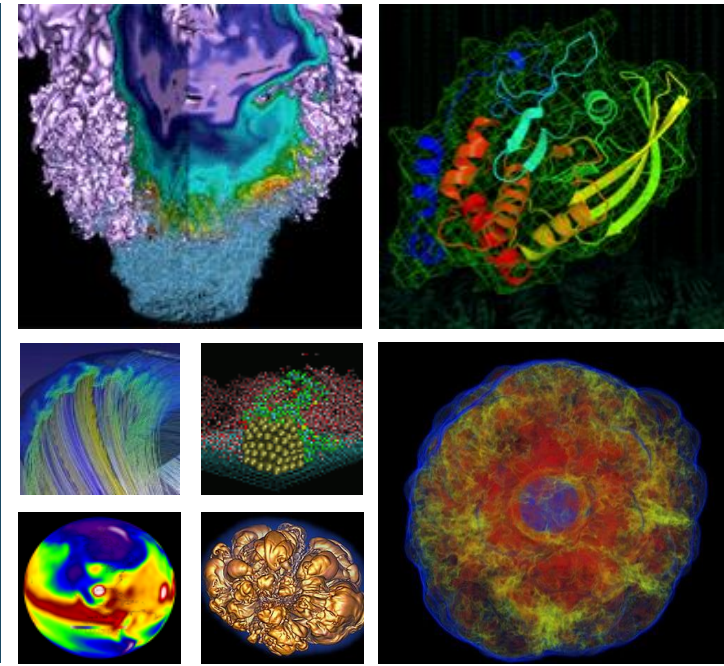


Optimization of the *Model for Prediction Across Scales: Ocean Core* Targeting Production Scale Use of Knights Landing Processor Architecture

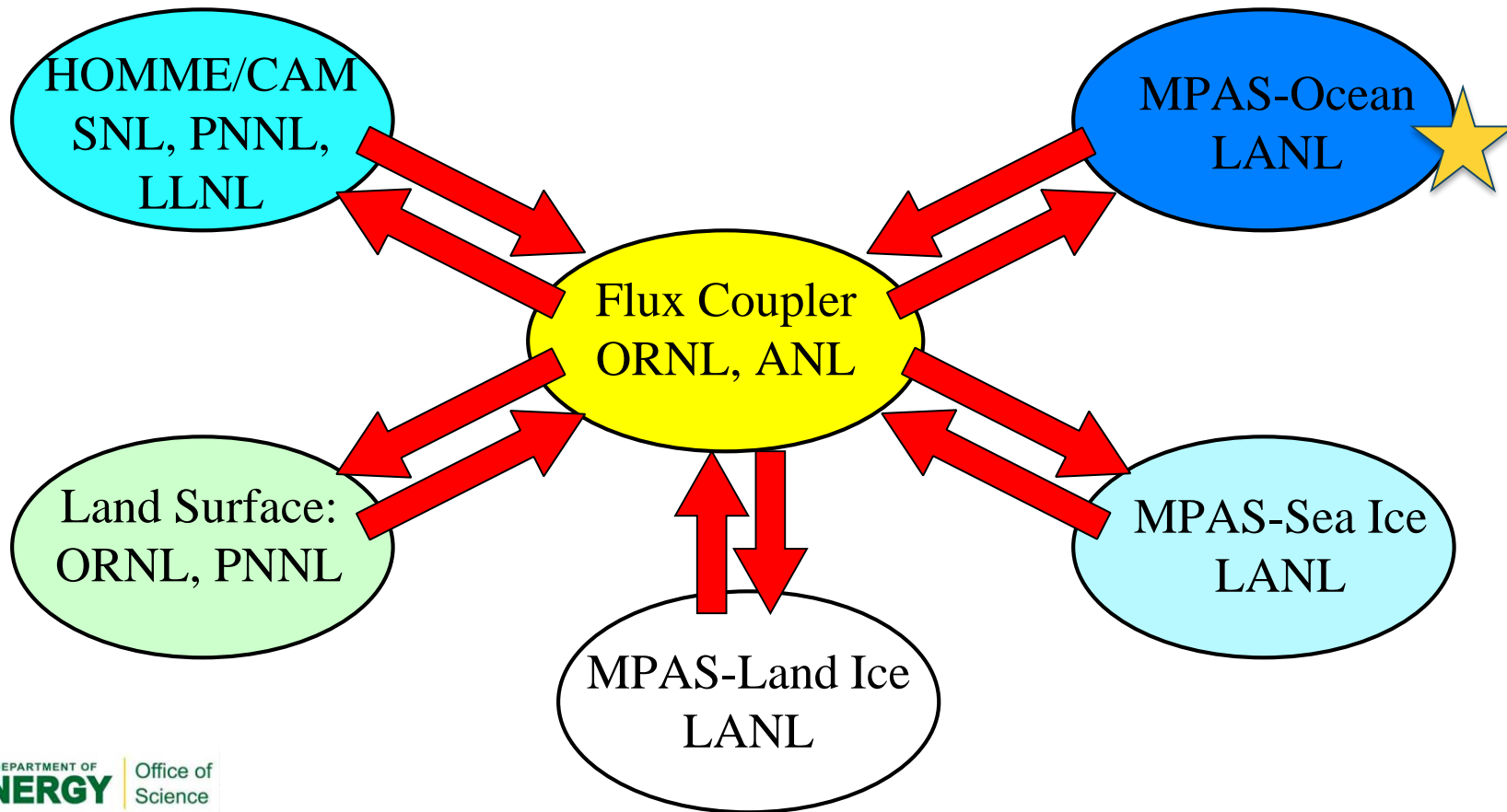


William Arndt

*September 26, 2018
IXPUG Fall Conference
Hillsboro, Oregon*

- **E³SM – Energy Exascale Earth System Model**
 - Part of ECP initiative at the Department of Energy
 - 300+ contributors over lifetime of project
 - LLNL, PNNL, Sandia, LANL, ORNL, LBNL, Argonne, UCAR
- **MPAS framework – Model for Prediction Across Scales**
 - 50+ contributors
 - Simulations implemented via unstructured mesh
 - 800,000 lines of Fortran
- **NESAP - NERSC Exascale Science Applications Program**
 - Fund post docs to adapt high impact applications to KNL

Coupled Climate Model

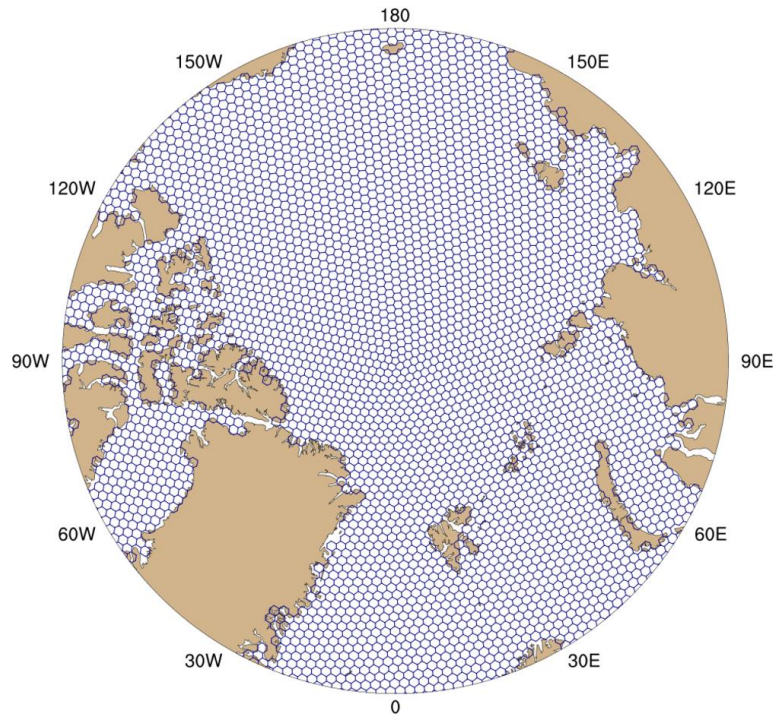


Unstructured Mesh Model of Earth

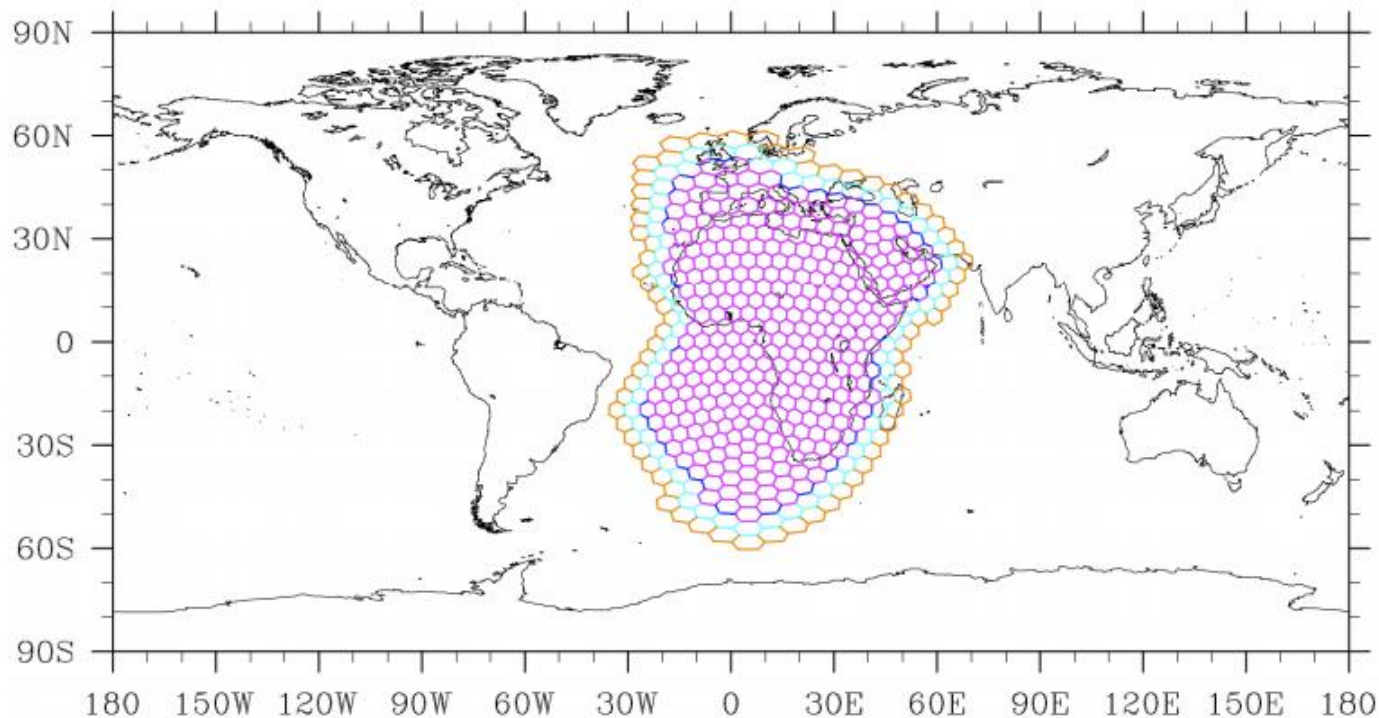


- **Low Resolution: 400k Cells**
- **Med. Resultion: 1.5m Cells**
- **High Resolution: 6m Cells**

