

### Modern Dataflow in Experimental Nuclear Science (and Tcl).

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This material is based upon work supported by National Science Foundation.

# **Talk Outline**

- A bit about me and my Tcl history
- What is the National Superconducting Cyclotron Laboratory (NSCL)
- How data taking has evolved in experimental nuclear science
- E17011 an experiment with modern electronics why it's computationally demanding
- Parallel resources available to us
- Message Passing Interface (MPI) and Tcl
  - Intro to MPI
  - Existing Tcl support
  - Tcl-Ish support we did.
- Applying MPITcl to an existing application
- What this means for experimental nuclear science at the NSCL



# Tcl and me.

- Introduced Tcl/Tk at the National Superconducting Cyclotron Lab (NSCL) back in the 4.x days.
- Plugged into the community with a talk in New Orleans (Tcl 2004)
  - <u>https://www.tcl.tk/community/tcl2004/Papers/RonFox/</u>
  - NSCLSpecTcl Histogramming package for experimental nuclear science.
- Tcl/Tk conference proceedings editor from Tcl2005 and on if memory serves.
- Tcl plays an important role in the NSCL experimental program.



# The National Superconducting Cyclotron Lab.



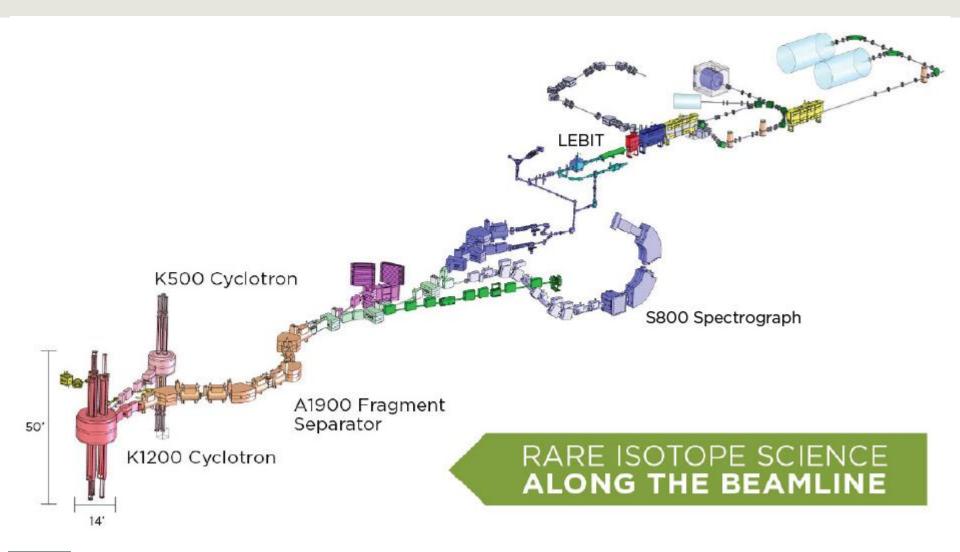
120-**CHART OF THE NUCLEI** NUCLEAR LANDSCAPE Stable nuclei 100 Observed nuclei Terra Incognita PROTON NUMBER 80 60 40 34Ca 35Ca 36C 20 20 40 120 60 80 100 140 160 180 NEUTRON NUMBER

- Located at Michigan State University
- Funded by the National Science Foundation as a user facility

- Explore the properties of nuclear unstable nucleii
- Why and how do certain isotopes form.
- Where do the heavy elements come from?
- http://www.nscl.msu.edu



## **NSCL Block Diagram**





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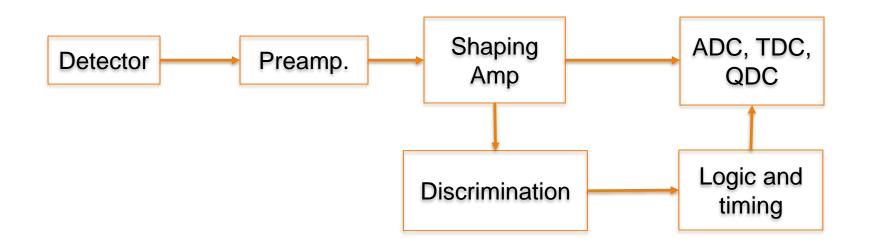
# **Science drivers for Rare Isotope Research**

Science drivers (thrusts) from NRC RISAC 2007								
Nuclear Structure	Nuclear Astrophysics	Tests of Fundamental Symmetries	Applications of Isotopes					
Intellectual challenges from NRC Decadal Study 2013								
How does subatomic matter organize itself and what phenomena emerge?	How did visible matter come into being and how does it evolve?	Are fundamental interac- tions that are basic to the structure of matter fully understood?	How can the knowledge and technological progress provided by nuclear physics best be used to benefit society?					
Overarching questions from NSAC Long Range Plan 2015								
How are nuclei made and organized?	Where do nuclei and elements come from?	Are neutrinos their own antiparticles?	What are practical and scientific uses of nuclei?					
What is the nature of dense nuclear matter?	What combinations of neutrons and protons can form a bound atomic nucleus? How do neutrinos affect element synthesis?	Why is there more matter than antimatter in the present universe?						

