



Distributed Array Library

Concurrent and Distributed Processing

CC4P1 Concurrent and Distributed Programming

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Agenda

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- Project Goal
- Architecture and Design
- Implementation
- Communication Protocol
- Operation Examples
- Replication and Recovery
- Fault Tolerance
- Demonstration
- Conclusions



Project Goal

○

Develop a distributed library

- Distributed arrays: DArrayInt and DArrayDouble



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- Concurrent and parallel processing



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- Concurrent and parallel processing
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- Basic fault tolerance

Implementations

- Java 8+
- Python 3.6+
- TypeScript (Client)



System Architecture

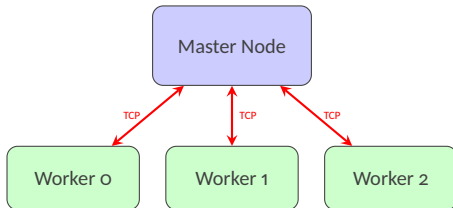
○

Master Node



System Architecture

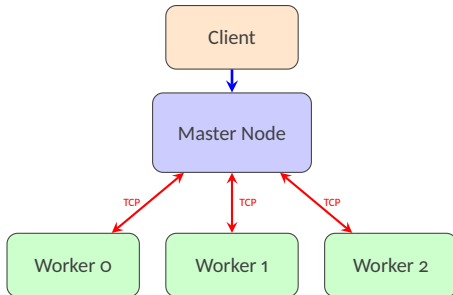
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System Architecture

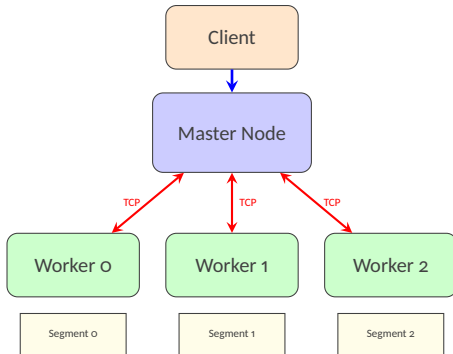
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System Architecture

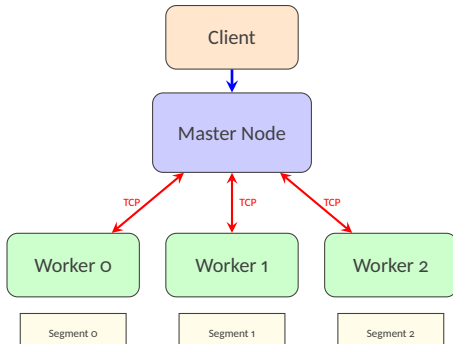
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System Architecture

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Features

- Master-worker architecture
- Automatic data distribution
- Bidirectional communication



Implementation - Structure

○

Java

- `MasterNode.java`

Python / TypeScript

- `master_node.py`



Implementation - Structure

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Implementation - Structure

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- `master_node.py`
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- `darray.py`



Implementation - Structure

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- `distributed_array_client.py`



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- `distributed_array_client.py`
- `DistributedArrayClient.ts`



Array Segmentation

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Original Array (10,000 elements)



Array Segmentation

○

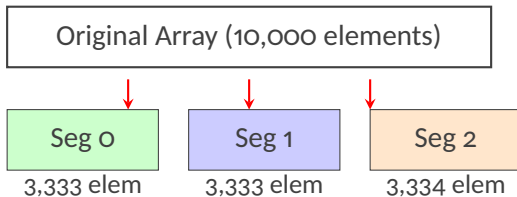
Original Array (10,000 elements)





Array Segmentation

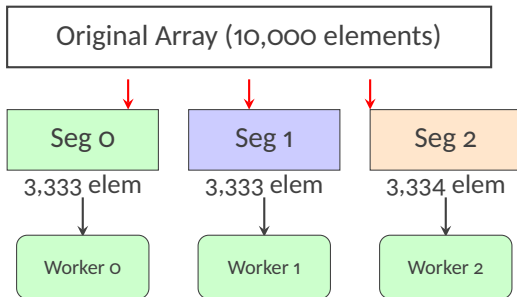
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Array Segmentation