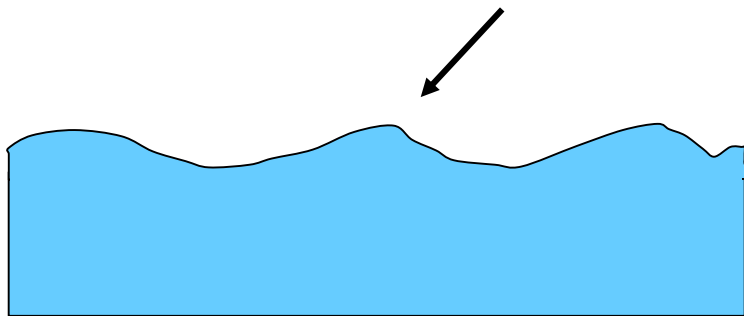
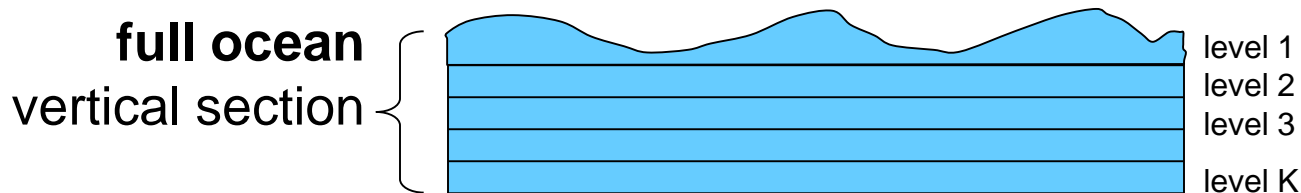
MPASOcean60km.nc