Overarching questions are answered by rare isotope research



# Data Acquisition – old school (analog)



Important point – dead-times for a conversion are microseconds



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# Data Acquisition – old school (analog)



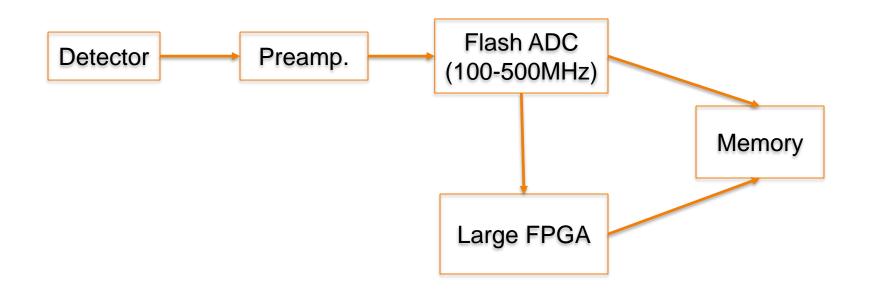
- Detector signals
- Pre-amplification
- Shaping/amplification
- Timing/triggering
- Digitizing modules

Each digitizing module Gives one value per input:

- Pulse height
- Pulse charge integration
- Pulse timing relative to some reference time.



# Modern Data Acquisition (digital)





# Modern data acquisition (100MHz – 500MHz)



- Detector Signals
- Preamplification
- Digitization
- Firmware can extract
  - Pulse ht.
  - Charge integral
  - Timing

•

- Keeping waveforms allows experiments that can't be done with analog electronics.
- Wave form analysis is computationally demanding Wave forms bloat the data

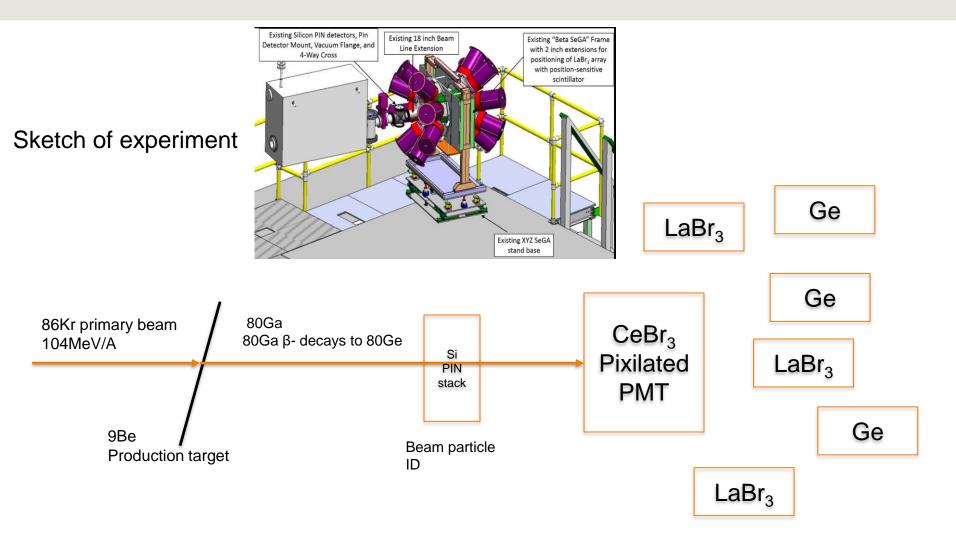


# E17011

- Scheduled to run in January.
  - Look at beta decay of 80Ga -> 80Ge
  - Look at the lifetime of the  $0_2^+ \rightarrow 0_1^+$
  - Lifetime tell us something about the difference in the radius of the charge distribution of the two states.
- 200MB/second sustained though modest trigger rate (~3KHz).
- Will take 100TB+ of data
- Need good online and nearline analysis:
  - Are the detectors working.
  - Are we seeing what we think we should be seeing.
  - Should we ask for additional (discretionary time).

