQCD Simulations Today







- Stage 1: Generate Configurations
 - snapshots of QCD vacuum
 - configurations generated in sequence
 - capability computing needed for large lattices and light quarks
- Stage 2a: Compute quark propagators
 - task parallelizable (per configuration)
 - capacity workload (but can also use capability h/w)
- Stage 2b: Contract propagators into Correlation Functions
 - determines the physics you'll see
 - complicated multi-index tensor contractions



- Stage 3: Extract Physics – on workstations,
 - small cluster partitions



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Monte Carlo Method

Evaluating the Path Integral:

- There are 4V links. $V \sim 32^3 x 256 \rightarrow 4V = \sim 33M$ links
- Direct evaluation unfeasible. Turn to Monte Carlo methods

$$\langle \mathcal{O} \rangle = \frac{1}{\mathcal{Z}} \int \prod_{\text{all links}} dU_i \ \mathcal{O} \ e^{-S(U)} \longrightarrow \bar{O} = \frac{1}{Z} \sum_{\text{configuration}} \mathcal{O}(U) \ P(U)$$

- Basic Monte Carlo Recipe
 - Generate some configurations U
 - Evaluate Observable on each one
 - Form the estimator.

Problem with uniform random sampling: most configurations have $P(U) \sim 0$





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Importance Sampling

- Pick U, with probability P(U) if possible
- Integral reduces to straight average, errors decrease with statistics

$$\langle \mathcal{O} \rangle = \frac{1}{\mathcal{Z}} \int \prod_{\text{all links}} dU_i \ \mathcal{O} \ e^{-S(U)} \longrightarrow \bar{O} = \frac{1}{N} \sum_{N} \mathcal{O}(U) \qquad \sigma(\bar{\mathcal{O}}) \propto \frac{1}{\sqrt{N}}$$

Metropolis Method:

Start from some initial configuration. Repeat until set of configs. is large enough:

- From config U, pick U' (reversibly)
- Accept with Metropolis probability:

$$P(U' \leftarrow U) = \min\left(1, \frac{e^{-S(U')}}{e^{-S(U)}}\right)$$

• If we reject, next config is U (again)



Generates a Markov Chain of configurations. Errors in observables fall as the number of samples grows





Global Updating

- Imagine changing 'link by link'
- For each change one needs to evaluate the fermion action twice: before and after

$$S_f = \phi^{\dagger} \left(M^{\dagger} M \right)^{-1} \phi = \langle \phi | X \rangle$$

where

$$(M^{\dagger}M) X = \phi$$

Two Degenerate Flavors of fermion (eg: u & d). Guaranteed • Hermitean

Use Sparse Krylov Subspace Solver: eg: Conjugate Gradients Linear system needs to be solved on entire lattice.

- Dimension: ~ O(10M)
- Condition number: O(1-10M)
- 1 Sweep: 2x4V solves, with $4V \sim O(1M-33M)$ is prohibitive
- Need a Global Update Method

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Positive Definite

Hybrid Monte Carlo

• Big Trick: Go from config U to U' doing Hamiltonian Molecular Dynamics in Fictitious Time

surface of constant H

(U, p)

- start from config U
- generate momenta p
- evaluate H(U,p)
- perform MD in fictitious time t
- evaluate H(U', p')
- accept with Metropolis probability

 $P = \min\left(1, e^{-H(U', p') + H(U, p)}\right)$

• if accepted new config is U', otherwise it is U

MD Conserves Energy If done exactly P = 1 (always accept) Otherwise dH depends on the error from the integrator



 (U, p_{0})



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(U'**, p'**)

Selecting new

momenta boosts to

new energy surface, so all phase space can be

After the Gauge Generation



- Measure on each configuration, but only the 'average' is 'physical.
- Baryons also need color antisymmetrization
- Fourier transform fixes definite momenta, but loses volumetric info
 - Not much in the way of pretty visualizations mostly 2D plots



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Lattice QCD and Parallel Computing

- We have two basic patterns in LQCD computations:
 - do the same thing at every site
 - either independently or
 - depending on other nearby sites



$$P_{\mu\nu}(x) = U_{\mu}(x) \ U_{\nu}(x+\mu)U_{\mu}^{\dagger}(x+\nu)U_{\nu}^{\dagger}(x)$$

- perform a *global reduction* (sum, inner product)

$$\sum_{x} \sum_{\mu \neq \nu} \operatorname{Re} \operatorname{Tr} P_{\mu\nu} \qquad \langle \psi | \chi \rangle = \sum_{x} \psi^{\dagger}(x) \chi(x)$$