Parallelization by Partition and Halo Exchange



Split-Explicit Integration and Vectorization in Depth

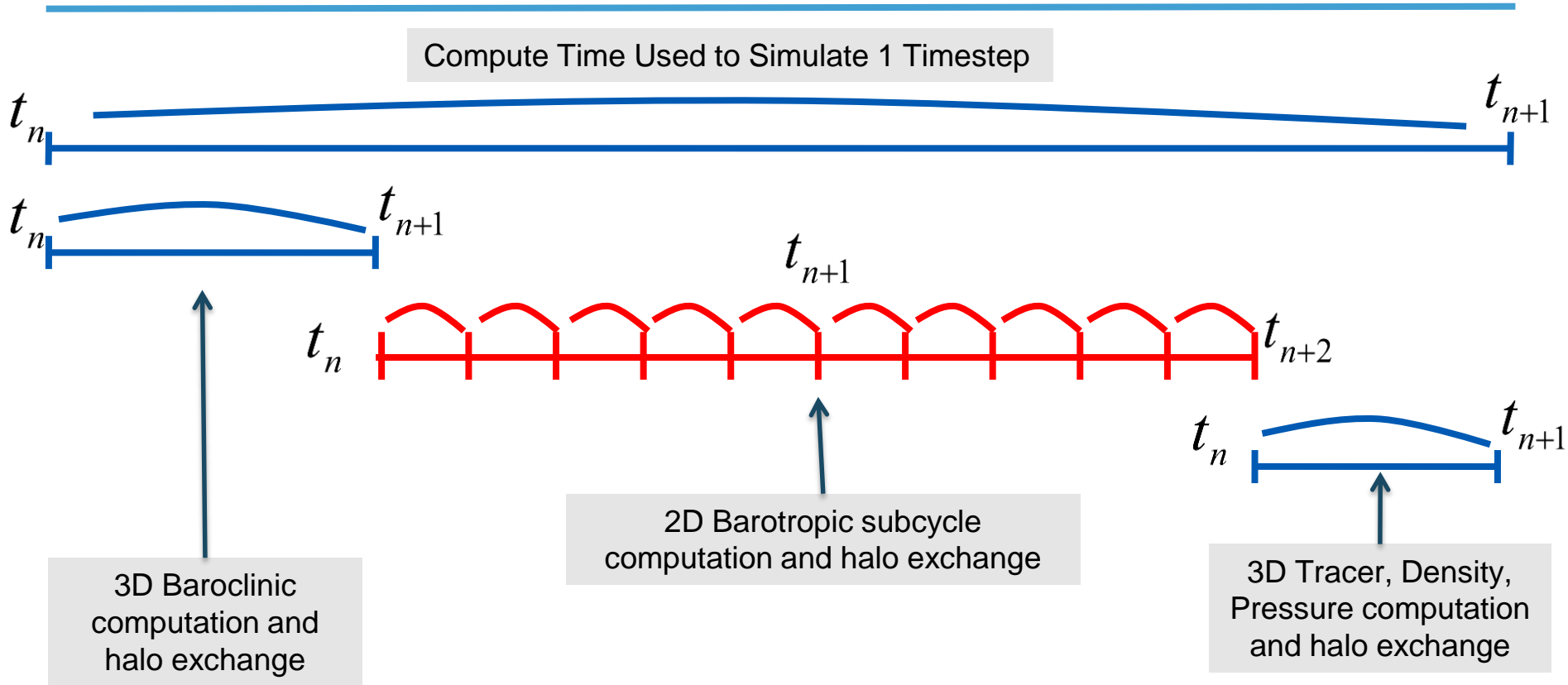


2D barotropic
Fast propagating fields



3D baroclinic
Slow propagating fields

Split-Explicit Integration and Barotropic Subcycling



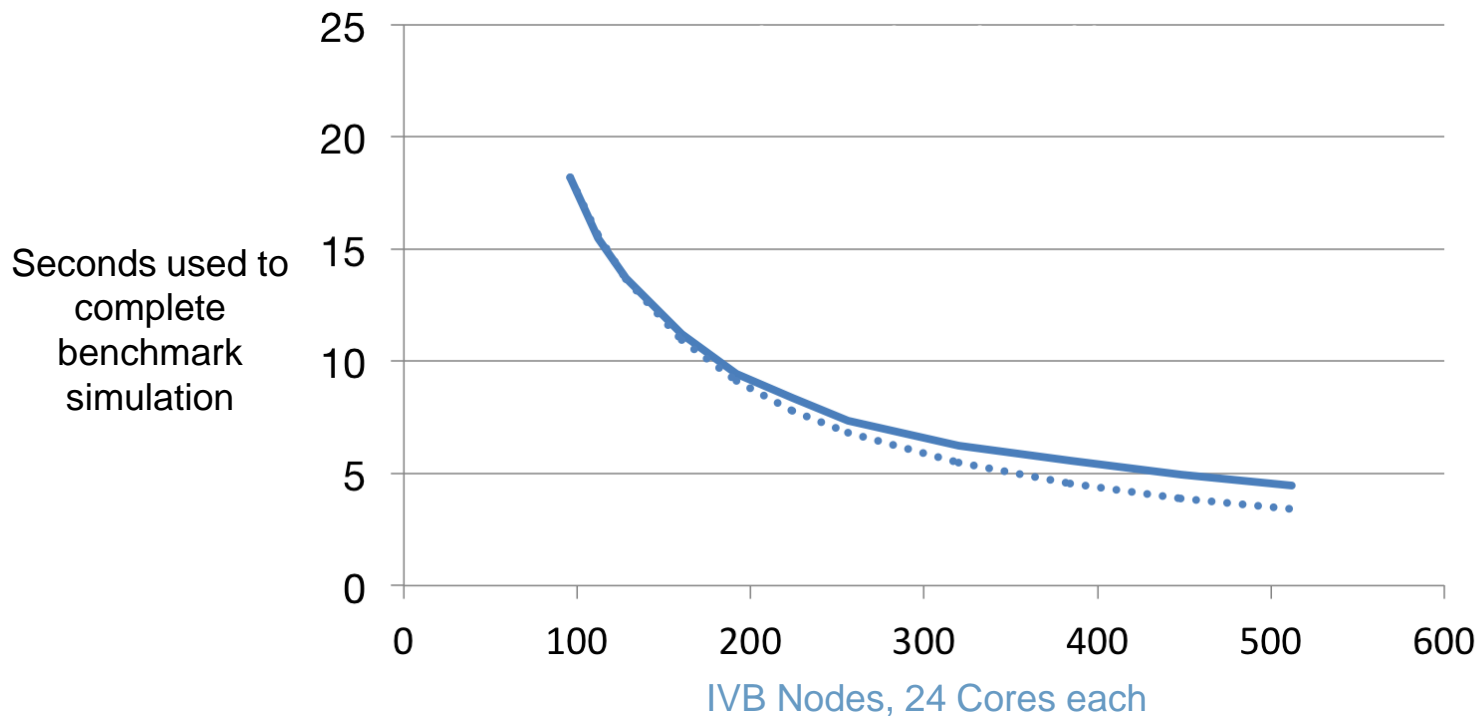
U.S. DEPARTMENT OF
ENERGY

Office of
Science

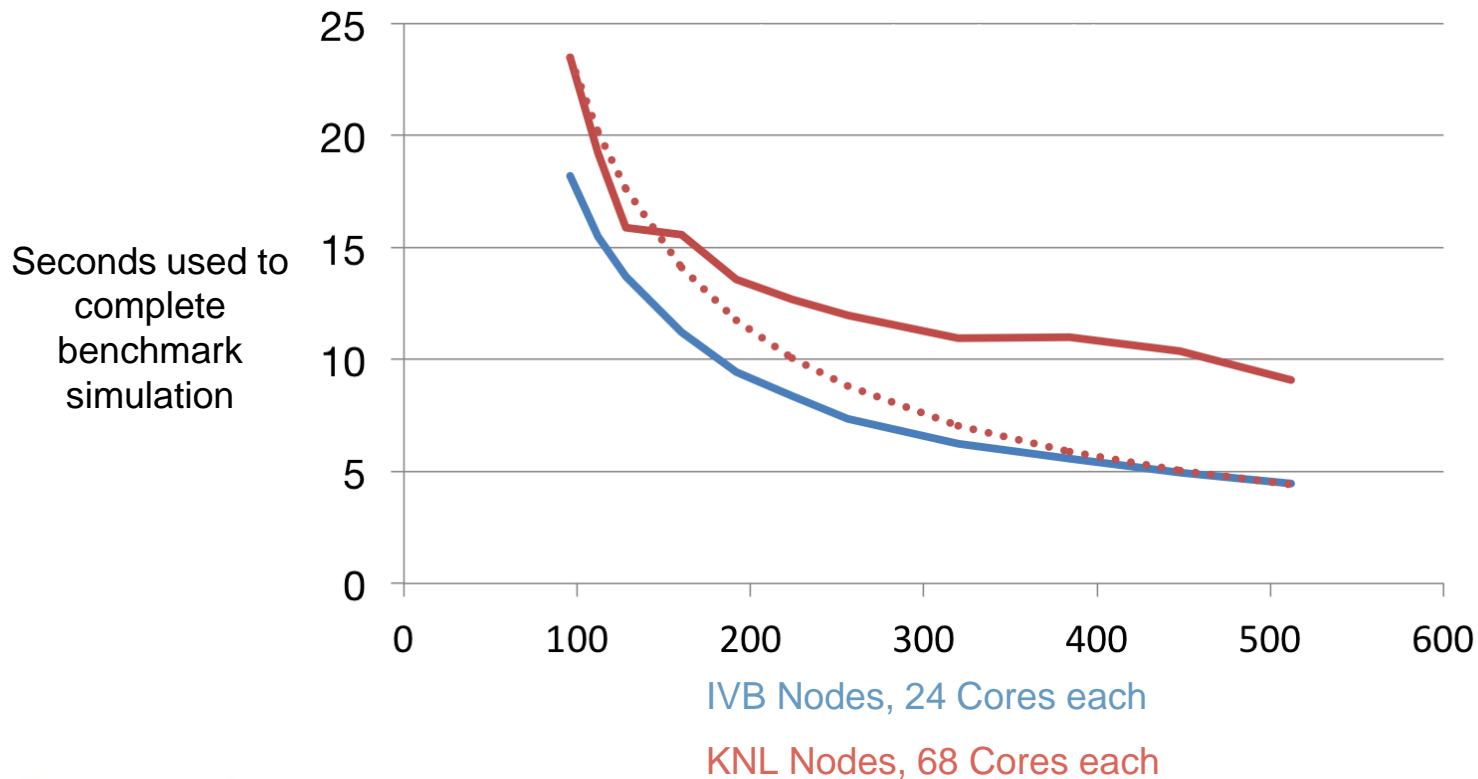


- **NERSC systems**
 - Edison with Xeon Ivy Bridge (IVB) processors
 - Cori with Xeon Phi Knights Landing (KNL) Processors
- **Goals**
 - Explain performance disparity between KNL and IVB when MPAS-Ocean runs simulations at production scale (256+ nodes)
 - Find, implement, and push to production optimizations which bring KNL performance on par with IVB

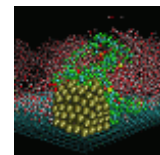
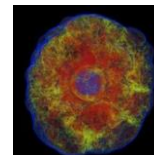
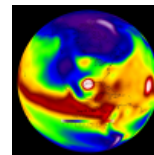
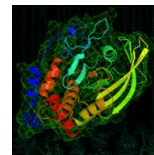
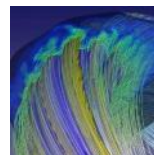
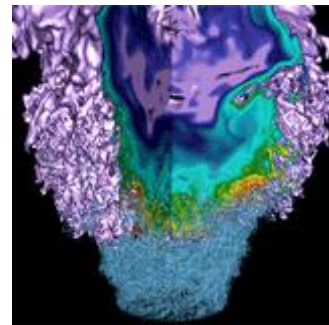
Initial Performance



Initial Performance + KNL



Is it load imbalance?



U.S. DEPARTMENT OF
ENERGY

Office of
Science

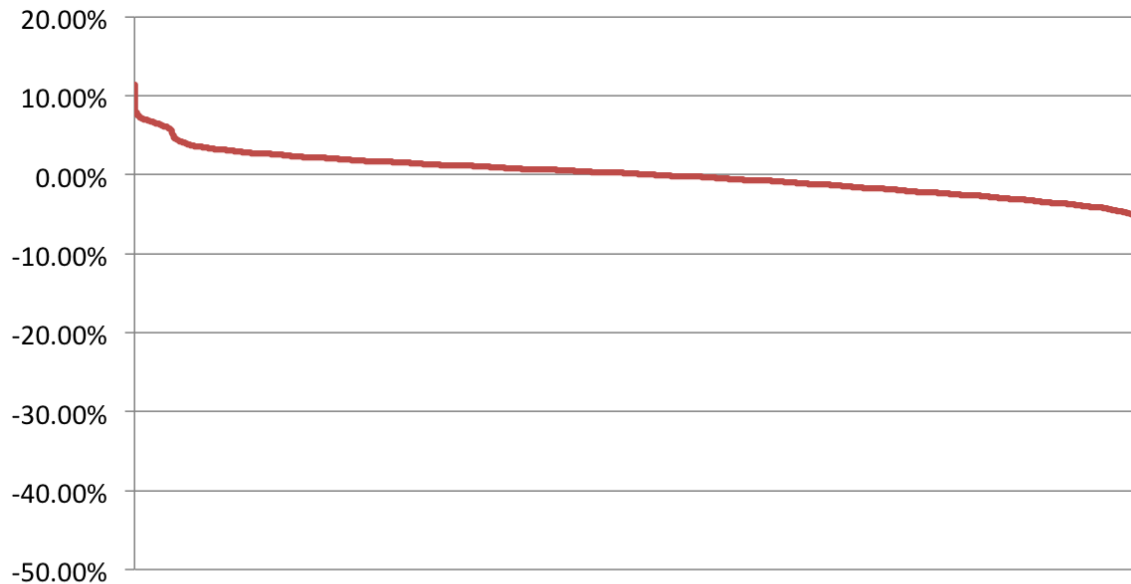


Measuring Load Imbalance



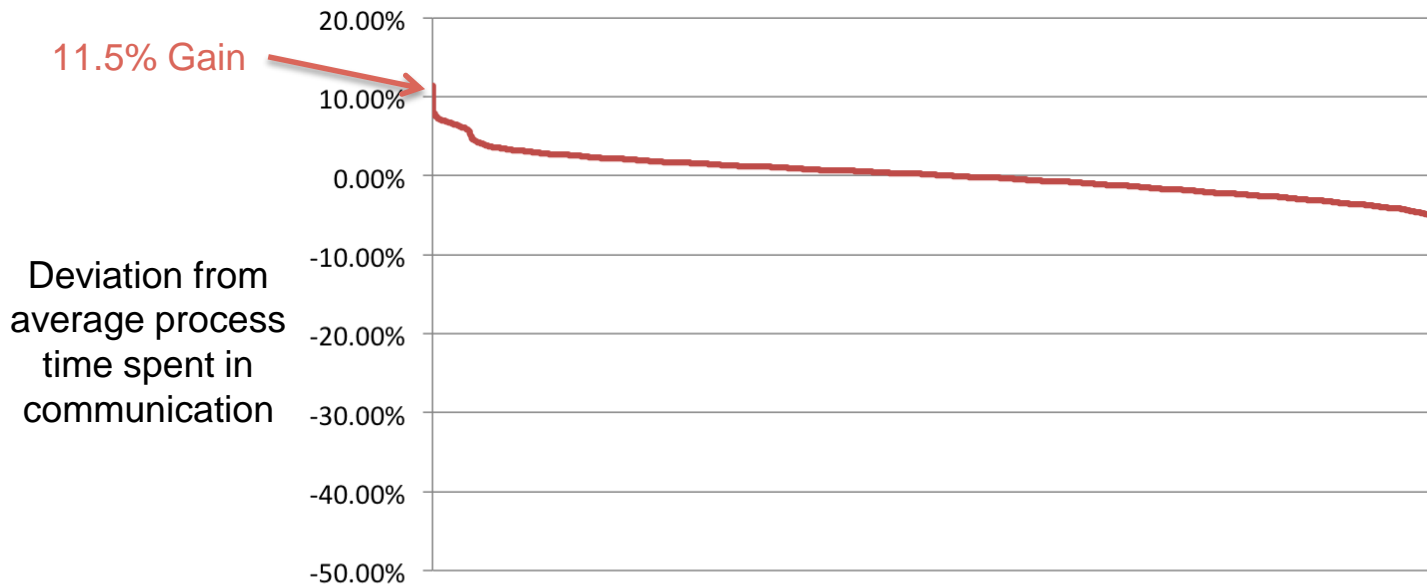
- Can't just measure MPI sync time and be done
 - All Halo exchanges are implemented point to point
 - MPI_Isend, MPI_Irecv
 - Looping through a list to check for expected messages with MPI_Test disguises some imbalance time as compute
- A plan to approximate
 - Wall time is determined by process with most compute. It makes neighbors wait, but does the least waiting itself as messages from it's neighbors are ready sooner
 - The difference between the minimum process wait time and the average wait time is an approximate upper bound on performance gain possible by improving load balance