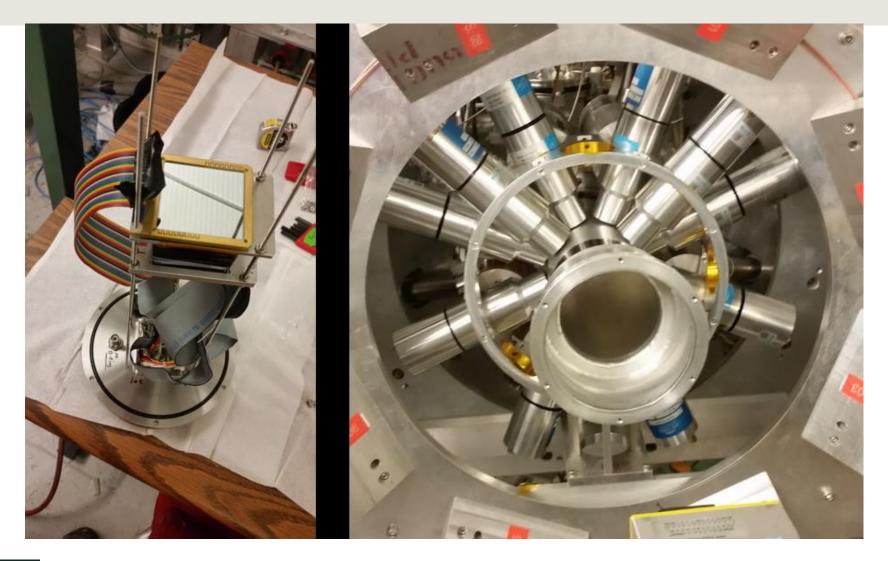


# E17011 – block diagram





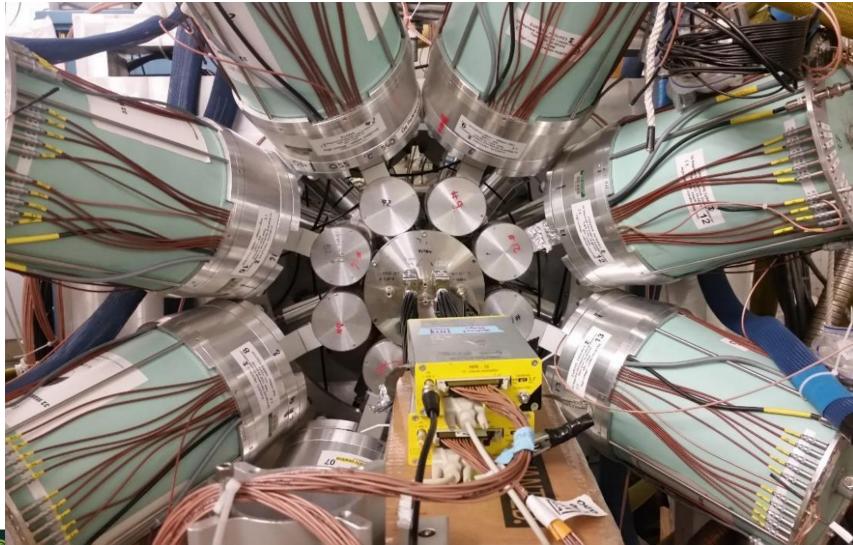
# **Pictures pictures (CeBr<sub>3</sub> and LaBr<sub>3</sub> array)**





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### More pictures Ge Array (SeGA)





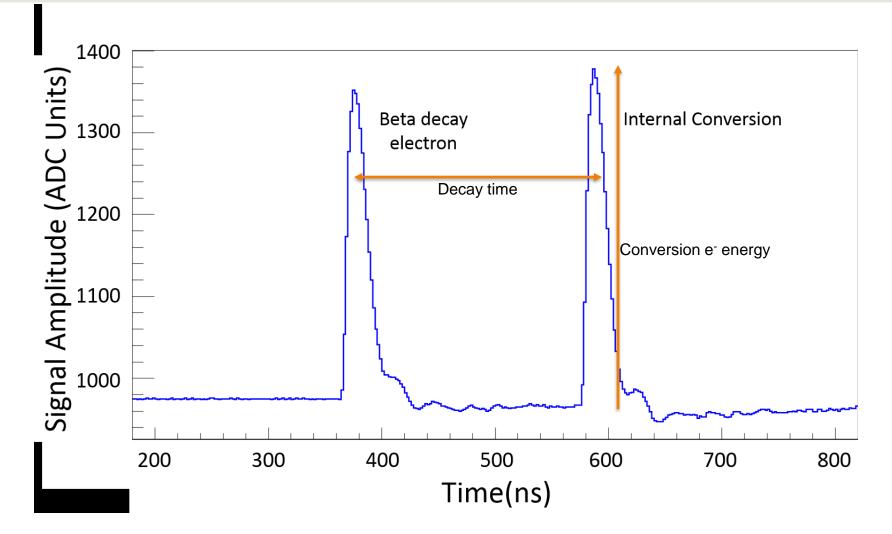
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# What happens to the implanted ions.

- <sup>80</sup>Ga decays to <sup>80</sup>Ge by  $\beta$  decay.
  - $\bullet$  This decay is also detected in the  $\text{CeBr}_3$  detector
  - This decay populates several energy levels of <sup>80</sup>Ge
- Of interest are the decays that populate the  $0_2^+$  state.
  - This eventually de-excites to the  $0_1^+$  state emitting a  $\gamma$ -ray (detected by the LaBr<sub>3</sub> array and/or SeGA) and and a conversion electron.
  - The conversion electron produced by that decay is sensed by the CeBr<sub>3</sub>
- Well it's not actually eventually.
  - Similar de-excitations have half lives of about 50ns.
  - We want the actual 1/2 life.
- This is a short  $\frac{1}{2}$  life. How to measure it.
  - Digitize the pulses in the CeBr<sub>3</sub>
    - » Sum signal at 500MHz
    - » pixels at 250MHz
    - » Trace lengths of a few microseconds (on order 100 samples).



# Sample trace from a similar experiment





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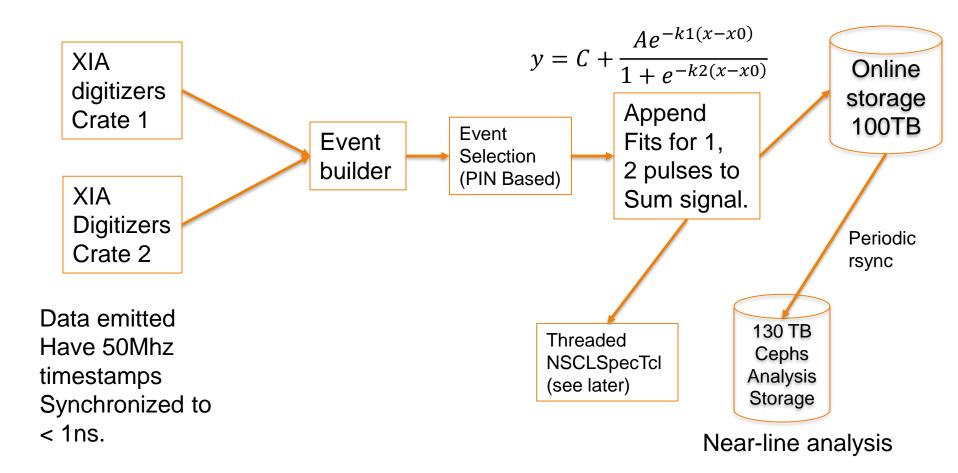
# Where does that 200MB/sec come from?

