

Programming Distributed Systems

12 Programming Models for Distributed Systems

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What is a Programming Model? [4]

- A programming model is some form of abstract machine
 - Provides operations to the level above
 - Requires implementations for these operations on the level(s) below
- Simplification through abstraction
- Standard interface that remains stable even if underlying architecture changes
- Provide different levels of abstraction
- Often starting point for language development

⇒ Separation of concern between software developers and framework implementors (runtime system, compiler, etc.)

Properties of good programming models

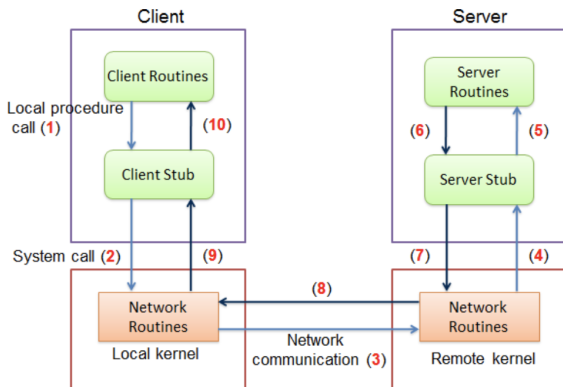
- Meaningful abstractions
- System-architecture independent
- Efficiently implementable
- Easy to understand

What kind of abstractions should a programming model for distributed systems provide?

Remote Procedure Call

Remote Procedure Call (RPC) [2]

- Rather broad classifying term with changing meaning over time
 - From client-server design to interconnected services
- *Two entities (caller/callee) with different address spaces communicate over some channel in a request-response mechanism*
- Examples: CORBA (Common Object Request Broker Architecture), Java RMI (Remote Method Invocation), SOAP (Simple Object Access Protocol), gRPC (Protocol Buffers), Twitter Finagle ...

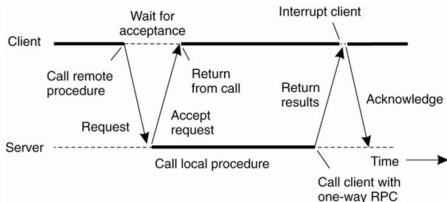


Flaws of RPC

- Location transparency (i.e. request to remote service looks like local function call) masks the potential of distribution-related failures
- RPCs might timeout, requires usually special handling such as retrying
- Local functions do not need to deal with the problem of idempotence
- Execution time is unpredictable
- Passing of objects is complex (e.g. might need to serialize referenced objects)
- Translating data types between languages might rely on semantical approximation

Aspects of modern RPC

- Language-agnostic
- Serialization (aka marshalling or pickling)
 - JSON, XML, Protocol Buffers, ...
- Load-balancing
 - SOA (Service-oriented architecture) ⇒ Microservice architectures!
- Asynchronous



⇒ RPC as term gets more and more diffuse

Futures and Promises

- “Asynchronous RPC”
- A future is a value that will eventually become available
- Two states:
 - *completed*: value is available
 - *incomplete*: computation for value is not yet complete
- Strategies: Eager vs. lazy evaluation
- Typical application: Web development and user interfaces

Example

```
interface ArchiveSearcher { String search(String target); }

class App {
    ExecutorService executor = ...
    ArchiveSearcher searcher = ...
    void showSearch(final String target)
        throws InterruptedException {
        Future<String> future
            = executor.submit(new Callable<String>() {
                public String call() {
                    return searcher.search(target);
                }
            });
        displayOtherThings(); // do other things while searching
        try {
            displayText(future.get()); // use future
        } catch (ExecutionException ex) { cleanup(); return; }
    }
}
```

From [Oracle's Java Documentation](#)

Actors and Message Passing

Characteristics of Actor Model [3]

- Actors are isolated units of computation + state that can send messages asynchronously to each other
- Messages are queued in mailbox and processed sequentially when they match against some pattern/rule
- No assumptions on message delivery guarantees
- (Potential) State + behavior changes upon message processing[1]
- Very close to Alan Kay's definition of Object-Oriented Programming

Actors in the Wild

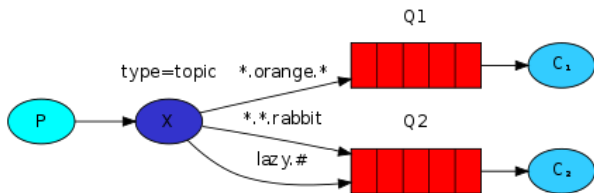
- Erlang
 - Process-based
 - Pure message passing
 - `monitor` and `link` for notification of process failure/shutdown
 - OTP (Open Telecom Platform) for generic reusable patterns
- Akka
 - Actor model for the JVM
 - Purges non-matching messages
 - Enforces parental supervision
 - Included in Scala standard library
- Orleans
 - Actors for Cloud computing
 - Scalability by replication
 - Fine-grain reconciliation of state with transactions