Measured Load Imbalance



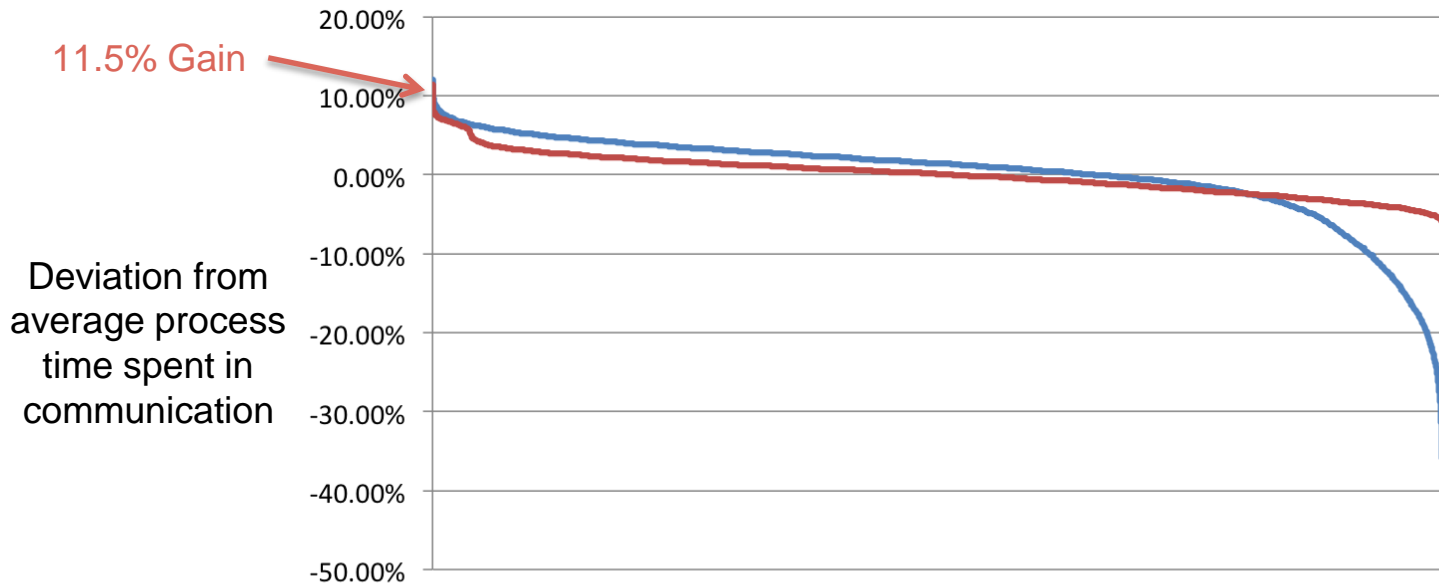
12288 IVB processes sorted by communication time

Measured Load Imbalance



12288 IVB processes sorted by communication time

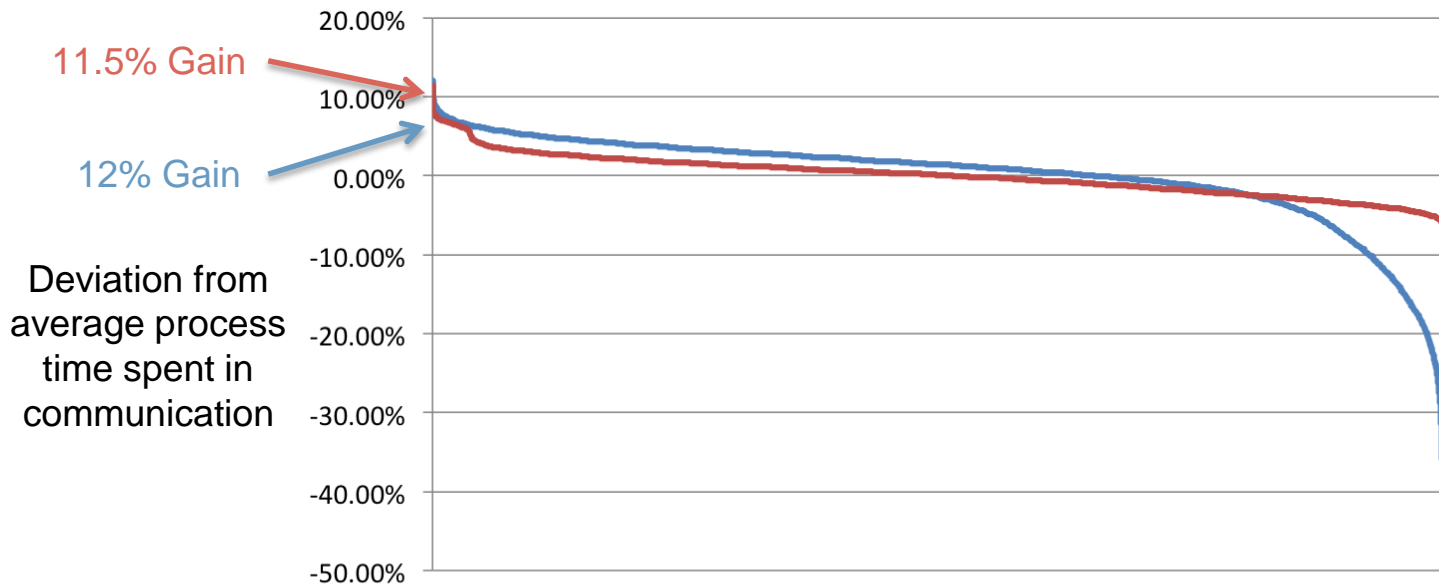
Measured Load Imbalance



12288 IVB processes sorted by communication time

33792 KNL processes sorted by communication time

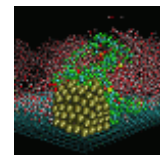
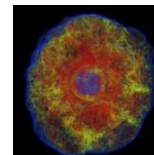
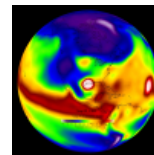
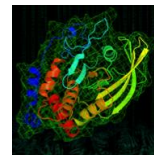
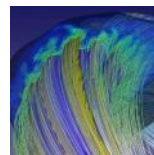
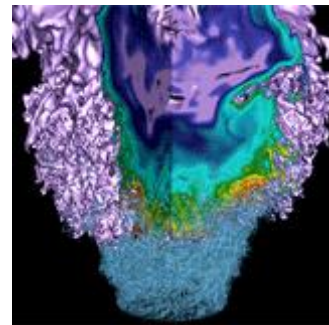
Measured Load Imbalance



12288 IVB processes sorted by communication time

33792 KNL processes sorted by communication time

It's not load imbalance.