• This is a classic 'data parallel' pattern

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Expressing Data Parallelism: 1

- Data Parallel Expressions (QDP++, CM-Fortran, etc)
 - Work on lattice wide objects : Global View
 - Hide indices where possible
 - Nearest neighbour => shift whole lattice
 - Reductions: functions like sum(), norm2() etc



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Expressing Data Parallelism: 2

• 'Map-Reduce' like: CUDA/Thurst/TBB

- define "kernel" to execute per site: Local View (+reductions)

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class PlaqKernel :public Kernel2Arg<const GaugeField&,LatticeColorMatrix&> {
 public:

```
PlaqKernel(GaugeField& u,LatticeColorMatrix& p_):u(u_),plaq(p_) {}
```

```
void operator(int site) {
    plaq[site] = 0;
    for(int mu=0; mu < Nd; mu++) {
        for(int nu=mu+1; nu < Nd; nu++) {
            Matrix m1= u[mu][site];
            Matrix m2= getPlus(u[nu],mu,site);
            Matrix m3= getPlus(u[mu],nu,site);
            Matrix m4= u[nu][site];
            plaq[site] += m1*m2*adj(m3)*adj(m4);
        }
      }
    }
    private:
      const GaugeField& u; LatticeColorMatrix& plaq;
};</pre>
```



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Expressing Data Parallelism: 2

```
// Use
GaugeField u=...; // Get U somewhow
LatticeColorMatrix plag;
// Call the kernel
map 2arg<PlagKernel,GaugeField, LatticeColorMatrix>(u,plag);
// Underneath in the framework:
template<class K, class T1, class T2>
                                                        Generic 2 arg
map 2arg(T1& in1, T2& in2)
{
                                                        map function
   K foo(in1, in2); // create kernel
   // Implement this in OpenMP/TBB/CUDA etc
   parallel forall(sites) {
       // Call the kernel once for each
       // site. Uses the operator()
       foo(site);
```





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}

Trade-offs

- Trade offs come in terms of where you want to focus:
 - expressions express maths better
 - at the expense of expressing data re-use
 - 'Kernels' can express data re-use/locality better
 - at the risk of losing the expressiveness of the maths
- Mapping to underlying hardware
 - CUDA and OpenCL organized around 'Kernel' approach
 - Compile kernels to execute on the 'device'.
 - Provide Compiler/Language/Driver support for this.
 - See Mike Clark's lectures on GPUs for more.
- Can mix and match
 - Can implement expressions, as kernels



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What are QDP++ and Chroma

- QDP++ and Chroma are software packages for numerical simulations of Lattice QCD (mostly)
- QDP++
 - provides data parallel expressions for QCD
 - 'embedded domain specific language',
 - 'virtual data parallel machine'
 - plus I/O
 - configure time: Nd, Nc, Ns (dimensions, colors, spins)
- Chroma
 - provides the application on top of QDP++
 - propagators, HMC, measurements
 - also link to external libraries for dslash-es/solvers etc.



Place in USQCD Software Stack







QDP Templated Types

• QDP++ captures the tensor index structure of lattice QCD types

	Lattice	Spin	Colour	Reality	BaseType
Real	Scalar	Scalar	Scalar	Real	REAL
LatticeColorMatrix	Lattice	Scalar	Matrix(Nc,Nc)	Complex	REAL
LatticePropagator	Lattice	Matrix(Ns,Ns)	Matrix(Nc,Nc)	Complex	REAL
LatticeFermionF	Lattice	Vector(Ns)	Vector(Nc)	Complex	REAL32
DComplex	Scalar	Scalar	Scalar	Complex	REAL64

• To do this we use C++ templated types

```
typedefOScalar < PScalar</th>PScalar <</th>RScalar <REAL>>>>Real;typedefOLatticePScalar<</td>PColorMatrix<</td>RComplex<REAL>, Nc>>>LatticeColorMatrix;typedefOLatticePSpinMatrixPColorMatrix<</td>RComplex<REAL>, Nc>, Ns>>LatticePropagator;
```

• Heavy lifting: Portable Expression Template Engine(PETE)



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Using QDP++ and Chroma

- Our experience:
 - a large number of users use the 'chroma'/'hmc' executables with a XML input files
 - relatively few users write QDP++/Chroma programs or interface with QDP++/Chroma
 - a small subset of users check code back in or send us patches
- These lectures will focus mostly on QDP++
 - Chroma is very large and the 'trees obscure the woods'
 - I provide a software package which includes Chroma too.
 - You should be able to build using the build scripts (possibly modified to suit your system)