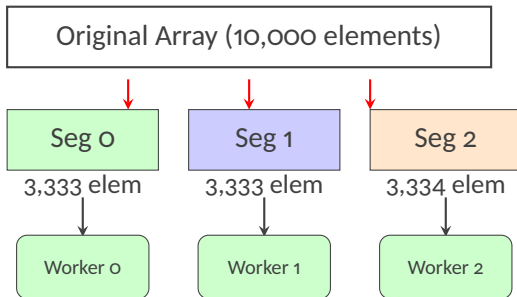
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Array Segmentation

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Segmentation Algorithm

- Equal division: $\frac{\text{total}}{\text{workers}}$
- Distributed remainder handling
- Round-robin assignment



Communication Protocol

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JSON Format

```
{  
  type: MESSAGE_TYPE ,  
  from: NODE_ID ,  
  to: NODE_ID ,  
  timestamp: 1234567890 ,  
  data: {},  
  status: OK  
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```



Communication Protocol

o

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Message Types

- REGISTER_WORKER - Worker registration



Communication Protocol

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- REGISTER_WORKER - Worker registration
- DISTRIBUTE_ARRAY - Segment distribution



Communication Protocol

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Message Types

- REGISTER_WORKER - Worker registration
- DISTRIBUTE_ARRAY - Segment distribution
- PROCESS_SEGMENT - Processing order



Communication Protocol

o

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- HEARTBEAT - Health check



Communication Protocol

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Message Types

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- REPLICATE_DATA - Segment replication



Communication Protocol

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7/22 RECOVER_DATA - Failure recovery



Parallel Processing

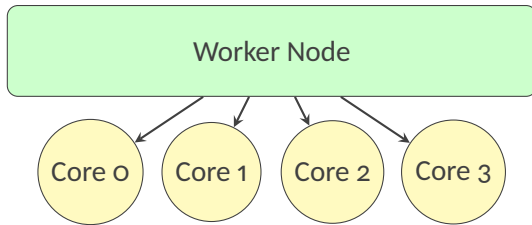
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Worker Node



Parallel Processing

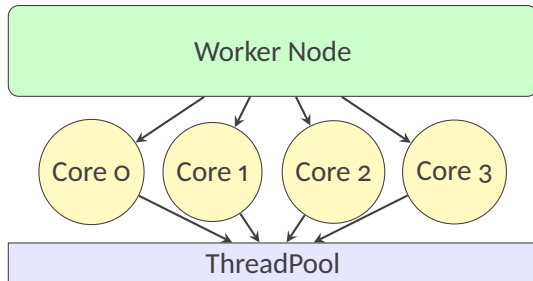
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Parallel Processing

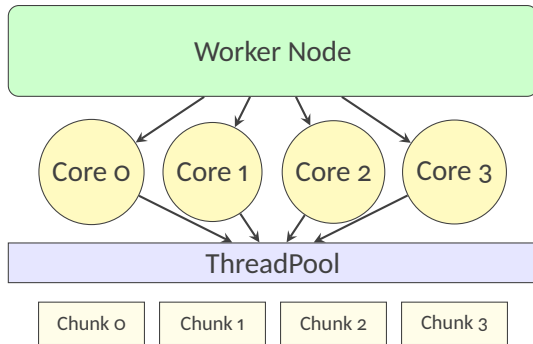
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Parallel Processing

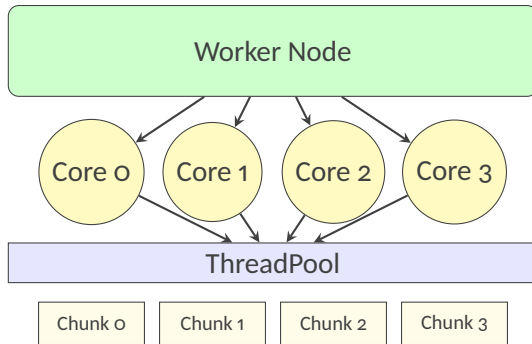
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Parallel Processing

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Strategy

- Automatic core detection: `Runtime.availableProcessors()`