U.S. DEPARTMENT OF
ENERGY

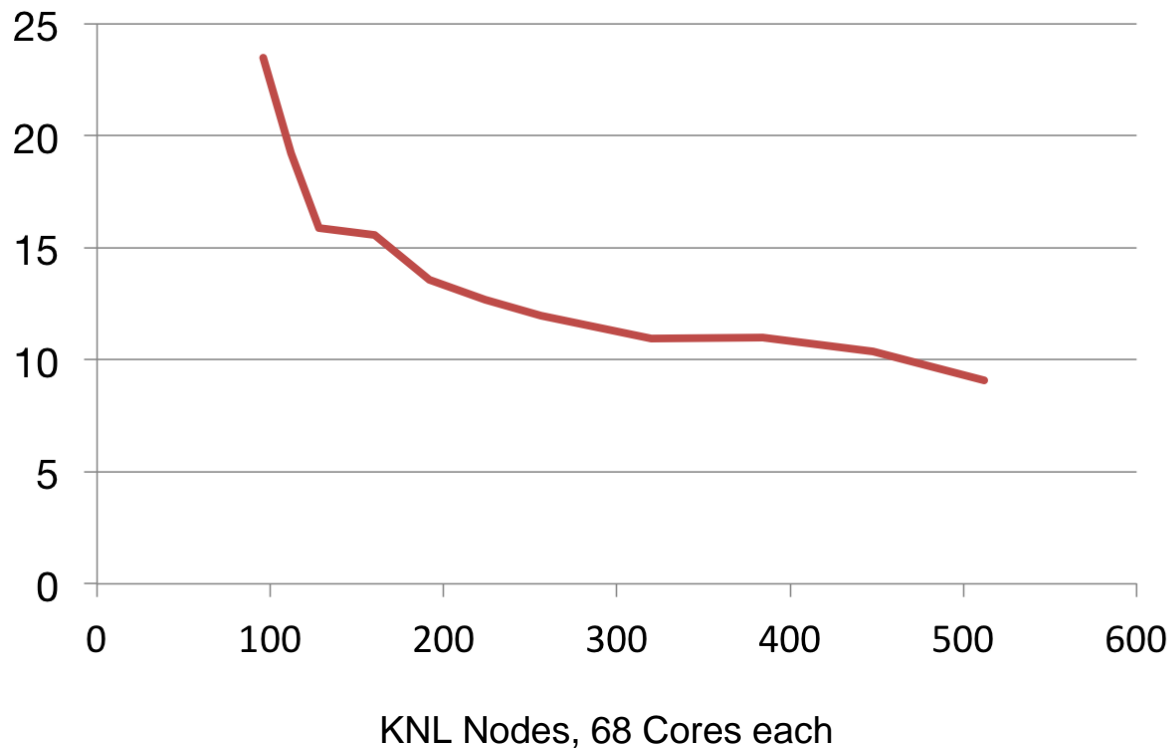
Office of
Science



Looking for the bottleneck on KNL



Seconds spent in
execution phase
during complete
benchmark
simulation

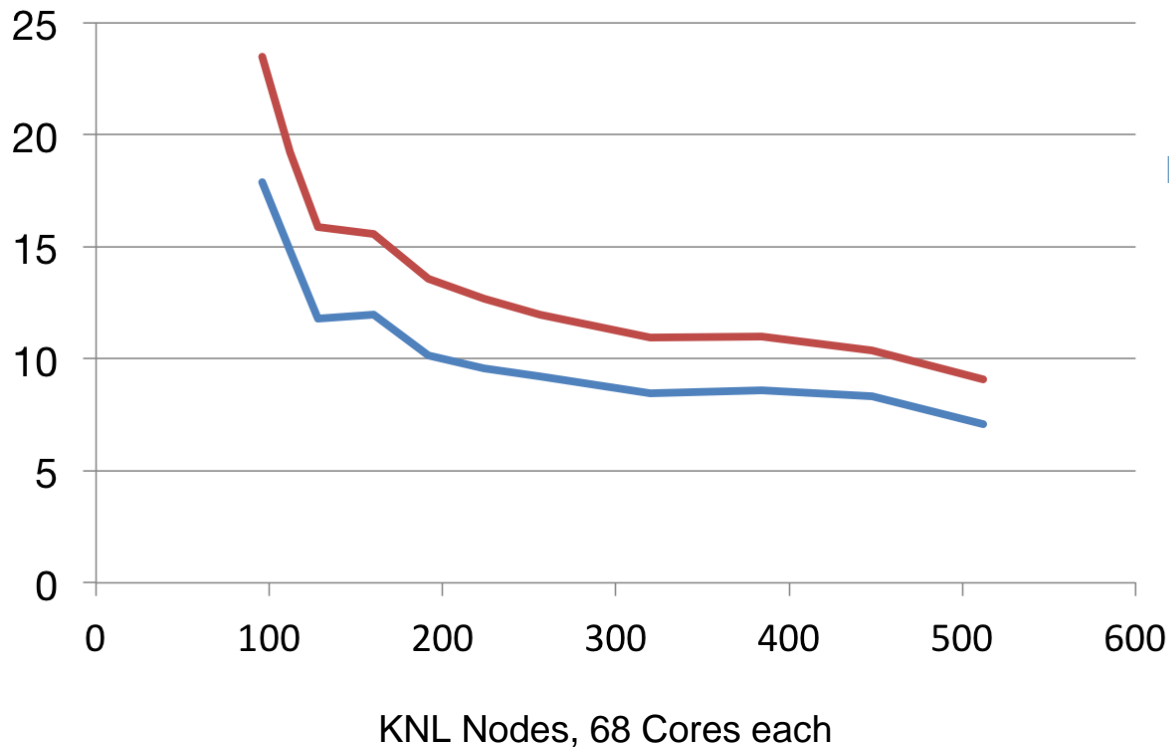


All phases of full
time integration

Looking for the bottleneck on KNL



Seconds spent in
execution phase
during complete
benchmark
simulation



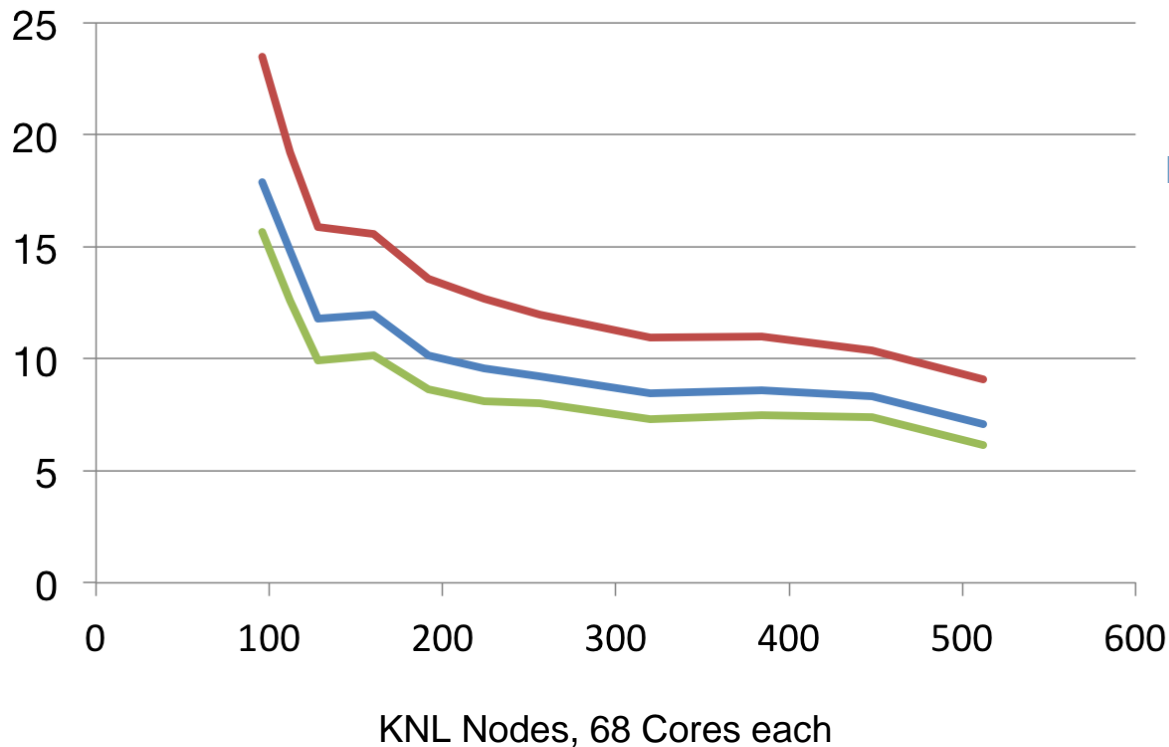
All phases of full
time integration

Barotropic subcycle
phase only

Looking for the bottleneck on KNL



Seconds spent in
execution phase
during complete
benchmark
simulation



All phases of full
time integration

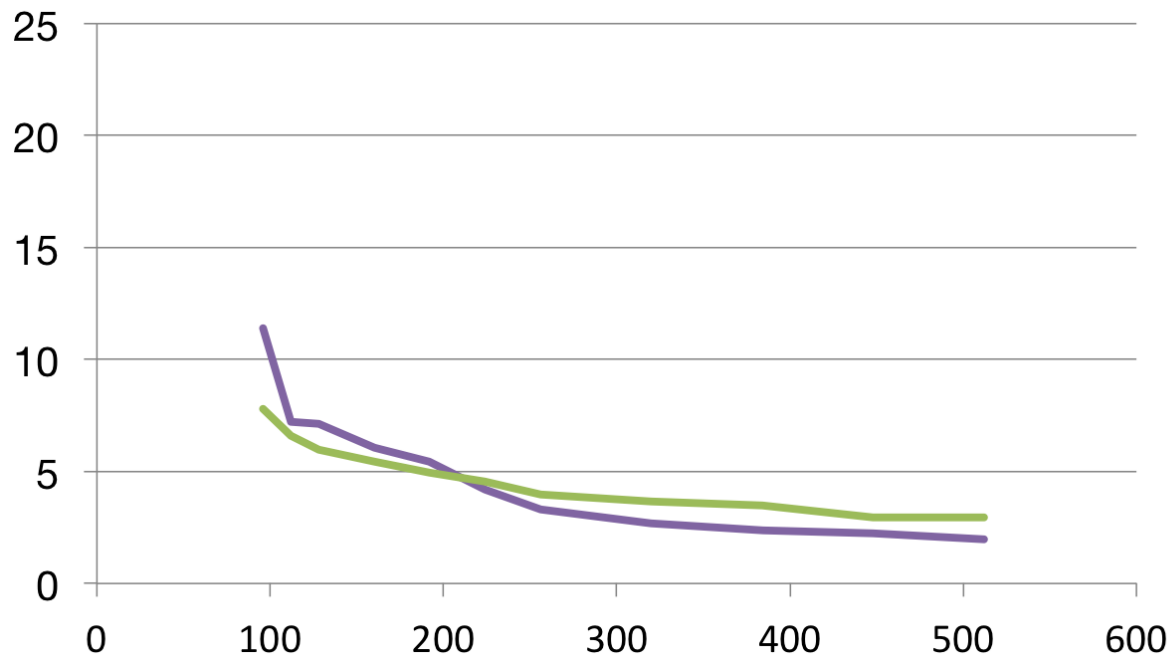
Barotropic subcycle
phase only

Barotropic
subcycle
communication
phase only

IVB vs. KNL: Non BTR subcycle halo



Seconds spent
not in Barotropic
subcycle halo
exchange phase
during complete
benchmark
simulation



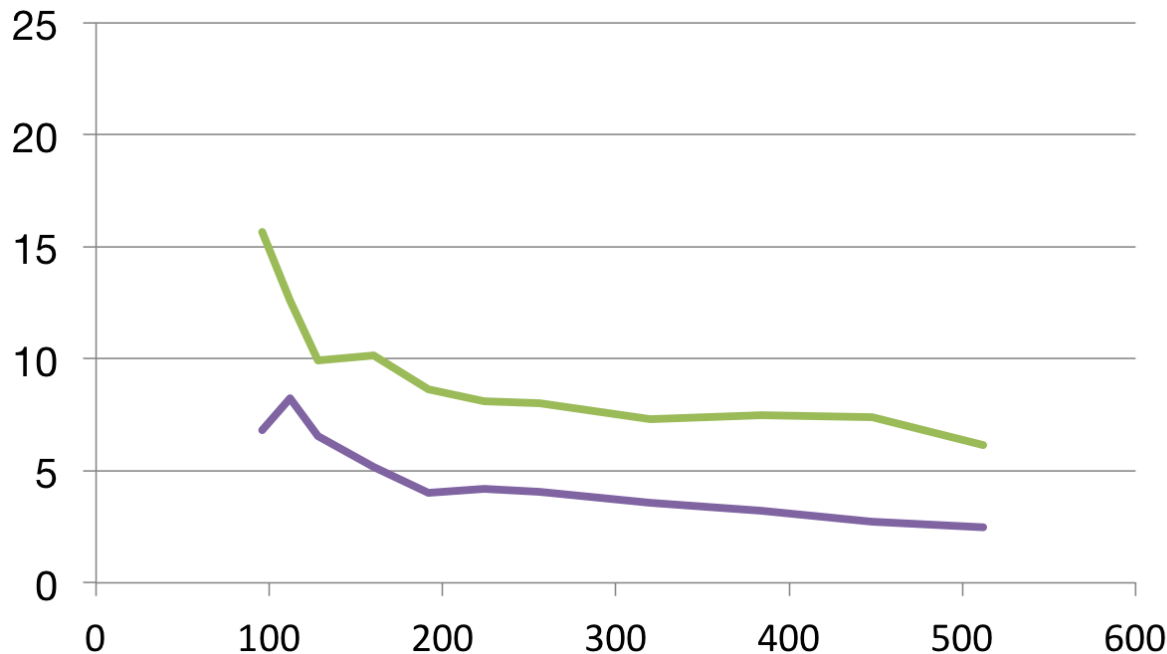
KNL Nodes, 68 Cores each

IVB Nodes, 24 Cores each

IVB vs. KNL: BTR subcycle halo only



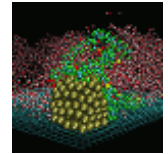
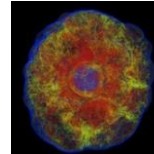
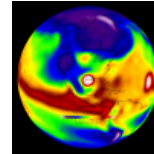
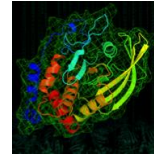
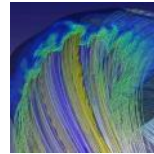
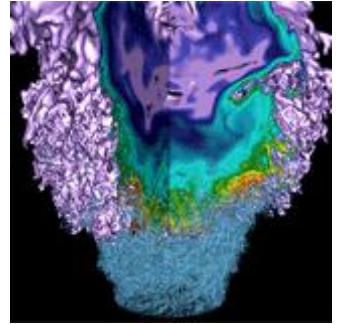
Seconds spent in
Barotropic
subcycle halo
exchange phase
during complete
benchmark
simulation



KNL Nodes, 68 Cores each

IVB Nodes, 24 Cores each

The barotropic subcycle halo exchange is why IVB outperforms KNL.