- Since most of the CeBr3 detector lights up for a hit we about 200traces/event (maximal pixel is 'where' the event occurred).
- The data rate is dominated by traces from the CeBr3.
- Trigger rates may be 3KHz (modest)
- Data transfer rates will be a sustained 200MB/seconds.
- To see if the experiment is "working" we need to do some processing on all this stuff.
  - Determine if traces are single or double pulses.
  - Determine the characteristics of the pulse(s) time and height.
- Good news though: Taking traces meas we can do the experiment.

This experiment is *really hard* to do with old school electronics.



### **Data Flow:**





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# **Online analysis**

- Fit the sum traces from the CeBr3.
  - Fit for both single and double pulses.
  - Use a heuristic to determine if the pulses are single or double.
- Make a pile of histograms (NSCLSpecTcl) and look at them online
- Keep up with the incoming data rate.

NOTE: Each fit costs 3.5ms to do using GSL's Levenberg-Marquardt.

Serial code isn't going to cut it.



# Near-line Analysis – want to keep up with incoming data rate or better

- Fit the remaining traces in the CeBr<sub>3</sub>
  - Are they single or double pulses (heuristic)?
  - If double pulses extract the time difference as a parameter for histogramming.
- Correlate implantation events with decay events.
  - Using position and particle ID information
  - Timing between implantation and decay.
- These are computationally intensive (e.g. the fit is about 3.5ms/event). To make decisions about the experiment we need to analyze the data already taken faster than acquisition.
- Serial code isn't going to cut it ~2500 cores just for fitting all traces.

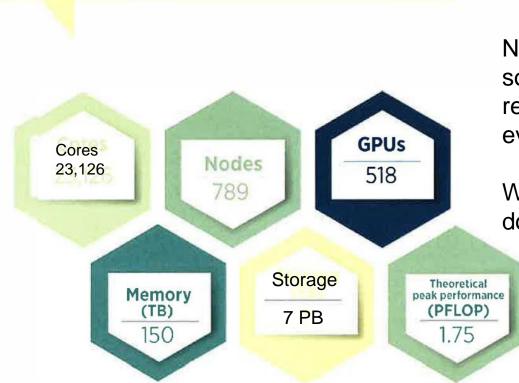


# Parallel resources at the NSCL available to E17011

- Three high core count systems:
  - 1 26 core system. (Xeon E5-2690 v4 @ 2.60GHz)
  - 2 40 core systems (Xeon Gold 6148 @ 2.4GHz) bought for this experiment
  - Used for online data flow and interactive 'near-line' analysis.
- Modest Linux cluster
  - 360 cores of various ages
  - Used for non-interactive 'near-line' partial analysis.
- That's not going to be enough (to do the fitting of all signals at data rates needs about 2500cores).
- no GPU coprocessors ⊗



### MSU Institute for Cyber Enabled Research (ICER)



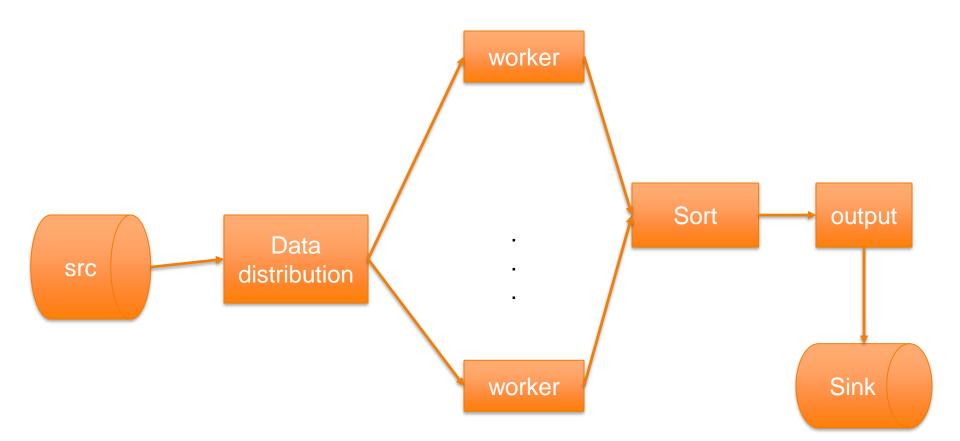
Naturally we've <del>lusted after</del> sought ways to leverage this resource for near-line and maybe even online analysis.

Work to containerize our apps is done (thank you singularity)

Scheduling, however can be an issue: NSCL resources can be dedicated to E17011, ICER is shared across all university users.



# Structure of event analysis parallel programs



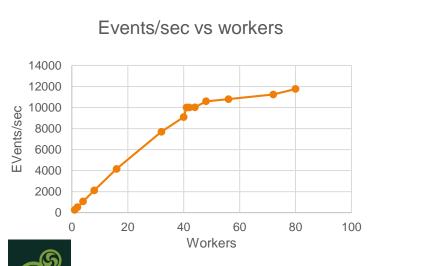


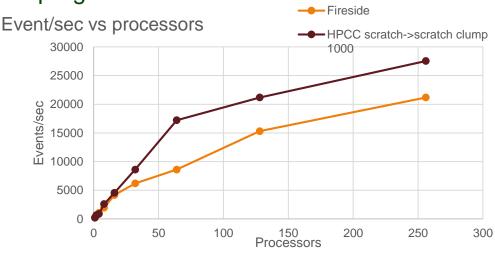
# Meeting these needs.