- Division of the segment into chunks
- Concurrent processing with `ThreadPool`
- Synchronization using `Future<T>`



Example 1: Mathematical Operations

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Formula

$$\text{result} = \frac{(\sin(x) + \cos(x))^2}{\sqrt{|x|} + 1}$$



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Java Implementation

- Parallel processing with ThreadPool
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Java Implementation

- Parallel processing with ThreadPool
- Division of the segment into chunks
- Each thread processes its chunk independently

Python Implementation

- Use of ThreadPoolExecutor
- NumPy for vectorized operations
- Concurrent processing by chunks



Example 2: Conditional Evaluation

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Condition

If $x \bmod 3 = 0$ or $500 \leq x \leq 1000$:

$$\text{result} = (x \cdot \log(x)) \bmod 7$$



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- Conditional evaluation for each element
- Application of logarithmic transformation
- Preservation of values that do not meet the condition



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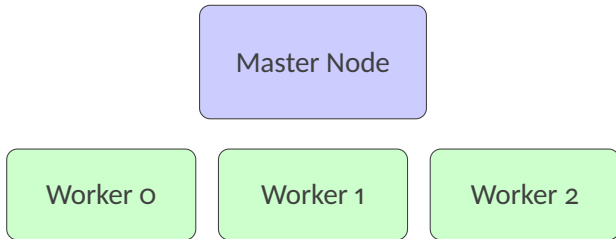
Resilience

- Exception handling per thread
- Continuation in case of partial failures
- Consolidation of valid results



Data Replication

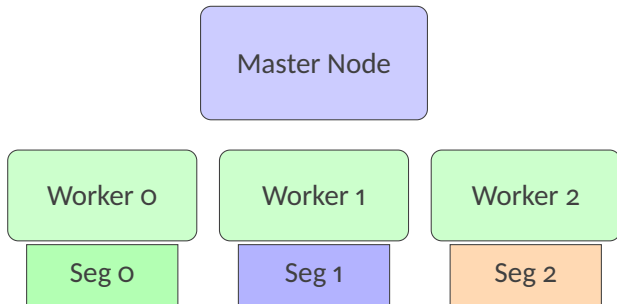
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Data Replication

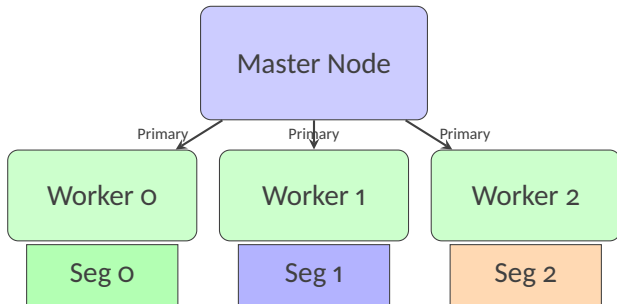
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Data Replication

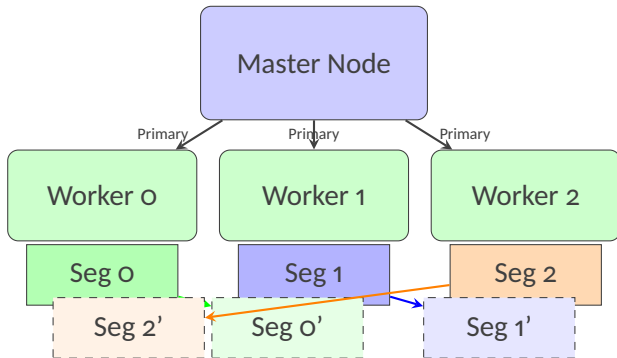
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Data Replication

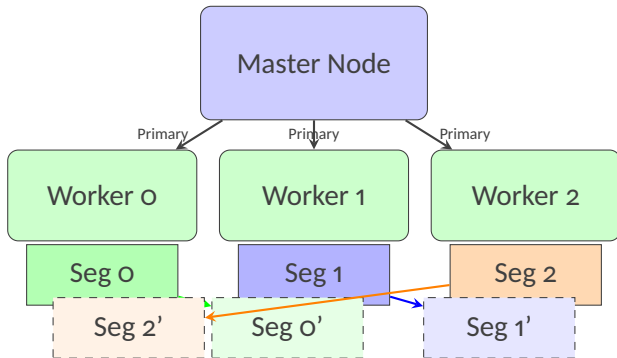
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Data Replication

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Replication factor = 2 (primary + 1 replica)



Recovery Mechanism

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Failure Detection

1. Heartbeat timeout (10s)



Recovery Mechanism

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Recovery Mechanism

