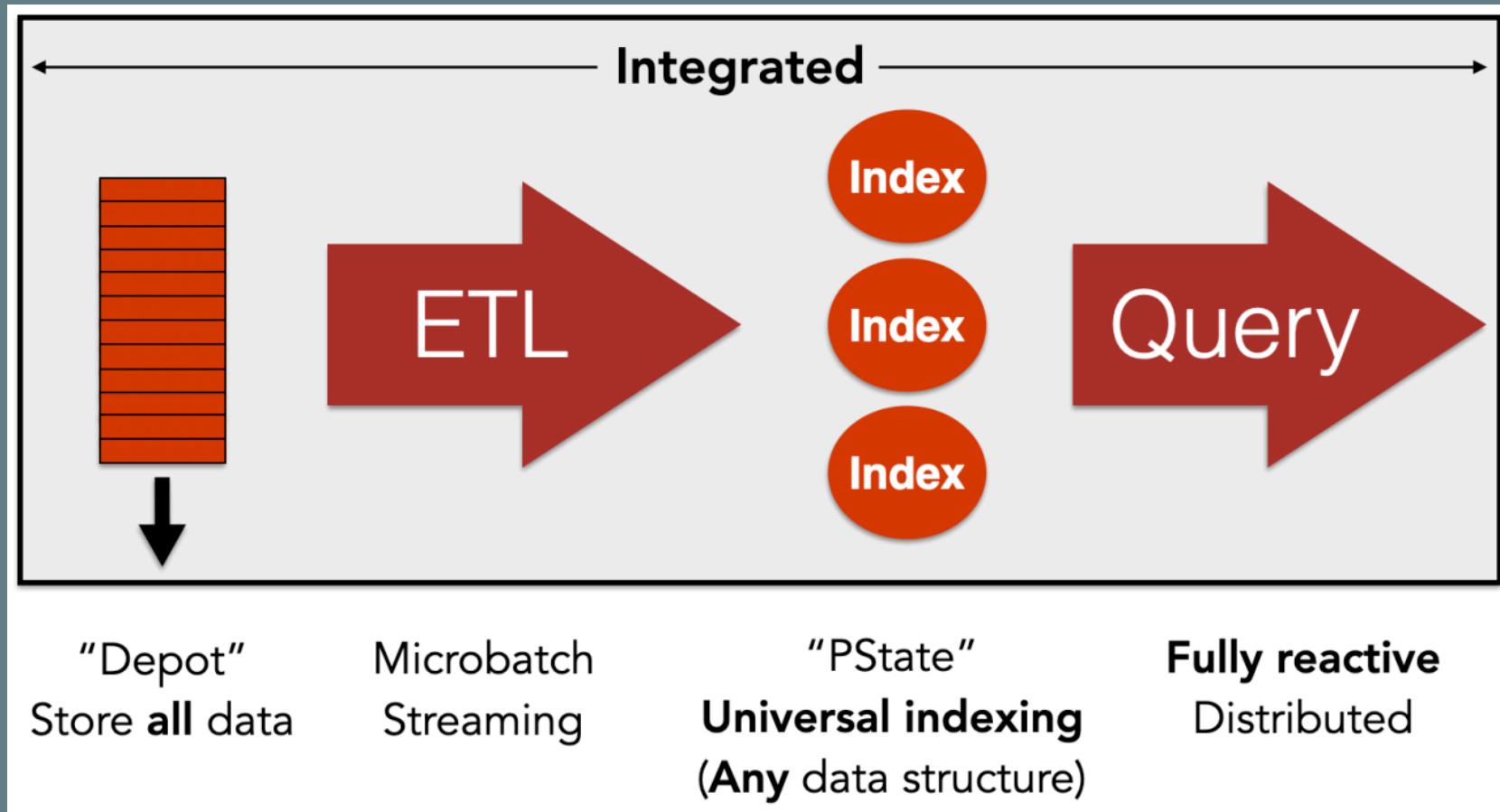


Rama workshop

Rama overview

- Platform for building end-to-end backends: ingestion, processing, indexing, and querying
- Supports both synchronous and asynchronous use cases
- Massively scalable