U.S. DEPARTMENT OF
ENERGY

Office of
Science



Trying to reduce halo exchanges



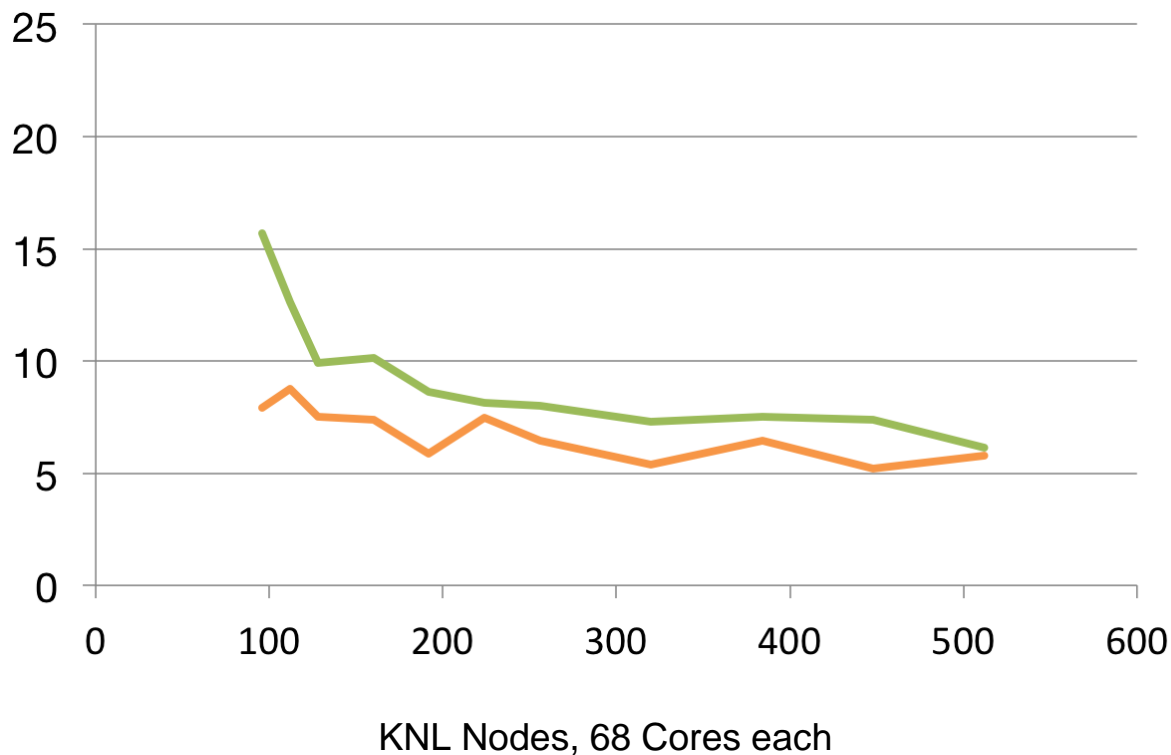
- Try deeper halos
 - Doubling the depth of the halo exchange enables two full timesteps per single halo exchange
 - Framework allows easy configuration of halo depth (but globally)
- Drawbacks
 - Some compute at the edges of partitions is duplicated between neighbor processes (but we have plenty of compute to spare)
 - Sending more than twice as much data; more message packing and larger messages over MPI
 - Barotropic subcycle easy to adapt, but a full implementation would require significant labor to convert the rest of the Ocean

Core

Normal halo vs. deep: Gains



Seconds spent in
Barotropic
subcycle halo
exchange phase
during complete
benchmark
simulation



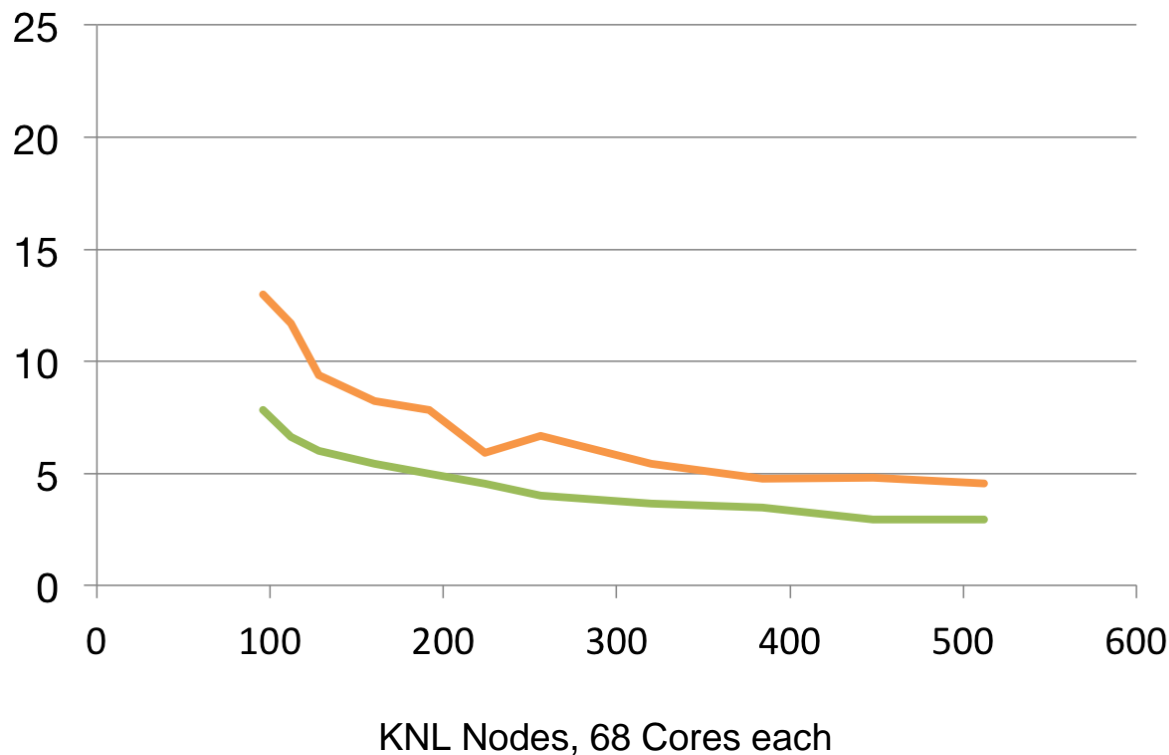
Initial Halo Depth
(3)

Doubled Halo
Depth (6)

Normal halo vs. deep: Losses



Seconds spent
outside
Barotropic
subcycle halo
exchange phase
during complete
benchmark
simulation



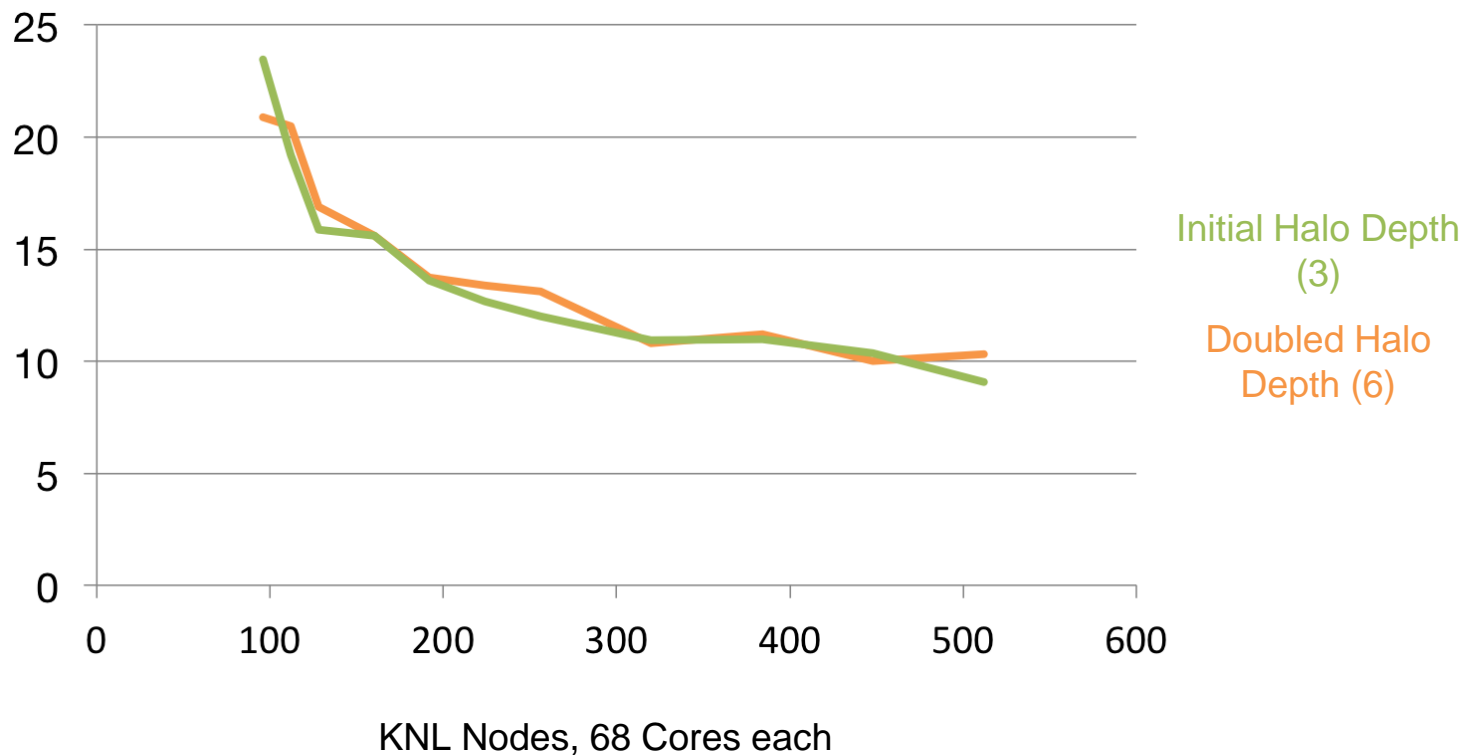
Initial Halo Depth
(3)