#### Different types of parallelism

- Threaded parallelism for the online/interactive stuff.
- Distributed parallelism for near-line non-interactive stuff.
- Tools to make parallelization simpler
- Fitting:
  - Support for GPU 'accelerated' fitting residual and Jacobian computation 😕
  - Machine learning for single/double pulse determination most traces are single pulses

#### Example trace fitting the sum signal: same program threaded/cluster





# **MPI – cluster distributed parallel computing**

- MPI Message Passing Interface standard for writing distributed parallel programs.
  - OpenMPI <u>https://www.open-mpi.org/</u>
  - MPICH <a href="https://www.mpich.org/">https://www.mpich.org/</a>
- Multiple instances of the same process run in parallel.
  - Each process as a *rank* identifying it.
  - Processes can target messages to specific ranks.
  - Communicators can be formed to link groups of processes together.
- Messages require:
  - Rank who we're sending to but:
  - Communicator defines the process group in which the rank has meaning (MPI\_COMM\_WORLD the entire application is pre-defined).
  - A Tag (integer)
  - Message data.
  - Type of data in the message (message data are strongly typed)
  - Number of items of that type being sent.



### The MPI API is large and complex:

MPI MPIX Allgather init MPIX Allgathery init MPIX Allreduce init MPIX Alltoall init MPIX Alltoally init MPIX Alltoallw init MPIX Barrier init MPIX Bcast init MPIX Exscan init MPIX Gather init MPIX Gathery init MPIX Neighbor allgather init MPIX Neighbor alloathery init MPIX Neighbor alltoall init MPIX Neighbor alltoally init MPIX Neighbor alltoallw init MPIX Query cuda support MPIX Reduce init MPIX Reduce scatter block init MPIX Reduce scatter init MPIX Scan init MPIX Scatter init MPIX Scattery init MPI Abort MPT Accumulate MPI Add error class MPI Add error code MPI Add error string MPI Address MPI Aint add MPI Aint diff MPI Allgather MPI Allgatherv MPI Alloc mem MPI Allreduce MPI Alltoall MPI Alltoally MPT Alltoallw MPI Attr delete MPI Attr get MPI Attr put

MPI File call errhandler MPI File close MPI File create errhandler MPI File delete MPI File f2c MPI File get amode MPI File get atomicity MPI File get byte offset MPI File get errhandler MPI File get group MPI File get info MPI File get position MPI File get position shared MPI File aet size MPI File get type extent MPI File get view MPI File iread MPI File iread all MPI File iread at MPI File iread at all MPI File iread shared MPI File iwrite MPI File iwrite all MPI File iwrite at MPI File iwrite at all MPI File iwrite shared MPI File open MPI File preallocate MPI File read MPI File read all MPI File read all begin MPI File read all end MPI File read at MPI File read at all MPI File read at all begin MPI File read at all end MPI File read ordered MPI File read ordered begin MPI File read ordered end MPI File read shared MPI File seek MPI File seek shared

MPI Ineighbor allgather MPI Ineighbor allgatherv MPI Ineighbor alltoall MPI Ineighbor alltoally MPI Ineighbor alltoallw MPI Info c2f MPI Info create MPI Info delete MPI Info dup MPI Info env MPI Info f2c MPI Info free MPI Info get MPI Info get nkeys MPI Info get nthkey MPI Info get valuelen MPI Info set MPI Init MPI Init thread MPI Initialized MPI Intercomm create MPI Intercomm merge MPI Iprobe MPI Irecv MPI Ireduce MPI Ireduce scatter MPI Ireduce scatter block MPI Irsend MPI Is thread main MPI Iscan MPI Iscatter MPI Iscatterv MPI Isend MPI Issend MPI Keyval create MPI Keyval free MPI Lookup name MPI Message c2f MPI Message f2c MPI Mprobe MPI Mrecv MPI Neighbor allgather

MPI T init thread MPI T pvar get info MPI T pvar get num MPI T pvar handle alloc MPI T pvar handle free MPI T pvar read MPI T pvar readreset MPI T pvar reset MPI T pvar session create MPI T pvar session free MPI T pvar start MPI T pvar stop MPI T pvar write MPI Test MPI Test cancelled MPI Testall MPI Testany MPI Testsome MPI Topo test MPI Type c2f MPI Type commit MPI Type contiguous MPI Type create darray MPI Type create f90 comp MPI Type create f90 intege MPI Type create f90 real MPI Type create hindexed MPI Type create hindexed MPI Type create hvector MPI Type create indexed b MPI Type create keyval MPI Type create resized MPI Type create struct MPI Type create subarray MPI Type delete attr MPI Type dup MPI Type extent MPI Type f2c MPI Type free MPI Type free keyval MPI Type get attr MPI Type get contents

MPI Bcast MPI Bsend MPI Bsend init MPI Buffer attach MPI Buffer detach MPI Cancel MPI Cart coords MPI Cart create MPI Cart get MPI Cart map MPI Cart rank MPI Cart shift MPI Cart sub MPI Cartdim get MPI Close port MPI Comm accept MPI Comm c2f MPI Comm call errhandler MPI Comm compare MPI Comm connect MPI Comm create MPI Comm create errhandler MPI Comm create group MPI Comm create keyval MPI Comm delete attr MPI Comm disconnect MPI Comm dup MPI Comm dup with info MPI Comm f2c MPI Comm free MPI Comm free keyval MPI Comm get attr MPI Comm get errhandler MPI Comm get info MPI Comm get name MPI Comm get parent MPI Comm group MPI Comm idup MPI Comm join MPI Comm rank MPI Comm remote group MPI Comm remote size MPI Comm set attr MPI Comm set errhandler MPI Comm set info MPI Comm set name MPI Comm size MPI Comm spawn MPI Comm spawn multiple MPI Comm split MPI Comm split type