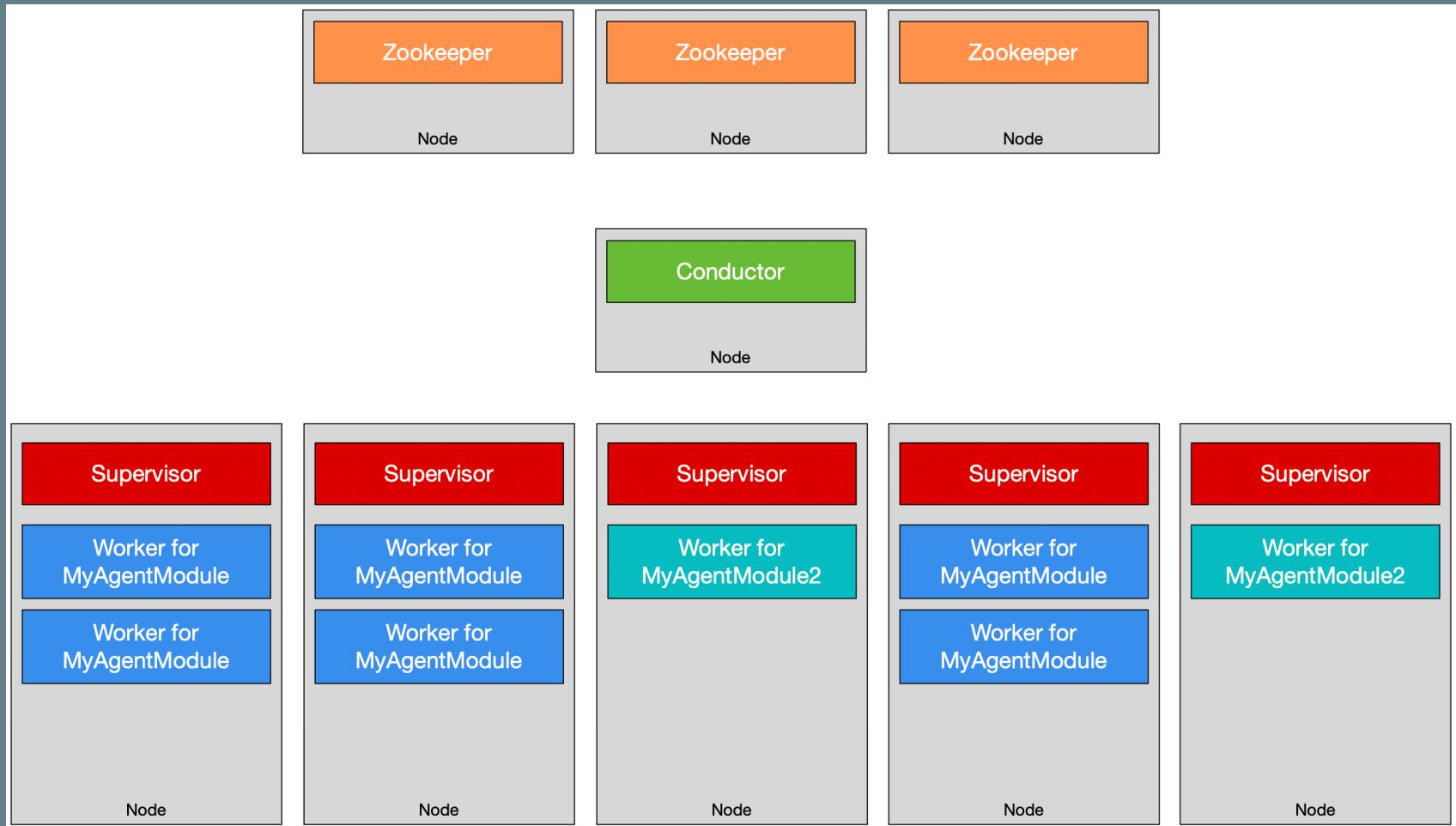
Rama overview



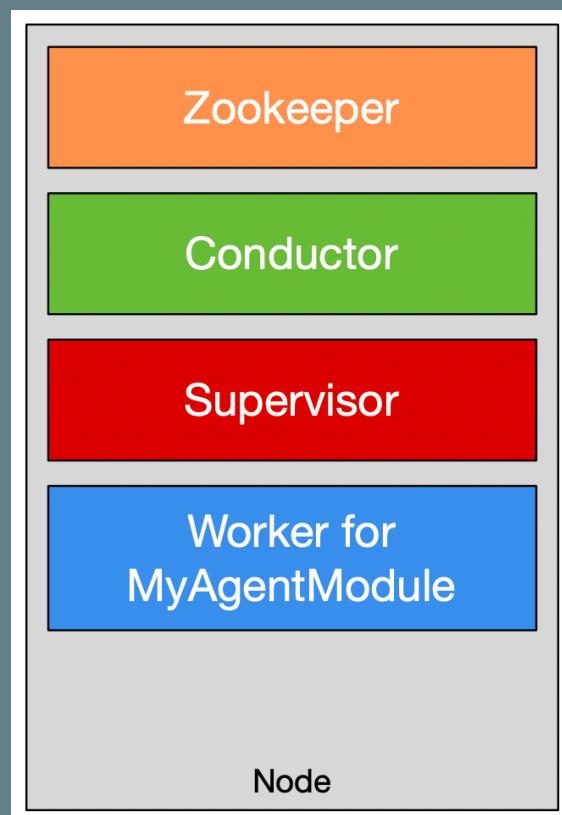
Rama overview

- Rama applications are called “modules”
- Modules contain any number of depots, ETL topologies, PStates, and query topologies
- Modules are the deployment unit onto a Rama cluster