Doubled Halo
Depth (6)

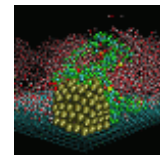
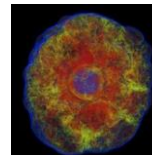
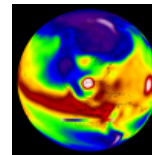
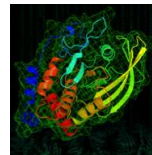
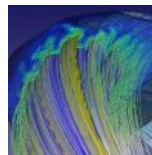
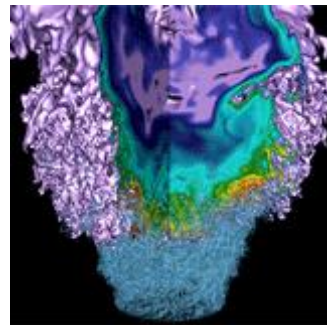
Normal halo vs. deep: It's a wash.



Seconds spent in
execution phase
during complete
benchmark
simulation



Looking for waste in the framework



U.S. DEPARTMENT OF
ENERGY

Office of
Science



Threading directives on inner loops



```
commListPtr => exchangeGroup % sendList
do while ( associated(commListPtr) )
  fieldCursor => field
  do while ( associated(fieldCursor) )
    exchListPtr => fieldCursor % sendList % halos(haloLayer) % exchList
    do while ( associated(exchListPtr) )
      if ( exchListPtr % endPointID == commListPtr % procID ) then
        !$omp do schedule(runtime) private(iBuffer)
          do iExch = 1, exchListPtr % nList
            ! Work to pack communications buffers
          end do
        !$omp end do
      end if
      exchListPtr => exchListPtr % next
    end do
    fieldCursor => fieldCursor % next
  end do
  !$omp master
    ! work to track iBuffer position progress during this iteration
  !$omp end master
  call mpas_threading_barrier()
  commListPtr => commListPtr % next
end do
```

Threading directives on inner loops



```
commListPtr => exchangeGroup % sendList
do while ( associated(commListPtr) )
  fieldCursor => field
  do while ( associated(fieldCursor) )
    exchListPtr => fieldCursor % sendList % halos(haloLayer) % exchList
    do while ( associated(exchListPtr) )
      if ( exchListPtr % endPointID == commListPtr % procID ) then
        !$omp do schedule(runtime) private(iBuffer)
          do iExch = 1, exchListPtr % nList
            ! Work to pack communications buffers
          end do
          !$omp end do Hundreds of implied OMP barriers here
        end if
        exchListPtr => exchListPtr % next
      end do
      fieldCursor => fieldCursor % next
    end do
    !$omp master
      ! work to track iBuffer position progress during this iteration
    !$omp end master
    call mpas_threading_barrier()
    commListPtr => commListPtr % next
  end do
```

Pull OMP directive to outer loop



```
commListPtr => exchangeGroup % sendList
commListSize = commListPtr % commListSize
!$omp do private( commListPtr, ... )
  do listItem = 1, commListSize
    commListPtr => exchangeGroup % sendList
    do listPosition = 2, listItem
      commListPtr => commListPtr % next
    end do
    bufferOffset = commListPtr % bufferOffset
    fieldCursor => field
    ! Same inner loop over fieldCursor
      ! Same inner loop over exchList
        ! Same loop over iExch, but no OMP directive
          ! New Inner loop over memoized size of buffer section to be copied
        ! work to track buffer position progress for this message
      commListPtr => commListPtr % next
    end do
  !$omp end do
```

Anatomy of a halo exchange



```
subroutine mpas_dmpar_exch_group_full_halo_exch(domain, groupName, iErr)
...
call mpas_dmpar_exch_group_build_buffers(domain % allFields, exchGroupPtr)
call mpas_dmpar_exch_group_start_recv(domain % dminfo, exchGroupPtr)
call mpas_dmpar_exch_group_pack_buffers(domain % allFields, exchGroupPtr)
call mpas_dmpar_exch_group_start_send(domain % dminfo, exchGroupPtr)
call mpas_dmpar_exch_group_local_exch_fields(domain % allFields, exchGroupPtr)
call mpas_dmpar_exch_group_unpack_buffers(domain % allFields, exchGroupPtr)
call mpas_dmpar_exch_group_destroy_buffers(exchGroupPtr)
...
```


Dissection of a halo exchange



```
subroutine mpas_dmpar_exch_group_full_halo_exch(domain, groupName, iErr)
...
call mpas_dmpar_exch_group_build_buffers(domain % allFields, exchGroupPtr)
call mpas_dmpar_exch_group_start_recv(domain % dminfo, exchGroupPtr)
call mpas_dmpar_exch_group_pack_buffers(domain % allFields, exchGroupPtr)
call mpas_dmpar_exch_group_start_send(domain % dminfo, exchGroupPtr)
call mpas_dmpar_exch_group_local_exch_fields(domain % allFields, exchGroupPtr)
call mpas_dmpar_exch_group_unpack_buffers(domain % allFields, exchGroupPtr)
call mpas_dmpar_exch_group_destroy_buffers(exchGroupPtr)
...
```

Replacement of a halo exchange

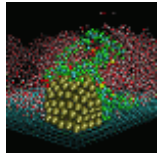
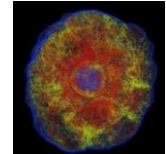
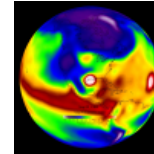
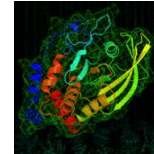
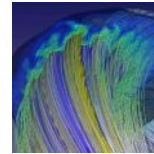
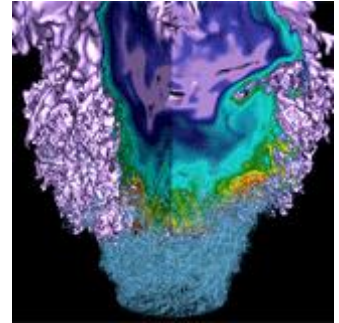


```
function ocn_forward_mode_init(domain, startTimeStamp) result(ierr)
...
call mpas_dmpar_exch_group_create(domain, 'subcycleFields')
call mpas_dmpar_exch_group_add_field(domain, 'subcycleFields', 'sshSubcycle')
call mpas_dmpar_exch_group_add_field(domain, 'subcycleFields', 'normalBarotropicVelocitySubcycle')
call mpas_dmpar_exch_group_build_reusable_buffers(domain, 'subcycleFields')

subroutine mpas_dmpar_exch_group_reuse_halo_exch(domain, groupName, timeLevel, haloLayers, ierr)
...
call mpas_dmpar_exch_group_start_recv(domain % dminfo, exchGroupPtr)
call mpas_dmpar_exch_group_pack_buffers(domain % allFields, exchGroupPtr)
call mpas_dmpar_exch_group_start_send(domain % dminfo, exchGroupPtr)
call mpas_dmpar_exch_group_local_exch_fields(domain % allFields, exchGroupPtr)
call mpas_dmpar_exch_group_unpack_buffers(domain % allFields, exchGroupPtr)
...
function ocn_forward_mode_finalize(domain) result(ierr)
...
call mpas_dmpar_exch_group_destroy_reusable_buffers(domain, 'subcycleFields')
```



Results



U.S. DEPARTMENT OF
ENERGY

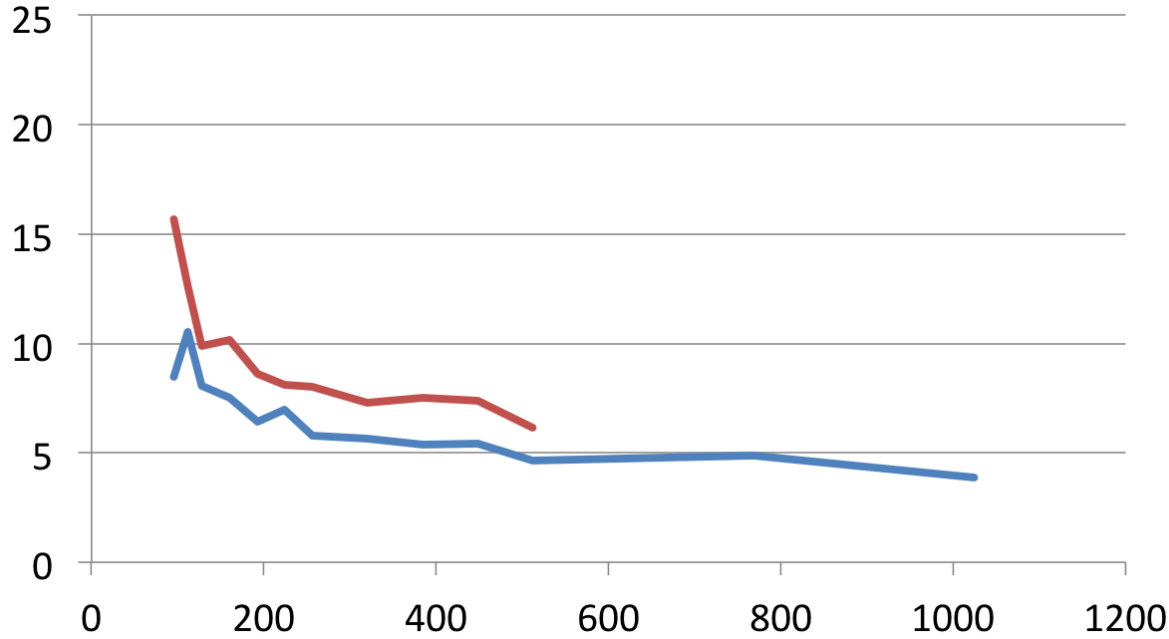
Office of
Science



KNL Initial vs. Modified: Sub Halo only



Seconds used
during Barotropic
subcycle halo
exchange phase
when running
benchmark
simulation