MDI Comm toot int

MPI File set errhandler MPI File set info MPI File set size MPI File set view MPI File sync MPI File write MPI File write all MPI File write all begin MPI File write all end MPI File write at MPI File write at all MPI File write at all begin MPI File write at all end MPI File write ordered MPI File write ordered begin MPI File write ordered end MPI File write shared MPI Finalize MPI Finalized MPI Free mem MPI Gather MPI Gatherv MPI Get MPI Get accumulate MPI Get address MPI Get count MPI Get elements MPI Get elements x MPI Get library version MPI Get processor name MPI Get version MPI Graph create MPI Graph get MPI Graph map MPI Graph neighbors MPI Graph neighbors count MPI Graphdims get MPI Grequest complete MPI Grequest start MPI Group c2f MPI Group compare MPI Group difference MPI Group excl MPI Group f2c MPI Group free MPI Group incl MPI Group intersection MPI Group range excl MPI Group range incl MPI Group rank MPI Group size

MDI. Crown, translat

MPI Neighbor alltoall MPI Neighbor alltoally MPI Neighbor alltoallw MPI Op c2f MPI Op commutative MPI Op create MPI Op f2c MPI Op free MPI Open port MPI Pack MPI Pack external MPI Pack external size MPI Pack size MPI Pcontrol MPI Probe MPI Publish name MPI Put MPI Query thread MPI Raccumulate MPI Recv MPI Recv init MPI Reduce MPI Reduce local MPI Reduce scatter MPI Reduce scatter block MPI Register datarep MPI Request c2f MPI Request f2c MPI Request free MPI Request get status MPI Raet MPI Rget accumulate MPI Rput MPI Rsend MPI Rsend init MPI\_Scan MPI Scatter MPI Scattery MPI Send MPI Send init MPI Sendrecv MPI Sendrecv replace MPI Sizeof MPI Ssend MPI Ssend init MPI Start MPI Startall MPI Status c2f MPI Status f2c MPI Status set cancelled MPI Status set elements MDT Ctatus act clomost

... and there's more...much more.



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### Approaches for encapsulating MPI Subset wrapping

- Straight encapsulation of the MPI function interface.
  - Approach taken by Axel Kohlmeyer for the mpi package
  - See e.g. https://core.tcl-lang.org/jenglish/gutter/packages/mpi.html

5.1 Data types 5.2 Communicators 6 TclMPI Command Reference 6.1 tclmpi::init 6.2 tclmpi::finalize 6.3 tclmpi::abort <comm> <errorcode> 6.4 tclmpi::comm\_size <comm> 6.5 tclmpi::comm\_rank <comm> 6.6 tclmpi::comm\_split <comm> <color> <key> 6.7 tclmpi::comm\_free <comm> 6.8 tclmpi::barrier <comm> 6.9 tclmpi::bcast <data> <type> <root> <comm> 6.10 tclmpi::scatter <data> <type> <root> <comm> 6.11 tclmpi::allgather <data> <type> <comm> 6.12 tclmpi::gather <data> <type> <root> <comm> 6.13 tclmpi::allreduce <data> <type> <op> <comm> 6.14 tclmpi::reduce <data> <type> <op> <root> <comm> 6.15 tclmpi::send <data> <type> <dest> <tag> <comm> 6.16 tclmpi::isend <data> <type> <dest> <tag> <comm> 6.17 tclmpi::recv <type> <source> <tag> <comm> ?status 6.18 tclmpi::irecv <type> <source> <tag> <comm> 6.19 tclmpi::probe <source> <tag> <comm> ?status? 6.20 tclmpi::iprobe <source> <tag> <comm> ?status? 6.21 tclmpi::wait <request> ?status? 7 Evamples

ompreteness of the imprementation

- Still captures the flavor of the MPI API
- Still exposes explicitly the MPI API subset
- Still exposes the complexity.

# What do Tcl MPI applications want to do:

- Send scripts executed in other ranks.
  - Special case of send to all or all others.
- Send data that can be handled by other ranks via callbacks.
  - Again special case of send to all or to others.
- Tcl We know in advance: Everything has a string representation.
- Binary data may be sent around by the C/C++ part of the application for C/C++ parts of the application to work on needs a way for that code to shove the TcIMPI event handling stuff aside and take over.



# mpitcl - MPI aware tcl shell.

- Provides MPI aware tclsh.
  - Must be run from mpirun.
- All ranks run this.
- Rank 0 is special the 'master' interpreter it takes input from stdin (normally a file for cluster batch jobs).
- Provides all processes with the mpi namespace in which the mpi command ensemble lives.
- Rank 0 runs a thread to hoist MPI messages received to the event loop (vwait).
- Ranks other than zero run a main loop that accepts MPI messages and act on them under the assumption they come from mpitcl.
- MPI Tags are used to transparently dispatch messages to appropriate handlers.



# mpi::mpi command ensemble subcommands:

- size
- rank

- How many processes are in the application.
- What is my rank in MPI\_COMM\_WORLD
- execute *where script* Executes a *script* in the rank(s) defined by *where* where is a rank number "all" or "others"
- send *where data* handle *script*

stopnotifier startnotifier

- sends the data to where
- specifies *script* to handle data received. The script receives two parameters: sender rank and the data.
- only legal in rank 0 stops the event notifier thread.
- only legal in rank 0 starts the notifier thread again.