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Recovery Mechanism

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Replica Promotion

1. Identify affected segments
2. Promote replicas to primary
3. Update segment mappings



Recovery Mechanism

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New Replica Creation

1. Select available workers
2. Replicate data from primary
3. Maintain replication factor

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Redistribution

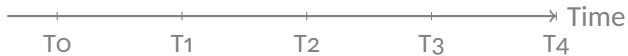
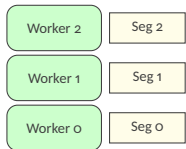
1. Balance load among workers
2. Avoid node overload
3. Optimize resource usage



Example 3: Fault Recovery

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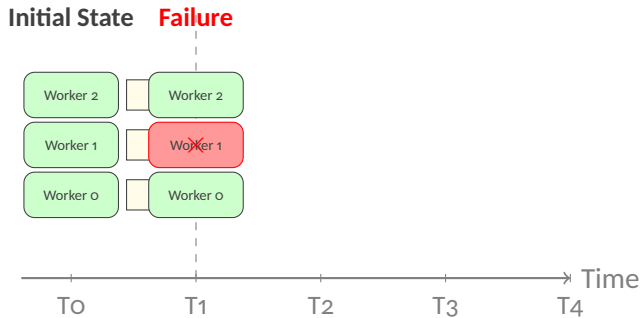
Initial State





Example 3: Fault Recovery

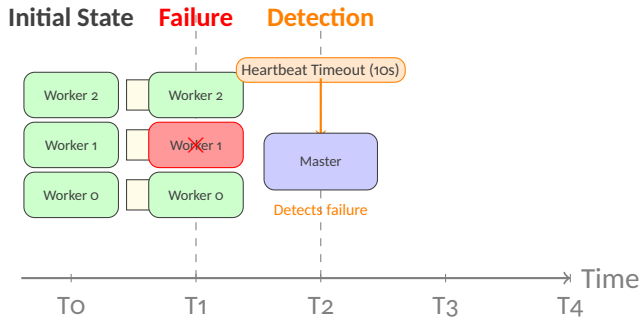
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Example 3: Fault Recovery

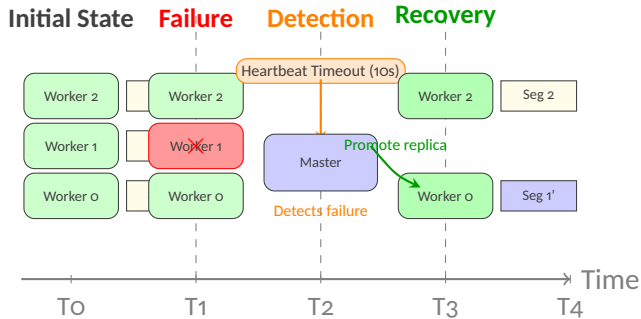
○





Example 3: Fault Recovery

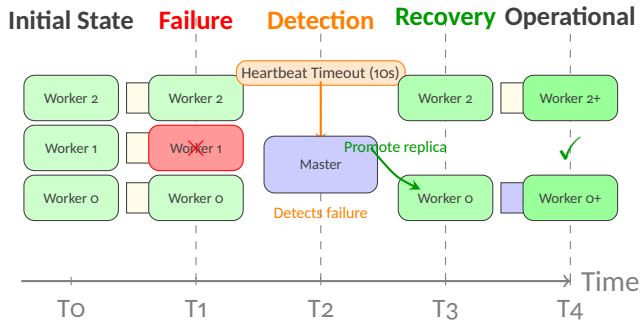
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Example 3: Fault Recovery

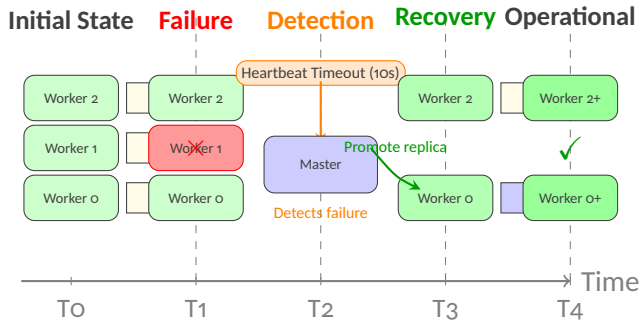
○





Example 3: Fault Recovery

○



Automatic Recovery Process

- **No data loss:** Replicas ensure data availability
- **Service continuity:** Operations continue without interruption
- **Transparent:** Client unaware of internal recovery



Demonstration - Automatic Recovery

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```
$ ./test-recovery.sh
=== Distributed Array Recovery Test ===
Starting Master node on port 5000
Starting Worker-1
Starting Worker-2
Starting Worker-3

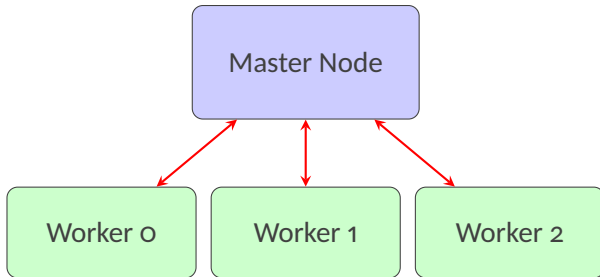
=== Creating distributed array ===
Create array response: {status:created,arrayId:myArray}
INFO: Replicated segment 0 to worker-2
INFO: Replicated segment 100 to worker-3
INFO: Replicated segment 200 to worker-1

=== Simulating Worker-2 failure ===
Worker-2 has been terminated!
WARNING: Worker worker-2 failed health check
ERROR: Handling failure of worker: worker-2
```



