

# **Legion Bootcamp: Partitioning**

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## **Legion Partitioning**



- Partitioning Overview
- Index Spaces vs. Logical Regions
- Partitioning Operations
- Performance
- Current Status
- Related Features

## **Partitioning Overview**



- Partitioning is essential for exposing parallelism and limiting data movement
- Want to be able to describe data used by a task as precisely as possible
  - i.e. maximize expressivity
- Also want to be able to compute and work with partitions as efficiently as possible
  - Optimization requires the ability to analyze the operations
- Unavoidable tradeoff between expressivity and tractability of analysis
  - Have to choose some point on the spectrum

#### **One Extreme: Simplicity**



- PGAS languages (e.g. X10, UPC, Chapel) generally provide only simple array-based distribution methods
  - e.g. block, cyclic, blockcyclic

#### Pros:

- simple for programmer to describe
- simple for compiler to verify consistency
- simple for runtime to implement

#### Cons:

- no support for irregular (or even semi-regular) data structures
- no support for irregular partitions of structured data
- no support for aliased or multiple partitions

#### Other Extreme: Expressivity



- Old Legion partitioning used general-purpose coloring object for ALL partitioning operations
  - Application able to color each element any way it wants

#### Pros:

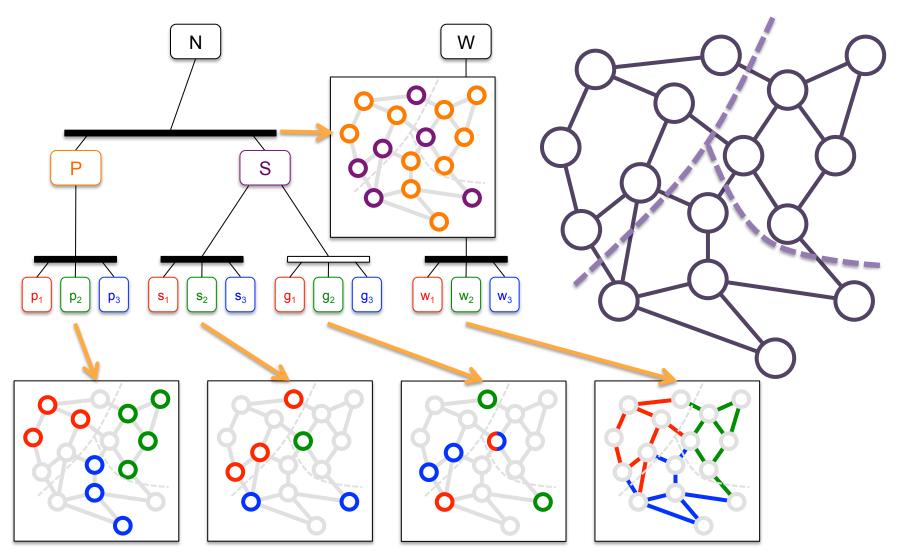
- support for arbitrary irregularity in data and/or partitioning
- support for aliased partitions, multiple partitions

#### Cons:

- significant programmer effort to describe even simple partitions
- no ability for compiler to check that related regions are partitioned consistently
- high runtime overhead for computing and querying partitions
- manipulation of coloring was serial, limited to single node