- Rama CLI used to deploy, update, and scale modules with one line commands

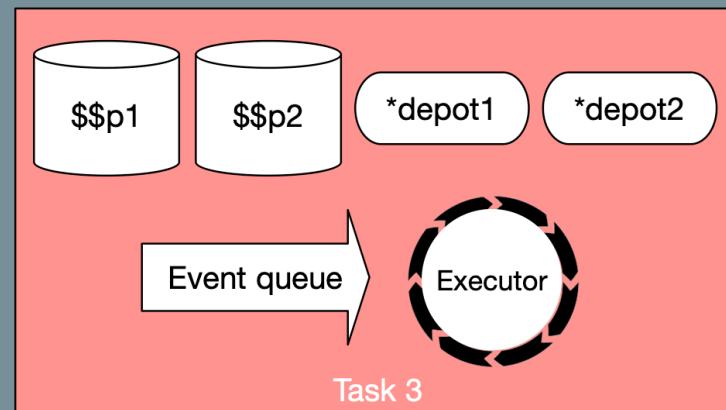
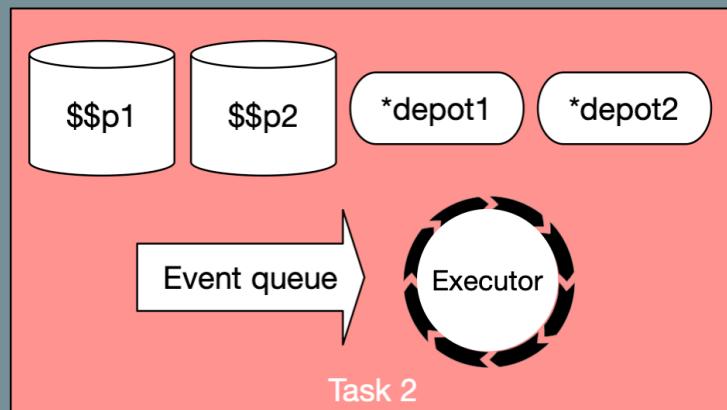
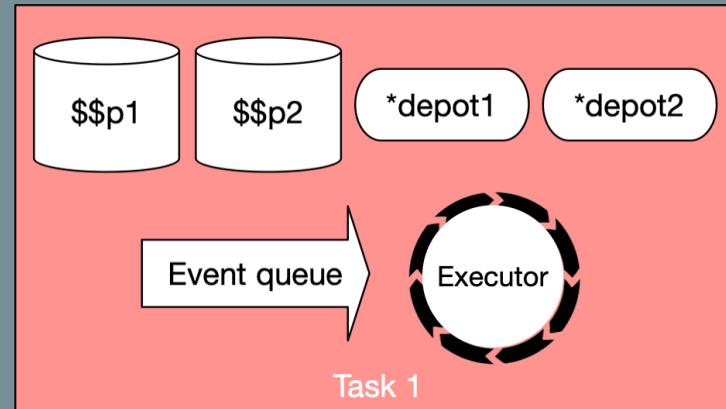
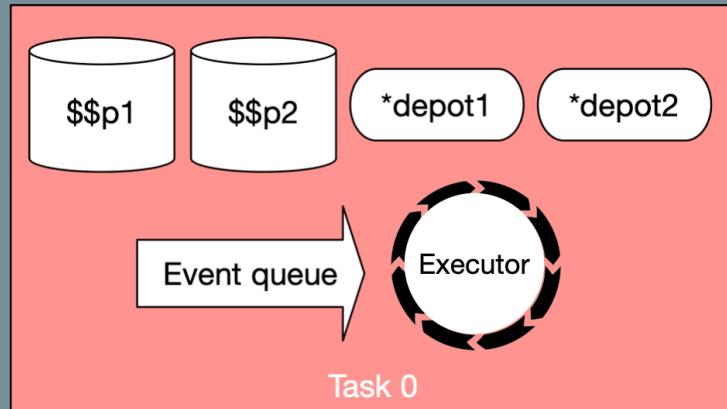
Rama overview