# Sample mpitcl scripts:

```
mpi::mpi stop notifier
mpi::mpi send all exit
```

Mimimal MPI script

```
proc receiver {rank data} {
  puts "Received from $rank '$data'"
  incr::slaves -1
}
set slaves [mpi::mpi size]
incr slaves -1;
                    # number of slave processes.
mpi::mpi handle receiver
mpi::mpi execute others {
  mpi::mpi send 0 "Rank [mpi::mpi rank] is alive"
}
while {$slaves} {
  vwait slaves
mpi::mpi stopnotifier
mpi::mpi execute all exit
```

Soliciting/getting data from workers

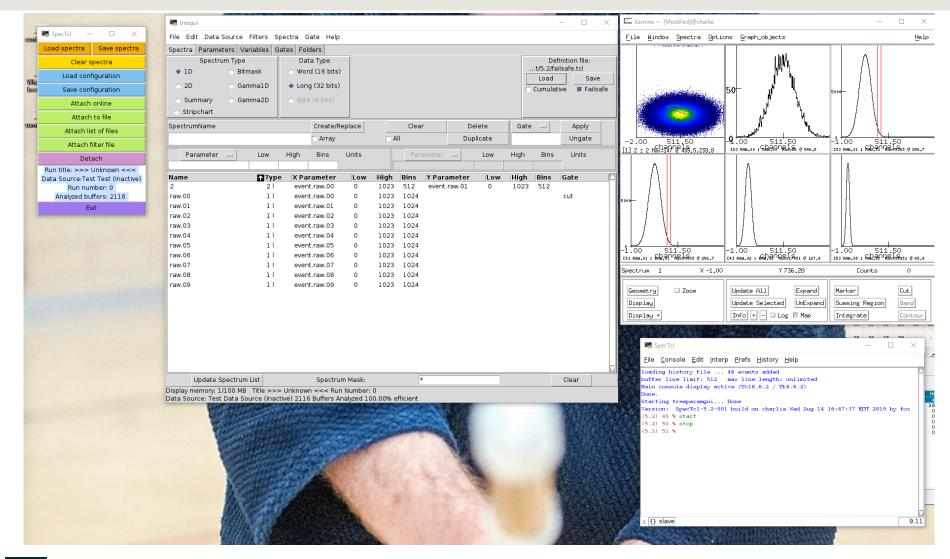


# Applying tclmpi – The Circle is complete.

- NSCLSpectcl
- Structure
- Parallelization of the interactive version (threaded).
- Creating a batch NSCLSpecTcl and using it with tclmpi.

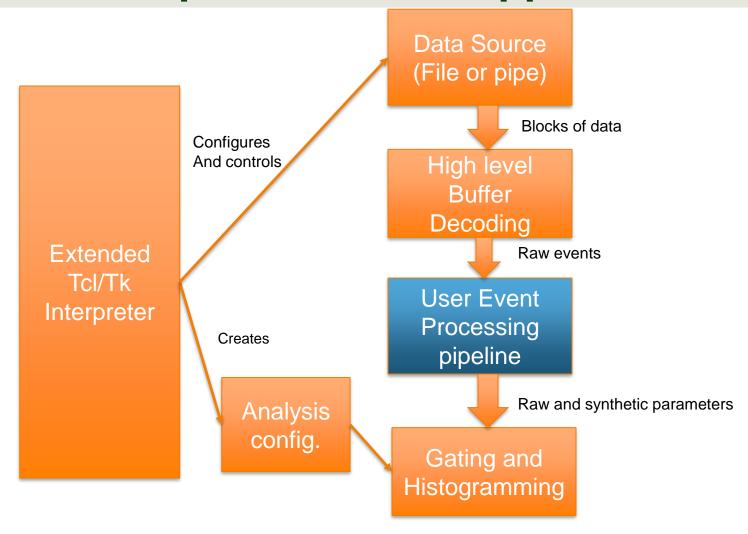


# **NSCLSpecTcl** is highly interactive



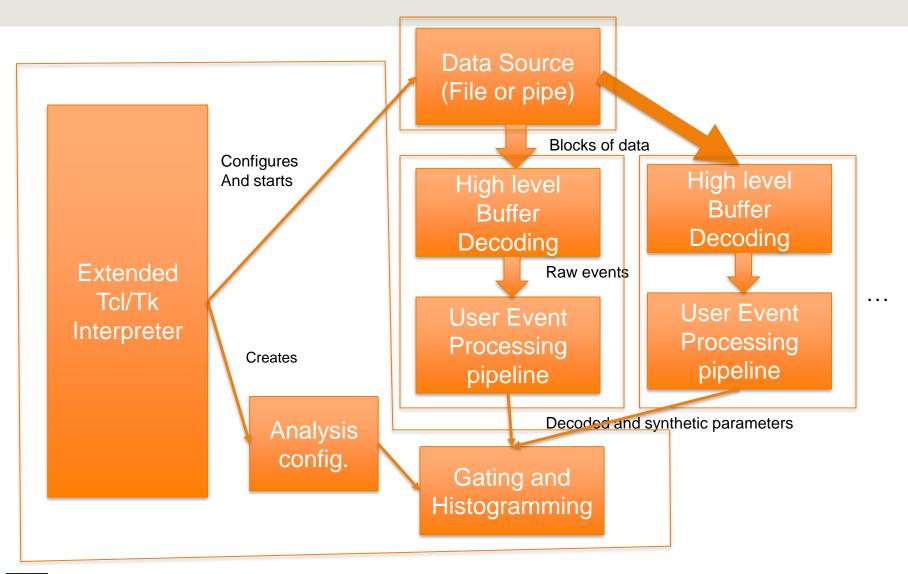


# Simplified NSCLSpecTcl structure and parallelization approaches.





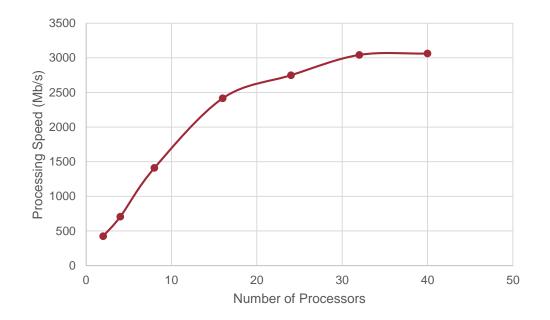
# **Threaded Parallelism (Giordano Cerizza)**





User code must be thread-safe

# **Threaded Spectcl performance**



- Roll off is at the performance limit of the SSD that contained the data.
- Analysis pipeline for this case is simple compared with E17011's.
- Good scaling up until SSD transfer limits.