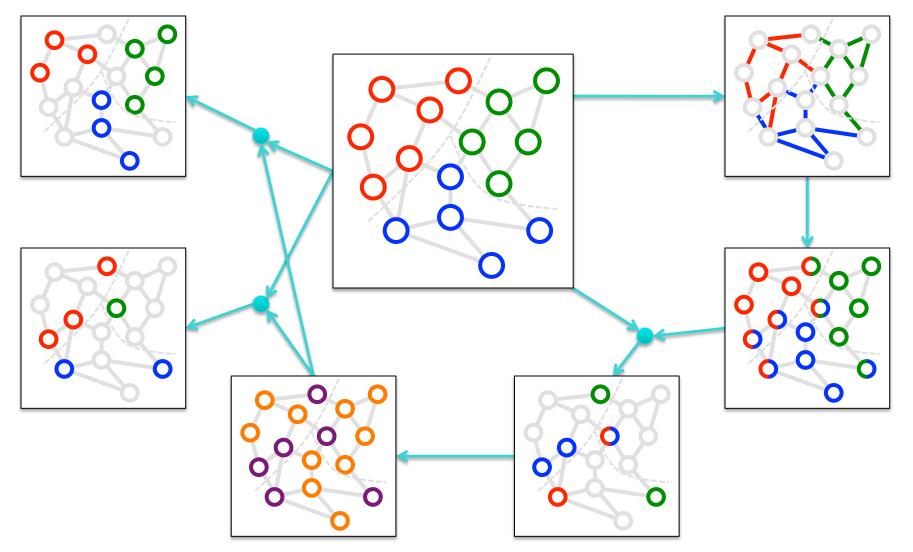
# **Circuit Partitioning: Old**





#### **Circuit: Behind the Scenes**





## **Dependent Partitioning**

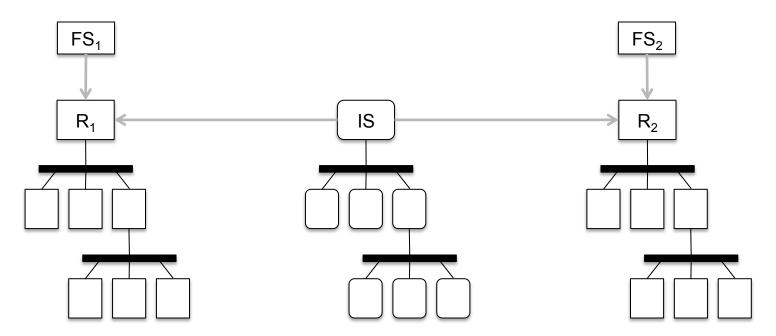


- A carefully chosen middle ground between these two extremes
- Allows arbitrary independent partitions to be computed by the application
  - But uses field data to capture intent rather than a coloring
  - Index-based partitions cover PGAS-like simple cases
- Provides an analyzable set of operations to compute dependent partitions from other partitions
  - Based on reachability and/or set operations
  - Consistency of dependent partitions can be verified at compile time
- Incorporated into Legion's data and execution model
  - Support for distributed partitioning, deferred execution

## Index Spaces vs. Logical Regions



- A logical region is constructed from an index space and a field space
- Partitioning a logical region is actually partitioning the index space
- Partitions are usable in other regions using the same index space
- C++ API has calls to move between corresponding nodes in region, index space trees
- Regent lets you use regions any place an index space is expected



## **Partitioning Operations**

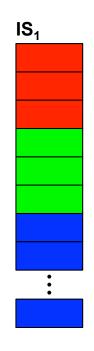


	Independent Partitions	Dependent Partitions
Index-Based	equal	restriction
	weighted	
Field-Based	filter	image
		preimage
Set Operations		union
		intersection
		difference

## **Index-Based: Equal Partition**



- Splits an index space into roughly equal pieces
- Number of pieces specified with a second index space
  - One subspace for each point in that space
- Useful for structured cases
  - Or as an initial distribution when computing an unstructured partition



	IS <sub>1</sub>	
$s_1$	$s_2$	$s_3$

IS <sub>2</sub>	
1	
2	
3	

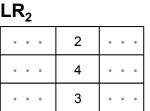
## **Index-Based: Weighted Partition**

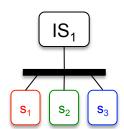


- Splits an index space into uneven pieces
- Number of pieces specified with a second index space
  - Weight for each piece specified in a field
  - Can be result of an arbitrary computation



IS <sub>2</sub>	LR <sub>2</sub>
1	• • •
2	
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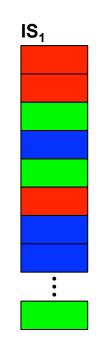




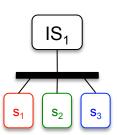
## Field-Based: Filtering



- Use a field's content as the "color" of an element
  - "Color" is now a point in some index space
  - Allows desired partitioning to be computed in parallel/ distributed fashion
  - Like a "GROUP BY" in SQL
- Only raw field value for now
  - Soon: function compositione.g. x > 5floor(x / grid\_step)