Rama overview



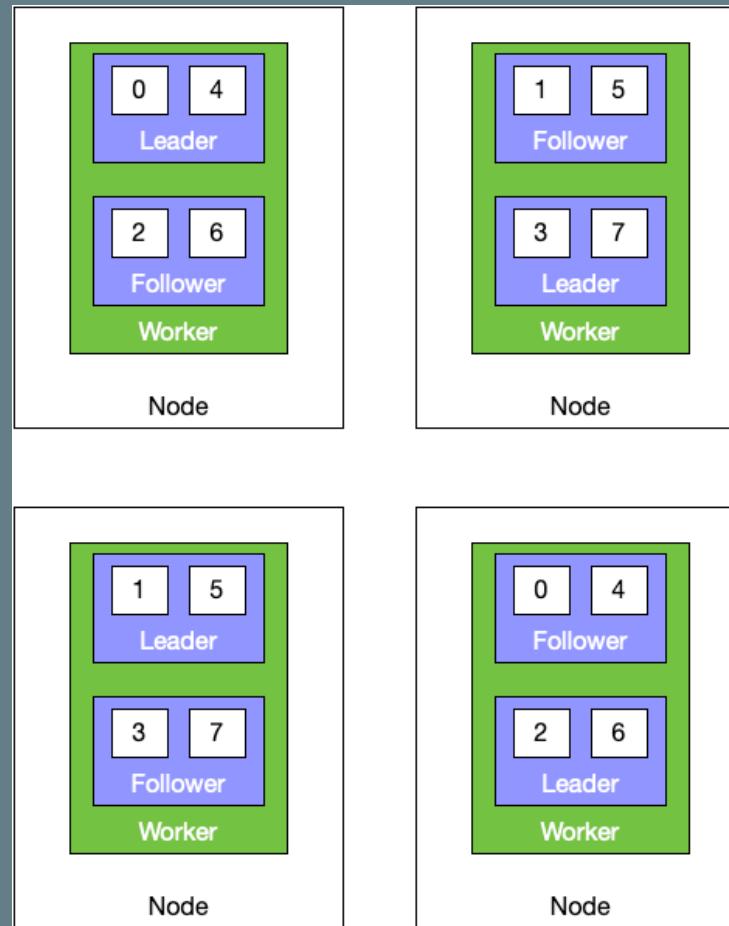
Module structure



Module structure

- Modules are deployed with a fixed number of tasks (must be power of 2)
- Each task has one partition of every depot and PState for the module
 - Except for objects defined as “global”, which are only on task 0
- Tasks run on “task threads”
- A task thread runs one or more tasks
- Task threads run inside “workers”
- Workers are assigned to nodes
- A module can be replicated

Module structure



Workshop goal

- Build the backend for an ultra-scalable collaborative todo list application
- Features:
 - User registration
 - Create and edit user profiles
 - Create new lists
 - Share lists
 - Add/remove from lists
 - Edit list items
 - Mark items as complete
 - Reorder list
 - Remove list
 - Basic analytics on user activity

Defining a module

```
(defmodule MyModule
  [setup topologies]
  ;; implementation here
  )
```

- “setup” is for depots and task globals
- “topologies” is for:
 - ETL topologies along with the PStates they own
 - Query topologies

In-process cluster (IPC)

(`rtest/create-ipc`)

- Testing/experimentation environment
- Runs full Rama cluster in process

Depots

```
(declare-depot setup *depot (hash-by :id))
```

- “Depot partitioner” routes appends to tasks
 - hash-by
 - :random
 - :disallow
 - Custom partitioners
- Option to declare as global

Depots

- (require '[workshop.depot :as depot] :reload)
- Run the code in the comment to append the 10 maps of the form
{:a <num>}
- Find the partition that has {:a 6}

Exercise

Depots

- Fill in MultiDepotModule
- Append a bunch of maps to *hash-depot with key :id
- Check depot partitions to see what data is on which partition
- Append to global depot and inspect the object info

Exercise

PStates

```
(declare-pstate
  S      Owning topology
  $$kv  PState name
  {String Long}) Schema
```

- “Partitioned state”
- Indexed datastore of any data model
- Defined as compound data structures

PStates

```
(declare-pstate
  s
  $$profiles
  {Long (fixed-keys-schema
    {:name String
     :created-at-millis Long})})
```