Code package

- package-int.tar.gz contains:
 - sources for QDP++, Chroma, QUDA and support libraries
 - build directories for
 - scalar -- for use on your laptops
 - parscalar -- a build with MPI
 - quda a parscalar build combined with QUDA for GPUs
 - jit a parscalar build over the JIT version of QDP++ for GPUs as well as QUDA
 - Builds from scalar -> jit require increasing amount of intrepidity
 - QUDA version is older, but reasonably stable
 - JIT branch of QDP++ is current
 - As with all free and developing software: 'Caveat Emptor!'





Untarring the package

- Download package-int.tar.gz
- After unzipping:

```
package/
- scalar/
- parscalar/
- quda/
- jit/
- src/--- qmp, qdp++,chroma,quda,chroma-jit, qdp-jit
libxml2
```

package sources





Structure of build directories

- Build directories have scripts to build and install packages
 - filenames may change but the scheme is as below
 - env.sh sets the environment. Tailor this to your system

```
package/scalar/
```

└── build/	_qmp, build_qdp++, build directories (created				
— install/ packages get installed here					
Wipe out build/installation directories — purge_install.sh					
— — purge build.sh					
<pre> build_qdp++.sh</pre>	Configure and build an individual package				
<pre> build_all.sh</pre>	Purge and build everything				
env.sh	Set up PATHs, modules, compilers, etc				





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Setting up the environment

- env.sh (or env-jit.sh) sets up build environment
 - sets up paths, compiler flags, copiler commands, parallel make etc
 - e.g. on my Mac, the user servicable parts of scalar/env.sh look



Performing the builds

- Usually a script that looks like build_all-xxx.sh invokes the build steps.
- E.g. for scalar build. Builds QDP++ only for the exercises
- commands to build chroma + DP versions commented out

```
#!/bin/bash
                                                   Invokes:
                                                   configure/make/make
#BUILD ODP++ AND CHROMA IN PARALLEL WITHOUT QUDA
./purge build.sh
                                                   install chain for package
./purge install.sh
./build libxml2.sh
# BUILD Single Prec QDP++
                         ./build gdp++-scalar.sh
# IF you feel brave you can build chroma too
#./build chroma-scalar.sh
#
#./build qdp++-double-scalar.sh
#./build chroma-double-scalar.sh
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```

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Running Chroma

- Main applications
 - chroma for measurements
 - hmc for gauge generation
- Typical command line (after the MPI options)
 - ./chroma -i in.xml -o out.xml -geom Px Py Pz Pt
 - in.xml Input Parameter File
 - out.xml Output XML file
 - Px Py Pz Pt are the dimensions of a virtual processor grid: e.g.: -geom 4 4 8 8 implies 4x4x8x8 grid of MPI processes
 - for threaded builds need also OMP_NUM_THREADS/ QMT_NUM_THREADS env variables set
 - env vars/thread binding etc are system specific





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XML input files

<?xml version="1.0" encoding="UTF-8"?> <chroma> <annotation>Your annotation here</annotation> <Param> <InlineMeasurements> <elem> <Name>MAKE SOURCE</Name> <Frequency>1</Frequency> <Param/> <NamedObject> <gauge id>default gauge field</gauge id> <source id>sh source 0</source id> </NamedObject> </elem> <elem> <Name>PROPAGATOR</Name> <Frequency>1</Frequency> <Param/> <NamedObject> <gauge id>default gauge field<gauge id> <source id>sh source 0</source id> <prop id>sh prop 0</prop id> </NamedObject> <xml file>./prop out.xml<xml file> </elem> </InlineMeasurements> <nrow>4 4 4 8</nrow> </Param> <RNG/> <Cfq> <cfg type>SCIDAC</cfg type> <cfg file>foo.lime</cfg file> </Cfa> </chroma>



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Array of Measurements (Tasks)

XML Input Files



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XML Input Files