Fault Tolerance

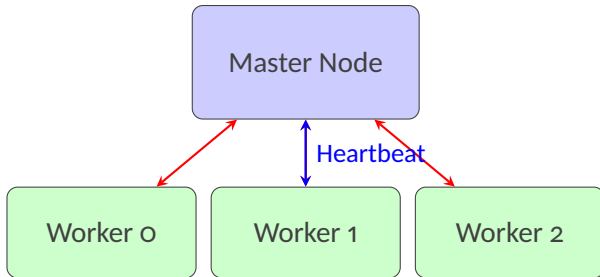
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Fault Tolerance

0



every 3s



Fault Tolerance

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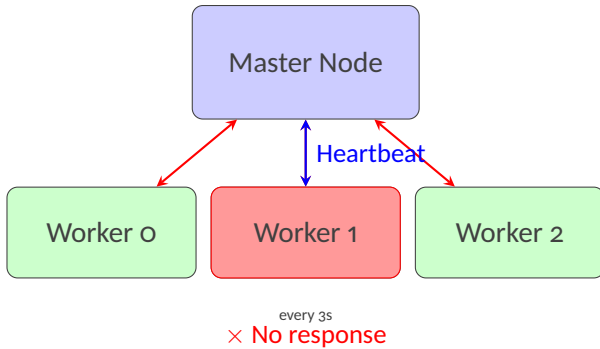




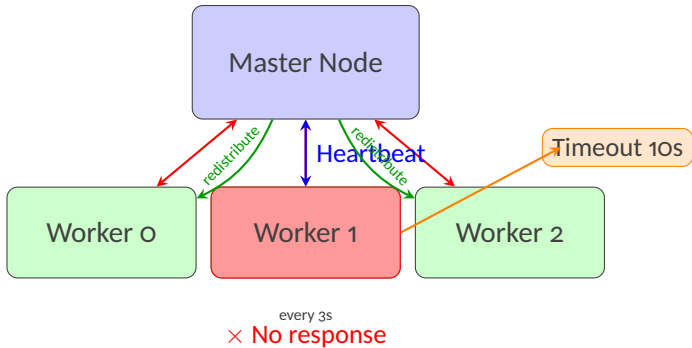
Diagram illustrating a distributed system with a Master Node and three Worker Nodes (Worker 0, Worker 1, Worker 2).

- The Master Node is at the top, connected to Worker 0, Worker 1, and Worker 2 via red arrows.
- Worker 1 is highlighted in red.
- A blue double-headed arrow labeled "Heartbeat" connects the Master Node and Worker 1.
- An orange arrow points from Worker 2 to a box labeled "Timeout 10s".
- Below the diagram, text indicates "every 3s" and "No response" (marked with a red X).