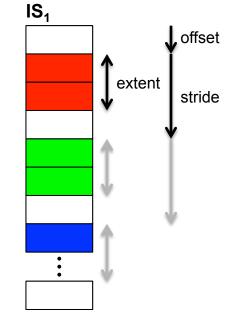
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	1	• • •
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#### Index-Based: Restriction

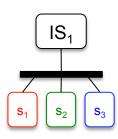


- Creates subspaces by restricting an input space to intervals in the original index type
- Number of pieces specified with a second index space
  - Each subspace has the same extent
  - Subspaces are separated by a stride, with a starting offset



IS <sub>2</sub>
1
2
3

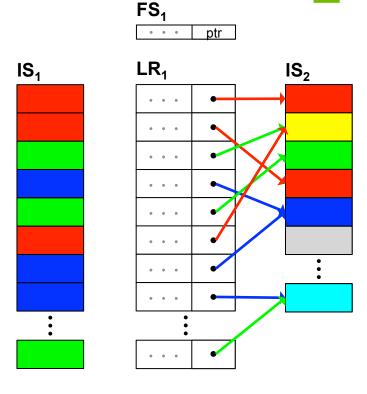
- Again most useful in structured cases
  - Also useful for chunking unstructured work

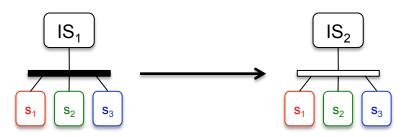


## Field-Based Ops: Image

Los Alamos NATIONAL LABORATORY EST.1943 — NVIDIA.

- Computes elements reachable via a field lookup
  - Equivalent to semi-join in relational algebra
  - Can be applied to index space or another partition
  - Computation is distributed based on location of data
- Regent understands relationship between partitions
  - Can check safety of region relation assertions at compile time



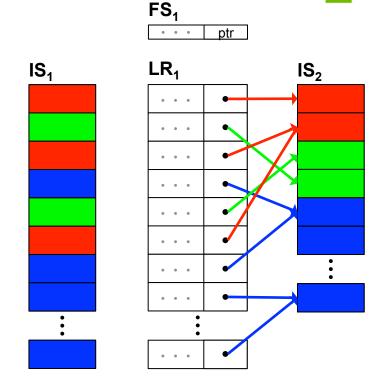


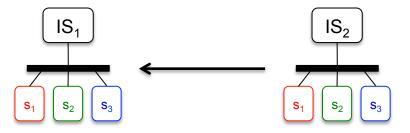
## Field-Based Ops: Preimage

Los Alamos
NATIONAL LABORATORY
EST. 1943

NVIDIA.

- Opposite of image computes elements that reach a given subspace
  - Preserves disjointness
- Multiple images/preimages can be combined
  - can capture complex task access patterns
  - Limitation: no transitive reachability





## **Set-Based Operations**

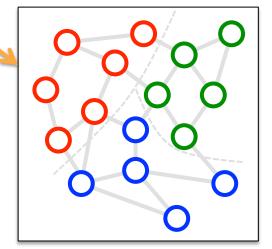


- Index spaces are sets of points, so we can compute new sets by:
  - intersection
  - union
  - difference
- Either/both operands may be a partition
  - Result is a new partition where subspace is result of operation on corresponding subspaces of inputs
- All subspaces of a partition may be reduced to a single index space by union/intersection