PStates

```
(declare-pstate
  s
  $$profiles
  {Long (fixed-keys-schema
    {:name String
     :created-at-millis Long
     :friends (set-schema Long {:subindex? true})}))}
```

PStates

```
{String {String String}}
```

VS.

```
{String (map-schema String  
String  
{:subindex? true})}
```

Main table

	{"k1" "a" "k2" "b" "k3" "c"}	
"alice"		
"bob"	{"k1" "a2" "k4" "b2"}	

Main table

			[0,"k1"]	"a"
"alice"	0		[0,"k2"]	"b"
"bob"	1		[0, "k3"]	"c"
			[1, "k1"]	"a2"
			[1, "k4"]	"b2"

Subindexing table

Subindexing

PStates

- map-schema / {}
- fixed-keys-schema
- Top-level class (value PState)
 - e.g. “Map”, “Long”
- vector-schema / []
 - Cannot be used at top-level
- set-schema / #{}
 - Cannot be used at top-level
- Use *-schema functions when need to declare as subindexed

PStates

```
(use 'com.rpl.rama)
(use 'com.rpl.rama.path)
(require '[com.rpl.rama.test :as rtest])

(def p (rtest/create-test-pstate {String Long}))
(rtest/test-pstate-transform [(keypath "a") (termval 1)] p)
(rtest/test-pstate-transform [(keypath "b") (termval 2)] p)
(rtest/test-pstate-transform [(keypath "b") (termval "v")]) p) ;; schema error
(println (rtest/test-pstate-select (keypath "a") p))
(println (rtest/test-pstate-select MAP-KEYS p))
(close! p)
```

- rtest/create-test-pstate
- rtest/test-pstate-select
- rtest/test-pstate-transform

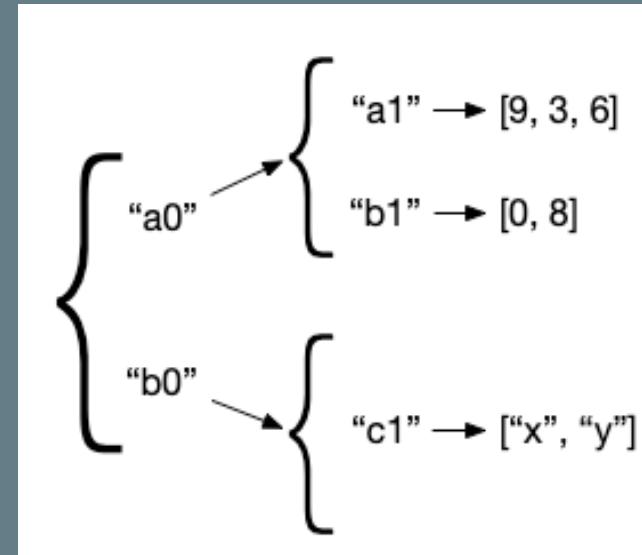
Learning helpers

PStates

- PStates are read and written to with Specter paths
- A path is a list of “navigators”
 - keypath
 - MAP-VALS
 - ALL
 - nthpath
 - pred
 - NONE-ELEM
 - AFTER-ELEM
 - set-elem
 - term
 - termval
 - NONE>

PStates

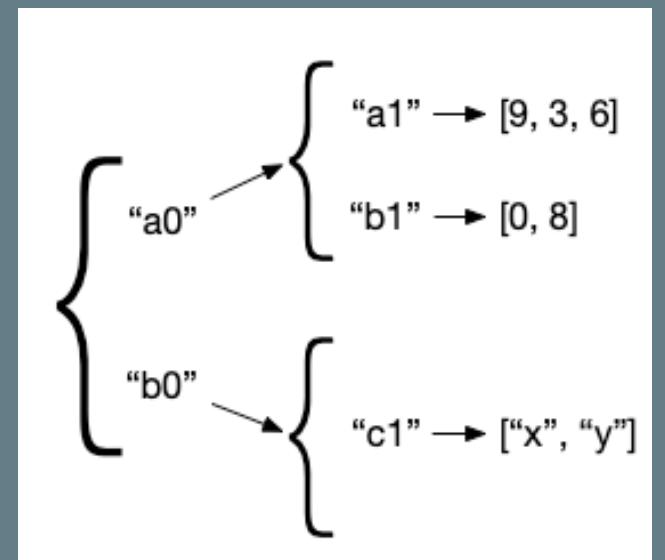
- (require '[workshop.pstate :as pstate] :reload)
- (def p (pstate/test-pstate))
- Use (rtest/test-pstate-select STAY p) to see current
- Make p have this data in it:



Exercise

PStates

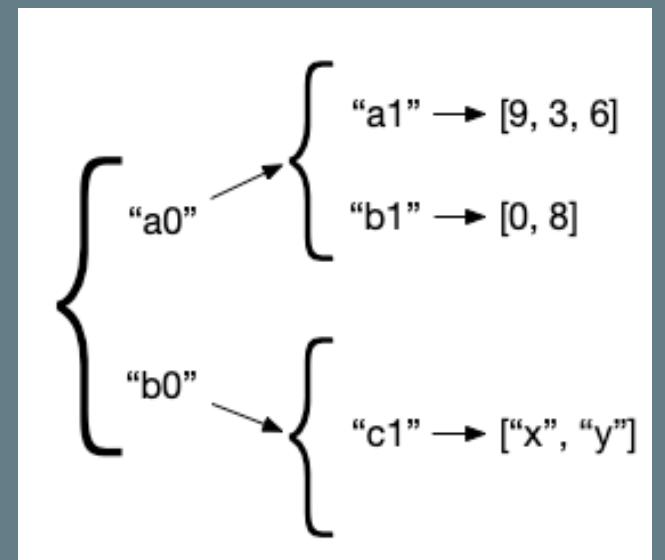
- Query for leaf values
- Query for all even numbers
- Query for keys nested one level (["a1", "b1", "c1"])
- Query for all lists with more than 2 elements



Exercise

PStates

- Remove 3
- Append “z” to list at “c1”
- Append “!” to every list
- Remove the nested key “b1”



Exercise

Dataflow

- Programmed with Rama's dataflow language
- Dataflow language is a new programming paradigm
 - Based on generalizing the concept of a function
- Exposed via macros, so it's still Clojure
- Can invoke dataflow from Clojure and vice-versa

Dataflow

```
(source> *depot :> {:keys [*op *data]})  
(<<cond  
  (case> (= *op "all"))  
  (|all)  
  (println "Running on every task")  
  
  (case> (= *op "loop"))  
  (loop<- [*i *data]  
    (<<if (> *i 0)  
      (|shuffle)  
      (:>)  
      (continue> (dec *i))))  
    (default>)  
    (|hash *data)  
    (println "Running on one task"))  
  (println "Continuation")  
  (|global)  
  (println "Running on task 0")
```

Unifies “what” with “where”

Dataflow

Enables “what” and “where” to be unified

Dataflow

- (use 'com.rpl.rama')
- (use 'com.rpl.rama.path')
- Copy/paste from workshop.dataflow

Dataflow

```
(deframafn foo []
  (:> 1))
```

Dataflow

```
(deframafn bad-foo []
  (:> 1)
  (:> 2))
```

Dataflow

```
(deframafn bad-foo []  
  )
```

Dataflow

```
(deframafn bad-foo []
  (:> 1)
  (println "B"))
```

Dataflow

```
(deframaop foo []
  (:> 1)
  (:> 2)
  (println "A")
  (:> 3))

(?<-
  (foo :> *v)
  (println "B" *v))
```

Dataflow

```
( ?<-
  (println "B" (foo)))
```

Dataflow

- Variables are symbols beginning with *, %, or \$\$
- * = “value var”
- % = “frag var”
- \$\$ = “PState var”

Dataflow

```
(deframaop foo []
  (:> 1 2 3)
  (:> 4 5 6)) )

(?<-
  (foo :> *v1 *v2 *v3)
  (println "OUT" *v1 *v2 *v3))
```

Dataflow

- Implement $\text{foo}(x, y) = (x * 10 + y * 3) * (x * 2 - y * 5)$
 - $(\text{foo } 1 \ 2) = -128$
 - $(\text{foo } 10 \ 3) = 545$

Exercise

Dataflow

```
(deframafn foo [<*>x <*>y]
  (+ (* 10 <*>x) (* 3 <*>y) :> <*>v1)
  (- (* 2 <*>x) (* 5 <*>y) :> <*>v2)
  (:> (* <*>v1 <*>v2)) )
```

Exercise

Dataflow

```
(deframafn foo [{:keys [*a *b] :as *m}]
  (println "A" *a)
  (println "B" *b)
  (println "M" *m)
  (:>))

(foo {:a 1 :b 2})
```

Dataflow

```
(deframafn foo [<*>v]
  (<<if *>
    (println "true path")
    (:> 1)
    (else>)
    (println "false path")
    (:> 2))))
```