Fault Tolerance

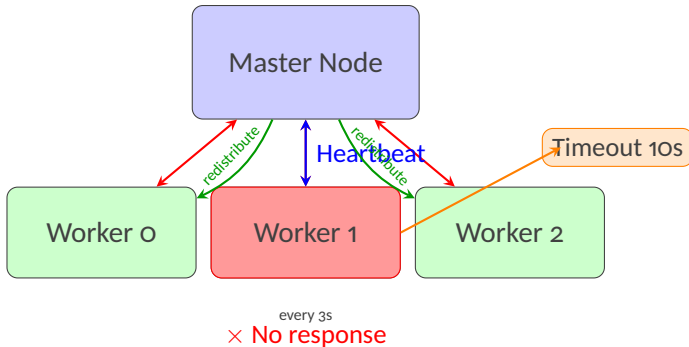
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Fault Tolerance

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Fault Tolerance System

- Heartbeat: check every 3 seconds
- Detection: 10-second timeout

15/22 Replication: factor 2 (primary + replica)



Demonstration - Cluster Start

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```
$ ./start-java-cluster.sh
Starting Java distributed array cluster...
Starting master node on port 5000...
Master node PID: 12345
Starting worker-0...
Worker-0 PID: 12346
Starting worker-1...
Worker-1 PID: 12347
Starting worker-2...
Worker-2 PID: 12348

Java cluster started successfully!
Master node running on port 5000
3 worker nodes connected
```



TypeScript Client

○

Features

- Full client in TypeScript/Node.js



TypeScript Client

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- Compatible with Java and Python clusters



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- Strong typing with interfaces

Usage Example

```
$ npm start -- localhost 5000
Connected to master at localhost:5000
Enter commands (type help for usage, exit to quit):
> create-double ts-array 5000
Create array response: {status:created}
> apply ts-array example1
Apply operation response: {status:processing}
```



Demonstration - Interactive Client

○

```
$ java -cp out:lib/* client.DistributedArrayClient localhost 5000
Connected to master at localhost:5000
Enter commands (type help for usage, exit to quit):
> create-double math-array 10000
Create array response: {type:OPERATION_COMPLETE,
  data:{arrayId:math-array,status:created}}

> apply math-array example1
Apply operation response: {type:OPERATION_COMPLETE,
  data:{status:processing}}

> get math-array
Get result response: {type:OPERATION_COMPLETE,
  data:{status:complete,result:Operation completed}}
```



System Logs

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master.log

```
INFO: Master node started on port 5000
INFO: Worker registered: worker-0 from 127.0.0.1
INFO: Worker registered: worker-1 from 127.0.0.1
INFO: Worker registered: worker-2 from 127.0.0.1
INFO: Received array creation request: math-array (10000 elements)
INFO: Array segmented: 3 segments distributed
INFO: Processing operation: example1 on math-array
```

worker-0.log

```
INFO: Registered with master node
INFO: Received double array segment: math-array with 3333 elements
INFO: Processing Example 1 using 4 threads
INFO: Completed Example 1 processing for math-array
INFO: Sent result to master
```



Performance and Scalability

○

Parallelization

- Use of all cores



Performance and Scalability

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Parallelization

- Use of all cores
- Efficient ThreadPool



Performance and Scalability

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Performance and Scalability

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Distribution

- Equal segmentation
- Asynchronous communication
- Independent processing



Performance and Scalability

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Metrics (10,000 elements)

- 1 worker: 250ms
- 2 workers: 140ms
- 3 workers: 95ms
- 4 workers: 75ms



Performance and Scalability

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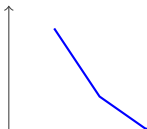
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- 4 workers: 75ms

Time (ms)





Conclusions

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Achievements

- Functional library in Java, Python, and TypeScript



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- Interoperability between languages

Applications

- Large dataset processing
- Distributed scientific calculations
- Parallel data analysis



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Questions

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Thank you for your attention

GitHub: <https://github.com/A-PachecoT/distributed-array-lib>