```
<?xml version="1.0" encoding="UTF-8"?>
<chroma>
<annotation>Your annotation here</annotation>
<Param>
 <InlineMeasurements>
   <elem>
     <Name>MAKE SOURCE</Name>
     <Frequency>1</Frequency>
     <Param/>
     <NamedObject>
       <gauge id>default gauge field</gauge id>
       <source id>sh source 0</source id>
     </NamedObject>
   </elem>
   <elem>
     <Name>PROPAGATOR</Name>
     <Frequency>1</Frequency>
     <Param/>
     <NamedObject>
       <gauge id>default gauge field<gauge id>
       <source id>sh source 0</source id>
       <prop id>sh prop 0</prop id>
     </NamedObject>
     <xml file>./prop out.xml<xml file>
   </elem>
 </InlineMeasurements>
                                                          Global Lattice Size
 <nrow>4 4 4 8</nrow>
</Param>
<RNG/>
<Cfq>
                                                           Input Configuration to use as
<cfg type>SCIDAC</cfg type>
<cfg file>foo.lime</cfg file>
                                                                  default gauge field
</Cfa>
</chroma>
```



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Where to find XML Examples

- Most up to date place:
 - chroma/tests/
- All the regression tests inputs and outputs live here
- .ini.xml input XML file
- .out.xml or .log.xml expected output / log
- .metric.xml metric file for XMLDIFF tool
- Typically suppose regression test produces foo.xml then we can check
 - xmldiff foo.xml expected.xml expected.metric.xml





Linking Against QDP++/Chroma

- Suppose QDP++ is installed in /foo/qdp++
- Use script qdp++-config in /foo/qdp++/bin
 - CXX=`/foo/qdp++/bin/qdp++-config --cxx`
 - CXXFLAGS=`/foo/qdp++/bin/qdp++-config --cxxflags`
 - LDFLAGS=`/foo/qdp++/bin/qdp++-config --ldflags`
 - LIBS=`/foo/qdp++/bin/qdp++-config --libs`
- Compile your program (prog.cc) with:
 - \$(CXX) \$(CXXFLAGS) prog.cc \$(LDFLAGS) \$(LIBS)
 - NB: Ordering of flags may be important.
- Linking against chroma:
 - Use install path of chroma (instead of QDP++) and
 - Use chroma-config (instead of qdp++-config)





Stopping point

- Covered high level view of numerical LQCD
- Considered parallel programming 'models'
- Gave a brief overview of QDP++ and Chroma
- Discussed getting and building the packages
- Discussed running chroma, linking against chroma
- Exercises follow:
 - NB: The exercises are mostly using QDP++, rather than chroma
 - However, plenty of chroma exercises in existing tutorials for you to try:
 - <u>http://usqcd.jlab.org/usqcd-docs/chroma/</u>





Exercises

- Basic:
 - Compute the plaquette of a random configuration
- Advanced:
 - Compute a Polyakov loop on the configuration
- Topics Touched on:
 - Makefiles
 - Basic QDP++ Boilerplate setup code
 - Shifts
 - Global Sums
 - Simple printing in a pseudo-parallel world





Revision Control (RC)

- RC systems track changes of your code over its lifetime

 Lifecycle:
 - You import an initial code to a REPOSITORY
 - You check out a WORKING COPY of the files
 - You make some changes
 - You commit the changes
 - You can label versions at any point with a human readable label (eg: for releases)
 - You can create branches (eg: for bugfixes)
 - Which version control to use?
 - Currently I prefer Git
 - I cannot cover it in more detail here, but I recommend it to you: <u>http://git-scm.org</u>





Revision Control and software lifecycle





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Why Should I use Revision Control

- A good revision control system provides the most important safety and convenience features
 - IT IS YOUR PANIC BUTTON
 - You can revert changes even if you've lost the original source in your working copy
 - IT ALLOWS YOU TO DEVELOP ANYWHERE
 - Most good Revision Control Systems allow you to check out over the network and anonymously too.
 - You can Branch off an existing revision to do maintenance (bug fixes etc). The RC system will help you merge changes back onto the main trunk
 - Many RC-s have web features: <u>http://git.jlab.org</u>





Get the Code

- Download the code tarball
- Actually this is a fully fledged GIT repository
- The tarball should uncompress into a directory called **seattle_tut**
- **seattle_tut** has 4 subdirectories
 - -example1
 - -example2
 - -example3
 - -example4
- We will work in example1 in this session.





Edit the Makefile

- Go to the example directory you've just checked out
 bash\$ cd seattle_tut/example1
- Edit the Makefile :
 - Replace the path in the CONFIG Makefile variable to reflect where you've installed qdp++
 - probably something like:
 - /.../package/scalar/install/qdp++-scalar/bin/qdp++-config
- Do this also in seattle_tut/example1/lib/Makefile
- You can now build the code by typing 'make'





Run the example

• Run the executable:

bash\$./example1
Finished init of RNG
Finished lattice layout
bash\$

• NB: Cygwin Users should put .exe on the end of executables:

bash\$./example1.exe
Finished init of RNG
Finished lattice layout
bash\$

• Doesn't do much useful yet – just checking it works for now





Makefiles

- Makefile-s tell 'make' what to do
 - Three main parts (for our purposes)
 - MACROS (to make your life easier)
 - Rules (to tell make how to compile)
 - target/dependency pairs (tell make what to compile, and what depends on what else)





example1/Makefile:



example1/lib/Makefile



Now the code: example1/example1.cc



Doing Stuff with QDP++

- Lattice Wide Types: eg a Lattice of SU(3) Color matrices
 - QDP++ Type: LatticeColorMatrix
 - Gauge field: Nd (ie: 4)length array of SU(3) lattices:
 - QDP Type: multi1d<LatticeColorMatrix> u(Nd);
 - Can index as **u[0]**, **u[1]** etc.
 - Filling a LatticeColorMatrix with gaussian noise:
 - QDP++ Function: gaussian(u[i]);
 - Projecting back into SU(3):
 - Function provided in the library in lib/
 - void Example1::reunit(LatticeColorMatrix& u)
 - in namespace Example1
 - need to #include "reunit.h" for definition





Starting Up a Gauge Field

• A Unit Gauge (Free Field):