Dataflow

```
(deframafn foo [<v>]
  (<<cond
    (case> (= *v 1))
    (println "case 1")
    (:> 1)

    (case> (= *v 2))
    (println "case 2")
    (:> 2)

    (default>)
    (println "default case")
    (:> 3))))
```

Dataflow

```
(deframafn foo [<*>]
  (<<if (> *<*> 100)
        (:> *<*>)
        (else>)
        (:> (%self (* 2 *<*>))))))
```

Exercise

- Implement recursive version of $\text{fib}(n)$
 - $\text{fib}(0) = 1$
 - $\text{fib}(1) = 1$
 - $\text{fib}(2) = 2$
 - $\text{fib}(3) = 3$
 - $\text{fib}(4) = 5$
 - $\text{fib}(5) = 8$

Exercise

Exercise

```
(deframafn fib [*n]
  (<<if (contains? #{0 1} *n)
    (:> 1)
    (else>)
    (:> (+ (%self (dec *n)) (%self (- *n 2))))))
```

Exercise

Dataflow

```
(deframaop foo [*x]
  (loop<- [*i *x :> *v]
    (<<if (>= *i 0)
      (:> *i)
      (continue> (dec *i))
    )))
  (:> *v))

(?<-
  (foo 5 :> *v)
  (println "V" *v))
```

Exercise

- Implement (explode-map *m :> *k *v) using loop<- and seq

```
user=> (?<-
#_=>  (explode-map {:a 1 :b 2 :c 3} :> *k *v)
#_=>  (println "OUT" *k *v))
OUT :c 3
OUT :b 2
OUT :a 1
nil
```

Exercise

Exercise

```
(deframaop explode-map [*m]
  (loop<- [*seq (seq *m) :> *k *v]
    (<<if *seq
      (first *seq :> [*k *v])
      (:> *k *v)
      (continue> (next *seq))))
    (:> *k *v)))
```

Exercise

Dataflow

```
(deframafn foo [*v]
  (<<ramafn %ret
    [*v2]
    (:> (+ *v *v2)))
  (:> %ret))

((foo 10) 5)
```

Dataflow

```
(deframafn foo [*v]
  (⟨⟨ramaop %ret
    [*v2]
    (:> (ops/range> 0 (* *v *v2)))))
  (:> %ret))

(?<-
  (foo 5 :> %f)
  (println (%f 2)))
```

ETL topologies

- Subscribe to depots
- Own any number of PStates
 - Only the owning topology can write to a PState
- Dataflow code that runs reactively to new data
- Change tasks with “partitioners”
- Interact with depot and PState partitions local to the current task

Stream topologies

- One-at-a-time processing model
- At-least once or at-most once semantics
- Can send information back to appenders with ack-return>

Stream topologies

- (require '[workshop.stream :as stream] :reload)
- (def m (stream/launch!))
- (foreign-append! (:depot m) (stream/->Item “a” “b”))

Stream topologies

- Do a bunch of (foreign-append! (:depot m) (stream/->Item “a” “b”))
- Query (foreign-select-one (keypath “a”) (:counts m))
- See that the counts are off

Exercise

Partitioners

- Fragment that emits asynchronously some number of times, potentially to different tasks/nodes
- Composes with any other dataflow code like any other operation

Partitioners

- (|hash *k)
- (|global)
- (|all)
- (|direct *task-id)
- (|custom afn & args)

Stream topologies

- Fill in the TODOs to fix the module
- Verify it works with foreign selects

Exercise

PStates in topologies

- local-select>
 - Emits per navigated value as opposed to emitting a list of navigated values
 - (local-select> [:a nil?] \$\$p)
 - This emits once if the value for :a is nil, and doesn't emit otherwise
 - (local-select> ALL \$\$p :> *v)
 - This emits zero or more times
 - (local-select> (subselect ALL) \$\$p :> *l)
 - This emits one list of navigated values
- local-transform>

Stream topologies

- Try (foreign-select-one ALL (:counts m))
- Foreign queries error when they don't know how to route the path
- By default routes by the key in the leading keypath
- Try (foreign-select ALL (:counts m) {:pkey "a"})

Exercise

Stream topologies

- Remove the first partitioner and fix by updating the depot partitioner
- Verify it works with foreign selects

Exercise

Todo AppModule

- Fill in data handlers one by one
- Uncomment test assertions as we go

Todo AppModule

- `CreateUser`
 - If user already exists: (ack-return> {:error “Username already exists”})
 - Otherwise, set :name and :created-at-millis for that user’s profile