Message brokers

- Message-oriented middleware which stores messages temporarily and forwards them to registered recipients
- Patterns: Publish-subscribe, point-to-point
- Acts as buffer for unavailable and overloaded recipients
- Decoupling of sender and receiver(s)
- Efficient 1-to-n multicast
- Advanced Message Queuing Protocol (AMQP) standardizes queuing, routing, reliability and security
- Delivery guarantees (at-most-once, at-least-once, exactly-once)

Example: RabbitMQ

- Supports (amongst others) publish-subscribe pattern
- Typical usage: Topics as routing keys



- Q1 is interested in all the orange animals
- Q2 wants to hear everything about rabbits, and everything about lazy animals
- Messages that don't map any binding get lost
- Messages are maintained in the queue in publication order

Stream processing

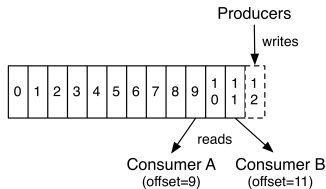
- (Infinite) Sequence of data that is incrementally made available
- Example: Sensor data, audio / video delivery, filesystem APIs, etc.
- Producers vs. Consumers
- Notions of window and time: Consumers will receive only messages after subscribing
- Here: Event stream where data item is atypically associated with timestamp

Classification of stream processing systems

- 1 What happens if producer sends messages faster than the consumer can handle?
 - Drop messages
 - Buffer messages
 - Apply backpressure (i.e. prevent producer from sending more)
- 2 What happens if nodes become unreachable?
 - Loose messages
 - Use replication and persistence to preserve non-acknowledged messages

Log-based message brokers

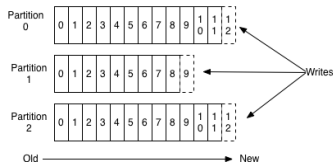
- Example: Kafka [<https://kafka.apache.org>]
- Message buffers are typically transient: Once the message is delivered, the message is deleted
- Idea: Combine durable storage with low-latency notification!



Scalability and fault-tolerance for replicated logs

- For scalability, partitioning of log on different machines
- For fault-tolerance, replication on different machines

Anatomy of a Topic



- Need to ensure same ordering on all replicas (\Rightarrow Total-order broadcast)
- Can easily add consumers for debugging, testing, etc.
- *Ideas*: Event-sourcing, immutability and audits

Batch-processing

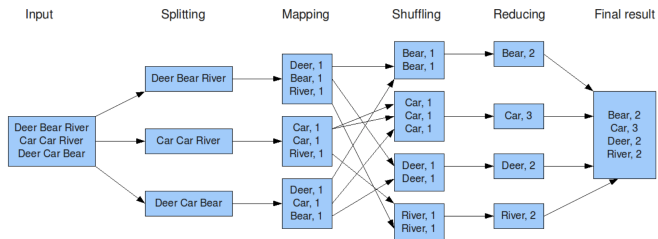
- Static data sets that has known/finite size
- Need to artificially batch data into by day, month, minute, . . .
- Typically large latencies

The Future: Distributed Programming Languages

From Model to Language

- Challenges: Partial failure, concurrency and consistency, latency, ...
- 1 Distributed Shared Memory
 - Runtime maps virtual addresses to physical ones
 - “Single-system” illusion
- 2 Actors
 - Explicit communication
 - Location of processes is transparent
- 3 Dataflow
 - Data transformations expressed as DAG
 - Processes are transparent
 - Example: MapReduce (Google), Dryad (Microsoft), Spark

Example: WordCount in MapReduce



Further reading

- [Material collection](#) by Northeastern University, CS7680 Special Topics in Computing Systems: Programming Models for Distributed Computing

Further reading I

- [1] Gul Agha. “Concurrent Object-Oriented Programming”. In: *Commun. ACM* 33.9 (1990), S. 125–141. DOI: [10.1145/83880.84528](https://doi.org/10.1145/83880.84528). URL: <http://doi.acm.org/10.1145/83880.84528>.
- [2] Andrew Birrell und Bruce Jay Nelson. “Implementing Remote Procedure Calls”. In: *ACM Trans. Comput. Syst.* 2.1 (1984), S. 39–59. DOI: [10.1145/2080.357392](https://doi.org/10.1145/2080.357392). URL: <https://doi.org/10.1145/2080.357392>.
- [3] Carl Hewitt, Peter Boehler Bishop und Richard Steiger. “A Universal Modular ACTOR Formalism for Artificial Intelligence”. In: *Proceedings of the 3rd International Joint Conference on Artificial Intelligence. Stanford, CA, USA, August 20-23, 1973*. Hrsg. von Nils J. Nilsson. William Kaufmann, 1973, S. 235–245. URL: <http://ijcai.org/Proceedings/73/Papers/027B.pdf>.

Further reading II

- [4] David B. Skillicorn und Domenico Talia. “Models and Languages for Parallel Computation”. In: *ACM Comput. Surv.* 30.2 (1998), S. 123–169. DOI: [10.1145/280277.280278](https://doi.org/10.1145/280277.280278). URL: <http://doi.acm.org/10.1145/280277.280278>.