```
multi1d<LatticeColorMatrix> u( Nd ); // Nd = 4 usually
for(int mu=0; mu < Nd; mu++) {
  u[mu] = Real(1);
}</pre>
```

• A Randomized Gauge Field (Disordered/Hot Start):

```
multi1d<LatticeColorMatrix> u( Nd ); // Nd = 4 usually
for(int mu=0; mu < Nd; mu++) {
  gaussian( u[mu] ); // Fill with gaussian Noise
  Example1::reunit( u[mu] ); // project back to reunitarize
}</pre>
```



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Arithmetic and Shifts

• Can do 'normal' arithmetic: e.g.: Multiplies, adds, etc

• Shifts



Utilities

- Things to know about the 'model computer' and the 'lattice'
 - in namespace QDP::Layout
 - Layout::sitesOnNode() sites local to your Processing element (MPI process)
 - Layout::vol() the global volume (sites)
- Text / IO to the screen:
 - iostream like cout and cerr streams (master node prints)
 - QDPIO::cout
 - QDPIO::cerr
 - C printf like routines (every node prints)
 - QDP_info("fmt", variables);





Computing the Plaquette



Some actual coding

• Add the code for starting up the random gauge field and computing the plaquette after the line

// QDP++ is now ready to rock

in the example1.cc file

- remake example1 (or example1.exe) by typing 'make'
- rerun the example1 (or example1.exe)
 - Output should be something like:

Finished init of RNG Finished lattice layout Plaquette=0.00127763178119898

• Replace the gauge startup code with the one for the free field (unit gauge). Remake and Rerun. Verify that the Plaquette=1.





Exercise 1: Random Gauge Transforms

- Can you write a routine to perform a random gauge transformation on u?
 - Hints:

$$U'_{\mu}(x) \leftarrow G(x)U_{\mu}(x)G^{-1}(x+\hat{\mu})$$

- You'll need a LatticeColorMatrix but not a **multi1d**<> one. (Gauge transform matrices G- live on the sites.)
- You'll need to randomize it and make it SU(3)
- You'll need to shift and use the adj() function to get at

$$G^{-1}(x+\hat{\mu}) = G^{\dagger}(x+\hat{\mu})$$

- Recompute the plaquette of the Random Gauge Transformed 'u' and check it is gauge invariance.
- Compute the Link trace of the Random Gauge transformed 'u' and the original one. Should be different...





Exercise 2: Polyakov Loop

- Can you compute the Polyakov Loop?
 - This observable is an order parameter for the finite temperature phase transition.
 - This observable, modulo some normalization factor is the "sum of the (complex) trace of the product of matrices along the time direction of the lattice"
 - Hints:
 - You'll need to shift in the 't' direction
 - the rest is similar to the plaquette.

$$P = \frac{1}{N_c V} \sum_{x} \operatorname{Tr} \left(\prod_{t} U_t(x) \right)$$



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Next Session: "Dances with Solvers"

- In the next session we'll play with Fermions, Fermion matrices, solvers, propagators and correlation functions.
 - See you then!



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