Exercise

Todo AppModule

- EditProfileField
 - Set that key to that value for the user

Exercise

Todo AppModule

- `CreateList`
 - Initialize `:name`, `:created-at-millis`, and `:owners` for the list
 - Add list to the user's `:lists` key in their profile
 - `NONE-ELEM` is useful here

Exercise

Todo AppModule

- ShareList
 - No-op if user doesn't own the list
 - No-op if list doesn't exist
 - Add *to-username to the list's owners
 - Add list to *to-username's lists
 - set-elem, NONE-ELEM, and must are useful here

Exercise

Todo AppModule

- AddTodo
 - Append new TodoItem to that list
 - AFTER-ELEM and must are useful here

Exercise

Todo AppModule

- EditTodo
 - Set the value for that key in that TodoItem
 - ALL is useful here
 - This path expression is useful here:
 - (selected? :todo-id (pred= *todo-id))

Exercise

Todo AppModule

- MoveTodo
 - Move the todo with that ID to the given index in the list
 - No-op if the target index is out of bounds
 - No-op if list or item don't exist
 - Can be done in a single transform with INDEXED-VALS

Exercise

Todo AppModule

- DeleteTodo
 - Remove the todo from the list if it exists
 - Use `NONE>` as a terminal navigator to remove an element from a collection

Exercise

Todo AppModule

- RemoveList
 - Remove that user from that list's owners
 - Delete the list if there are no more owners
 - Remove that list from that user's lists

Exercise

Microbatch topologies

- Process small batches of data off of depots at same time
- Exactly-once semantics
- Higher latency than stream topologies
- Higher throughput than stream topologies
- No ack-return>
- Supports <<batch blocks

Microbatch topologies

```
(<<sources mb
  (source> *depot :> %mb)
  ;; on task 0
  (%mb :> *data)
  ;; on every task
  ;;
  ...)
)
```

Aggregation

- Serves multiple purposes:
 - Higher-level, more concise, less flexible way to write to PStates compared to paths
 - Enables huge two-phase optimization for global aggregations using combiner aggregators

Aggregation

- Common aggregations defined in com.rpl.rama.aggs
- Can define custom ones with “accumulator” and “combiner”

Aggregation

```
(require '[com.rpl.rama.aggs :as aggs])

(aggs/+count $$p)
(local-transform> (term inc) $$p)

(aggs/+vec-agg $$p "abc")
(local-transform> [AFTER-ELEM (termval "abc")] $$p)

(+compound $$p {*some-key (aggs/+count)})
(local-transform> [(keypath *some-key) (nil->val 0) (term inc)] $$p)

(+compound $$p {*some-key {*another-key [(aggs/+count) (aggs/+sum *v)]}})
(local-transform> [(keypath *some-key *another-key)
                  (nil->val [0 0])
                  (multi-path
                    [(nthpath 0) (term inc)]
                    [(nthpath 1) (term inc)])]
                  $$p)
```

Todo AppModule

- Implement analytics microbatch topology
- Use compound aggregation to write to the PState

Exercise

Deploy on real cluster

```
./rama devZookeeper &
./rama conductor &
./rama supervisor &

./rama deploy \
  --action launch \
  --systemModule monitoring \
  --tasks 1 \
  --threads 1 \
  --workers 1

./rama deploy \
  --action launch \
  --jar <path to uberjar> \
  --module workshop.todo/TodoAppModule \
  --tasks 4 \
  --threads 2 \
  --workers 1
```

Deploy on real cluster

- Open <http://localhost:8888>

Deploy on real cluster

```
./rama repl --jar <path to uberjar>

(use 'com.rpl.rama)
(use 'com.rpl.rama.path)
(require '[workshop.todo :as todo])
(def cluster (open-cluster-manager {"conductor.host" "localhost"}))
(def user-depot (foreign-depot cluster "workshop.todo/TodoAppModule" "*user-depot"))
(def profiles (foreign-pstate cluster "workshop.todo/TodoAppModule" "$$profiles"))

(foreign-append! user-depot (todo/->CreateUser "alice" "Alice Smith"))
(foreign-select-one [(keypath "alice") (submap [:name :location :created-at-millis])] profiles)
```

Module update

```
./rama deploy \
  --action update \
  --jar <path to uberjar> \
  --module workshop.todo/TodoAppModule
```

Further learning

- Dataflow
 - Multiple output streams
 - Hooks/anchors/unify>
 - Segmacros
 - Batch blocks
- Tick depots
- Query topologies
- Mirrors
- Reactivity (foreign-proxy)
- Depot and PState migrations