#### **Circuit Partitioning: New**

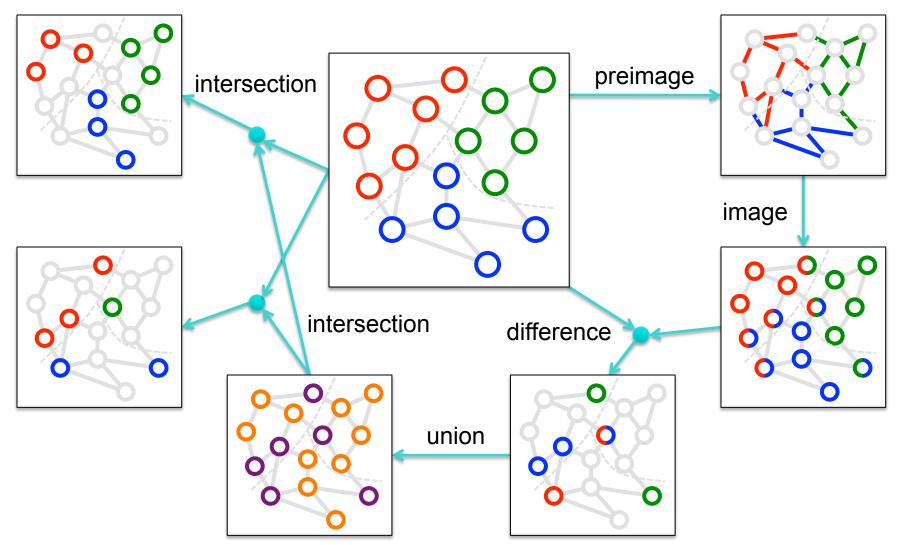


```
task simulate circuit(W : region(Node), W : region(Wire))
 where reads (W), reads (N), writes (N.part num)
 var part space = ispace(int, num subcircuits)
 parmetis(N, W, part space) // uses index-based partition internally
 // "independent" partition from parmetis' "coloring"
 var p nodes = partition(N, N.part num, part space)
 // wires partitioned by ownership of "in" node
 var p wires = preimage(W, p nodes, W.in node)
 // ghost nodes are connected to our wires but not owned by us
 var p ghost = image(N, p wires, W.out node) - p nodes
 // shared nodes are those that are ghost for somebody
 var N allshared = union reduce(p ghost)
 // private are the others
 var N allprivate = N - N allshared
 // private and shared for each circuit piece by intersection
 var p pvt = N allprivate & p nodes
 var p shr = N allshared & p nodes
```



# **Circuit: Dependent Partitioning**





## **Partitioning Implementation**



- Realm implements actual partitioning operations:
  - Makes operations available for all "users"
  - Lowest overhead for inter-node communication
  - Realm uses index spaces for instances, copy operations
  - Like other operations, use events and deferred execution

#### Legion handles:

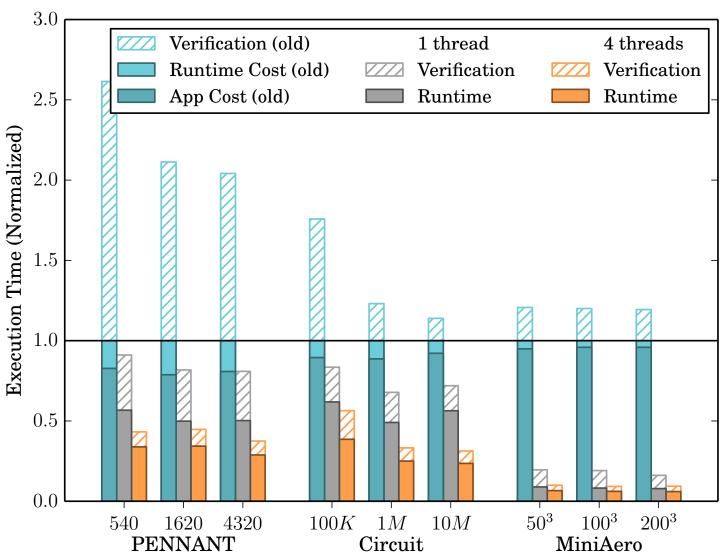
- Mapping of fields in logical regions to physical instances
- Extraction of parallelism in/around partitioning operations
- Maintains index space tree for dynamic dependence analysis

#### Regent provides:

- more productive interface
- compile-time checking of consistency of dependent partitions