# **MPI parallelism?**

- We can recruit more cores if the application scales.
- We don't have to worry about thread safety since it's process parallelism.
- With an assist from container technology (e.g. singularity) we can get outside the NSCL to supercomputer centers (or ICER e.g.) with even more cores.
- BUT In almost all cases cluster computing doesn't allow dynamic interactivity.
  - Needed to turn NSCLSpecTcl into a batch program.
  - Needed to figure out how to easily parallelize it.
  - This is the original target of mpitcl.



# **MPI NSCLSpecTcl**

- Each process is a complete batch NSCLSpecTcl
  - Batch NSCLSpecTcl is three packages
    - » spectcl the base application code.
    - » mpispectcl MPI data sources and sinks.
    - » A user supplied package implementing the processing pipeline.
  - Batch/MPI NSCLSpecTcl has generalized data sources and sinks. **analyze** command sends blocks of events from source to sink. I've implemented:

» Source --file.

- » Source MPI (for workers requests block of data from rank 0).
- » Sink -- Analysis
- » Sink MPI (Distributes blocks of data to workers using MPI source).

#### • Rank 0 :

- Tells each process (including itself) to read in the configuration scripts.
- Tells other process to use an MPI Source and Analysis sink
- Tells itself to use a file data source and MPI sink.
- Tells everyone to start analyzing data.
- When analysis is complete Rank 0
  - Tells all other processes to send it spectrum data.
  - · Sums the spectra into total spectra
  - Writes them out for visualization.



### What this looks like:

```
mpi::mpi execute all {
    package require spectcl
    package require mpispectcl
    package require MyPipeline; # User event processing code is here.
    source defs.tcl
}
mpi::mpi execute others {
    mpisource
    analysissink
}
filesource run-0003-00.evt
mpisink
mpi::mpi stopnotifier
mpi::mpi execute others analyze
analyze
mpi::mpi startnotifier
```



### Getting the data back:

```
set l [spectrum -list]
set f [open spectra.dat w]
foreach spectrum $l {
   set name [lindex $spectrum 1]
   getSpectrumFromWorkers $name
   swrite -format ascii $f $name; # Writes a histo to file.
}
```

close \$f



### Summing a spectrum from worker nodes.

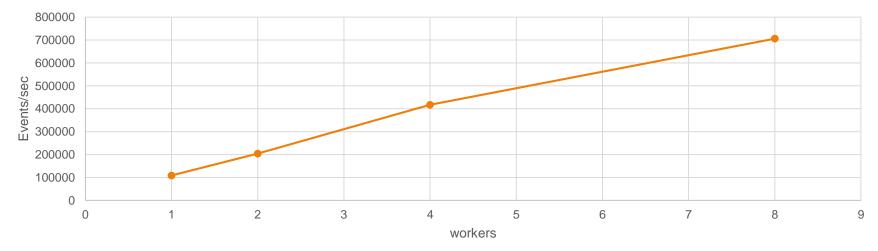
```
foreach datum $data {
       set value [lindex $datum end]
       set coords [lrange $datum 0 end-1]
       set current [channel -get $name $coords]
       incr current $value
       channel -set $name $coords $current
   incr ::expected -1
proc getSpectrumFromWorkers name {
   mpi::mpi handle [list addData $name]
   set ::expected [mpi::mpi size]
   incr ::expected -1;
   set script "mpi::mpi send 0; # Care must be taken to ensure substitutions are done
   append script "\["
                          ; # in the right process.
   append script "scontents $name]"
   mpi::mpi execute others $script
   while \{\$::expected > 0\} {
       vwait ::expected;
```



### **Does this work?**

10Gbyte file with 2,754,450 events.						
Workers	Time	MB/sec	Events/sec			
1	25.4	403.1496	108442.91			
2	13.5	5 758.5185	204033.33			
4	6.6	5 1551.515	417340.91			
8	3.9	2625.641	706269.23			

- 2.6Gbytes/sec is interconnect saturation (dual 10GBit/sec ethernet)
- Event processing in the actual experiment will be more complex but we can scale to more workers.



#### Events/sec



# Conclusions

- NSCL's Transition to modern, digital nuclear electronics poses problems for online and near-line data analysis.
- Experiments will increasingly require parallelism in online and near-line data handling:
  - Software tools to make it easy for naïve users to make use of parallelism by plugging in their event analysis code.
  - Large core count systems for interactive, online analysis (threaded parallel).
  - Clusters dedicated to the running experiment for near-line analysis (distributed parallel).
  - High speed interconnects to support the data flow bandwidth.
  - Large, multi-petabyte storage that's fast with fast interconnects.
- E17011 provides a laboratory to explore the techniques we'll need to apply to modern experiments.
- mpitcl is one technique to simplify parallel programming for "the masses"
  - Easly retrofitted a highly interactive, complex serial analysis program (2 days work)
  - Got scaling up to the interconnect bandwidth.