KNL Nodes, 68 Cores each, initial codebase

KNL Nodes, 68 Cores each, modified codebase

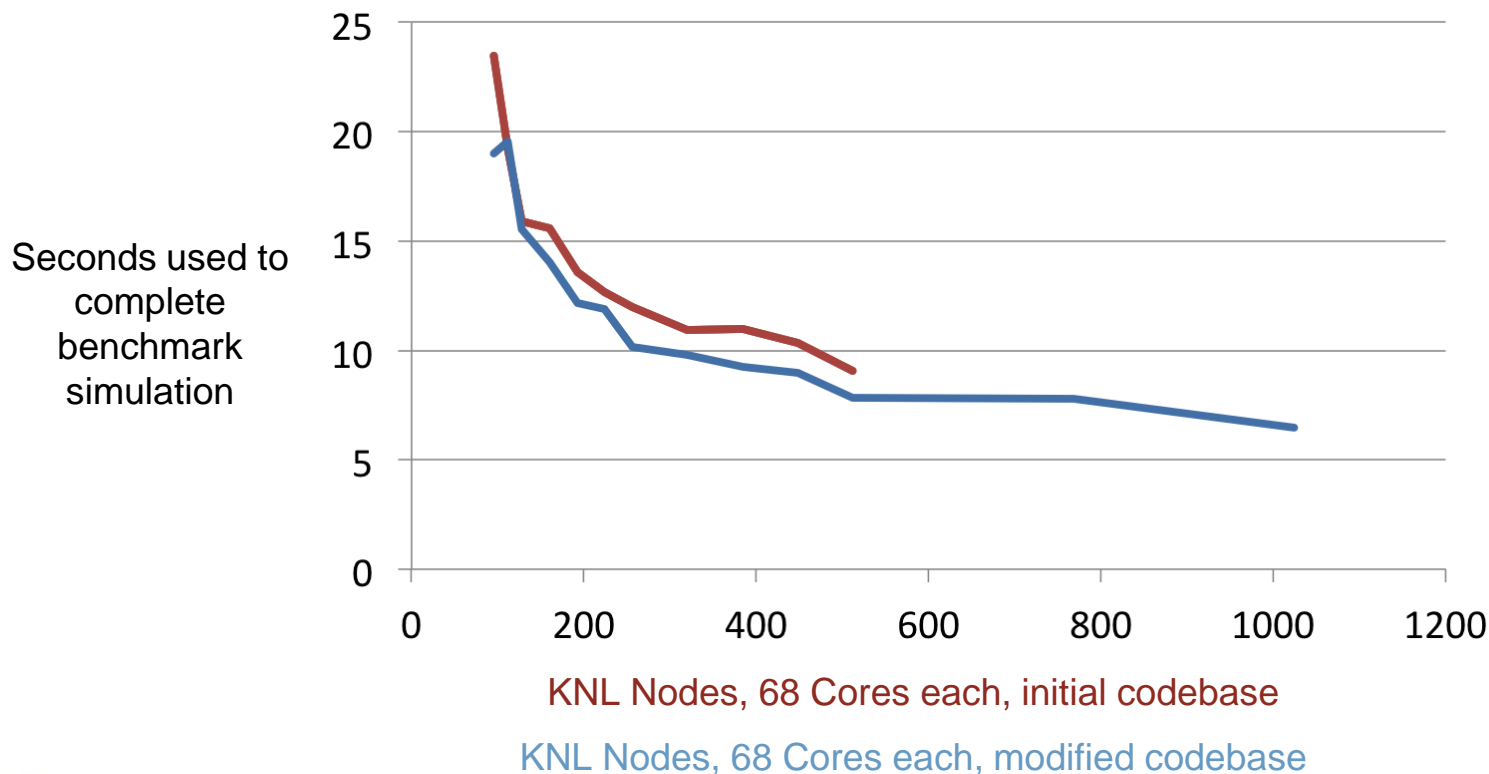


U.S. DEPARTMENT OF
ENERGY

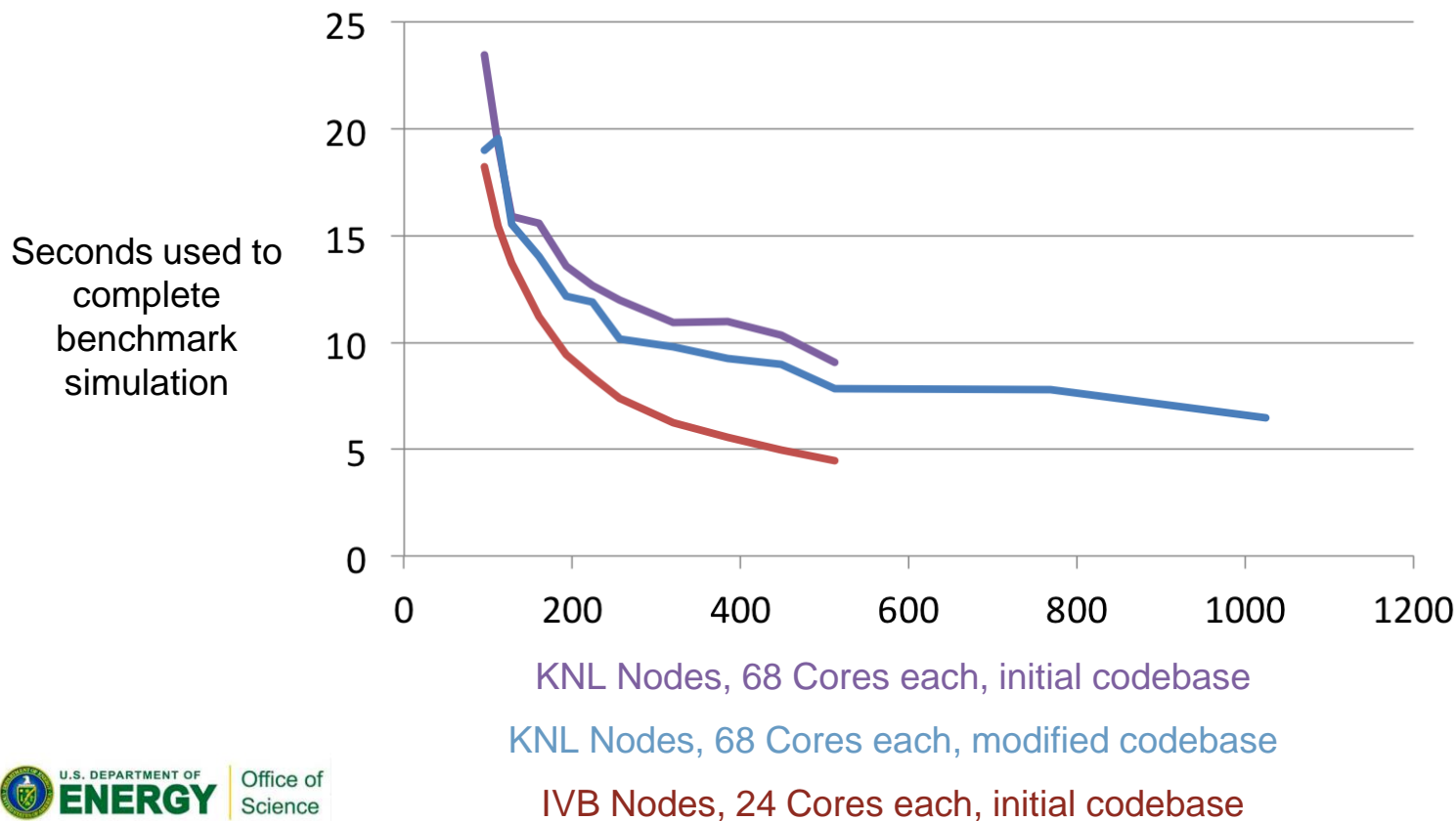
Office of
Science



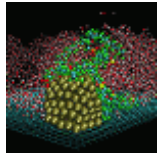
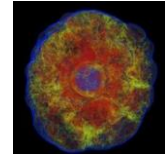
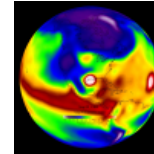
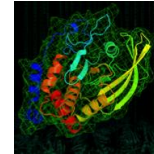
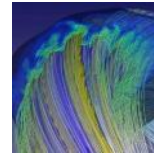
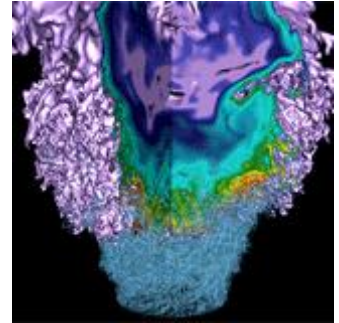
KNL modified vs. initial



KNL modified vs. IVB



Conclusions



U.S. DEPARTMENT OF
ENERGY

Office of
Science



- Performance goal: Failed
 - Needed 2x speedup on KNL to match IVB performance
 - Only achieved 1.15x speedup
 - E³SM only runs 3% faster
 - IVB best configuration doesn't use threading so no gain there
- Explain why it is slower on KNL.
 - Need much better threading.
 - 210 serial thread sections in framework code
 - KNL needs more processes per node, which inflates total message packing for halo exchanges, which overwhelms memory system

If I had a million FTEs I would...



- **Extend framework to address negative halo layers, use to overlap compute and communication**
- **Build a mapping and add some extra loops to pack halo exchange messages during compute**
- **Every framework data structure should not be a linked list**
- **Follow up on potential from deeper halo exchanges:**
 - **Modify configurations to support different halo sizes for different fields -OR-**
 - **Adapt entire ocean core (and the others) to support deeper halo exchanges**

Credit to:



- **Mark Peterson – Los Alamos National Lab**
- **Philip Jones – Los Alamos National Lab**
- **Sam Williams – Lawrence Berkeley National Lab**
- **Leonid Oliker – Lawrence Berkeley National Lab**
- **Noel Keen – Lawrence Berkeley National Lab**
- **Brian Friesen – NERSC**
- **Helen He - NERSC**
- **The NESAP program at NERSC**



Thank You