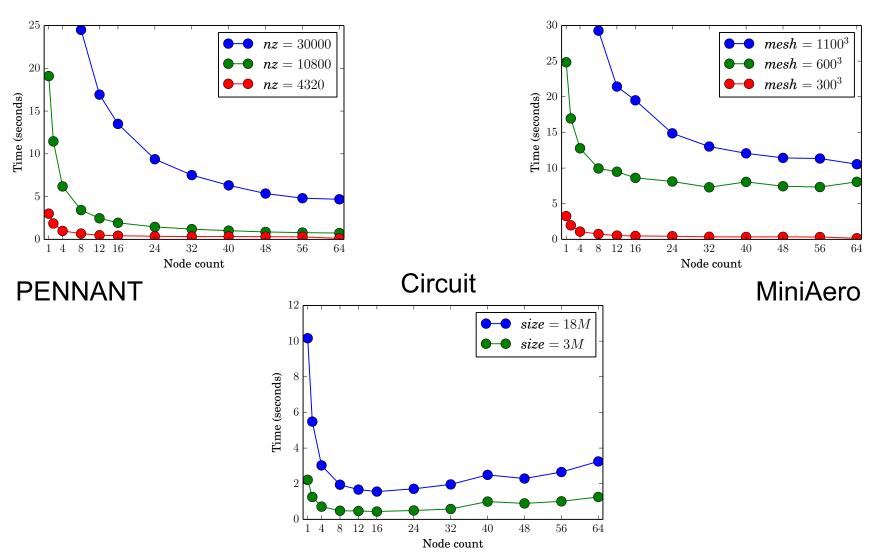
## Performance: Single Node





# Performance: Strong Scaling





#### **Current Status**



- Realm implementation nearly complete
  - Few optimizations related to multi-dimensional cases and bitmasks
- Legion API implemented, but needs a few tweaks
  - Possible change to mapper for field-based operations
- Regent updates in progress
  - Working out syntax for some cases
  - Need to incorporate static analysis into main Regent compiler
- ETA: end of Dec 2015

#### **Related Features**



- Not part of the core "dependent partitioning" effort
- Either part of the same rewrite or enabled by it
- Unification of structured/unstructured index spaces
- Changes to dynamic allocation
- Index space compaction
- Additional partitioning functionality/optimizations

#### Structured vs. Unstructured



- All index spaces will be structured
  - No more ptr\_t in C++ API (Regent may keep it)
  - Index space has a base type (e.g. int32, int64) and
  - Dimensionality (e.g. 1, 2, 3, ...)
  - Implemented using templates for speed/extensibility
- Index spaces may be sparse
  - Consisting of set of points or dense subrectangles
  - Dense index spaces are an (optimized) special case
- Coming as part of partitioning changes (Dec 2015)
  - Realm ready need to push templating into Legion API
  - May not be 100% backwards-compatible for apps

## **Dynamic Allocation**



- Index spaces are now immutable in Realm
  - Improves performance of iterators, partitioning operations
  - Interactions between alloc/free and physical instances source of continuing problems
- Alloc/free can be implemented at "user-level" using a boolean field (i.e. is\_allocated)
  - Special instance layout for boolean fields allows fast find\_first\_set and find\_first\_unset
- TBD how high up we push this (Legion?, Regent?)
  - Standard tension between programmer control and ease of use
- Working with a few test cases to weigh pros/cons
  - Iso-surface generation, particle/fluid interactions
- Hoping to settle on plan in next couple weeks
  - Implementation early next year

## **Index Space Compaction**



- Standard region instances are direct mapped arrays
  - Allows for efficient element access, iteration
  - Wastes space for sparse regions
- Hash map saves space for sparse instances
  - Extra overhead on lookup, non-linear access patterns bad
  - Sometimes explicit compaction of data is the best answer
- Partitioning operation that accepts a sparse index space and computes:
  - New (dense) index space
  - Fields that map between spaces (either/both directions)
- Support for indirect (i.e. scatter or gather) copy operations
- Also using iso-surface as driving example (ETA early next year)

## **Functions, Complex Operations**



- Partitioning operations can use (pure) functions in place of (or composed with) field data
  - Useful for dependent partitioning on structured grids
  - Even more powerful when JIT compilation is added
  - With source (or IR), static analysis of functions is possible, enabling further optimizations
- Many dependent partitions use multiple operations with intermediate values that are discarded
  - Opportunities to fuse these operations
  - Lots of work on this in the database community
- ETA later next year
  - Will benefit from having more examples of actual dependent partitioning usage