# Parallel and Distributed Programming

## Hello! I am Diego Bonura

Mi occupo di:

- Frontend
- Backend
- Mobile
- loT
- R&D

diego@bonura.dev

https://medium.com/@diegobonura





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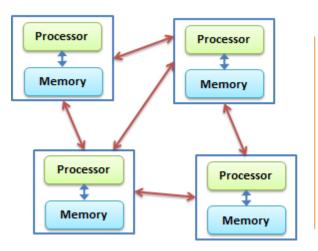




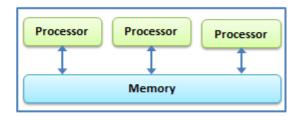
### Distribuited programming is complex

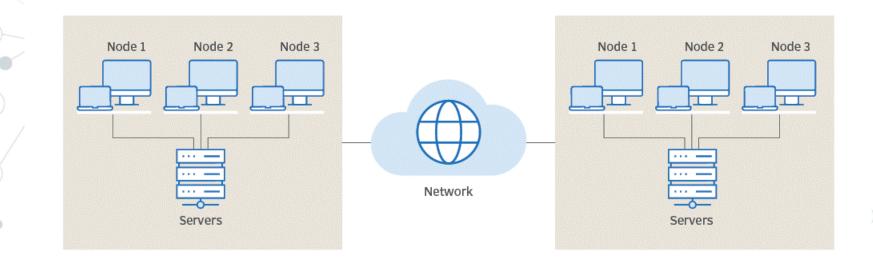
## Use only on complex applications

#### **Distributed Computing**



#### **Parallel Computing**





#### Why?

#### **Performance**

- Maintains System Performance During High Demand Periods
- Adapts to the Increase/Decrease Workloads and User Demands

#### Scalability

Boosts Performance and Utilization through Collaboration

#### Resilience

Ensures System Continuity in the Face of Failures

#### Redundancy

 Enhances User Experience with Geographically Distributed Systems

https://youtu.be/CZ3wluvmHeM?si=eHIQEqZkHpZWhHDm&t=604

#### How?

#### Main types:

- Cluster Computing
  - https://www.mongodb.com/basics/clusters
  - <u>https://www.elastic.co/guide/en/elasticsearch/refere</u> <u>nce/current/high-availability.html</u>
- Grid computing
  - <u>https://en.wikipedia.org/wiki/Great\_Internet\_Mersen</u>
     <u>ne\_Prime\_Search</u>
  - https://en.wikipedia.org/wiki/SETI@home
- Cloud computing
  - <u>https://www.linkedin.com/pulse/how-cloud-</u>
     <u>computing-made-netflix-possible-keimo-edwards/</u>
  - <u>https://cloudacademy.com/blog/aws-reinvent-</u> <u>netflix/</u>
  - Peer-2-Peer Torrent Bitcoin

#### Example of complex system?

Two of Twitter's main operations are:

Post tweet

• A user can publish a new message to their followers (4.6k requests/sec on average, over 12k requests/sec at peak).

Home timeline

• A user can view tweets posted by the people they follow (300k requests/sec)....

• ....

**Continue to book «Designing Data-Intensive Applications» page 11** 



#### Main agenda

- Object oriented programming (message passing)
- Async programming
- In-process / out-of-process programming
- **Distributed programming** 
  - Message brokers
  - O Actor Model
  - Serialization
  - Transaction
  - Saga
  - Idempotent operations
  - O Stream processing
  - Event sourcing
  - Deploy a distributed application
  - Infrastructure as code
  - Update and maintain
  - Observability

#### How to start?



#### https://visualstudio.microsoft.com/it/vs/community/

or







https://code.visualstudio.com/

https://marketplace.visualstudio.com/items?itemName= ms-dotnettools.csdevkit

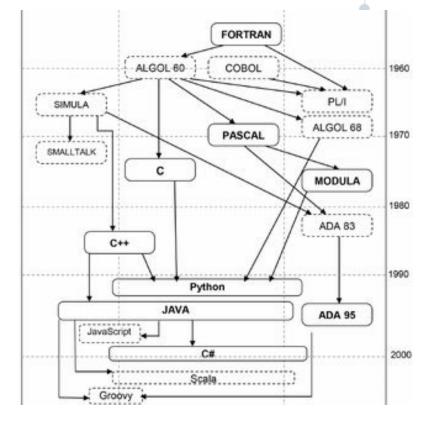
#### How to start?



#### https://github.com/meriturva/Parallel-and-Distributed-Programming



#### **Message Passing**



Smaltalk: A *message* is simply a method call on an object. Smalltalk messages are perfectly synchronous (the caller waits for the callee to return a value), and not terribly different then function/method calls in other languages.

https://www.researchgate.net/publication/260447599\_A n\_Evaluation\_Framework\_and\_Comparative\_Analysis\_ of the Widely\_Used\_First\_Programming\_Languages

#### Message Passing

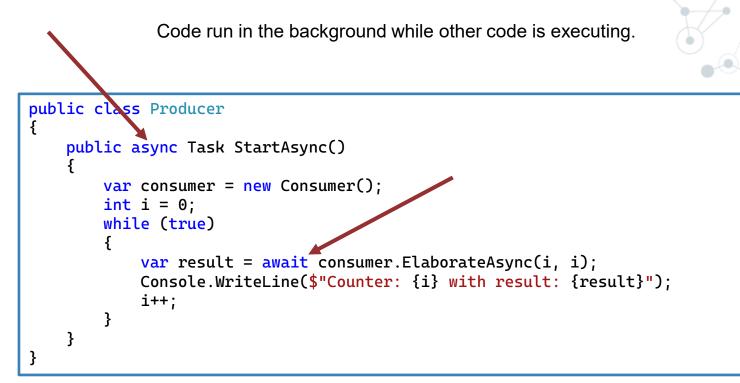
Message passing is a technique for invoking behavior

```
public class Producer
{
    public void Start()
    {
        var consumer = new Consumer();
        int i = 0;
        while (true)
        {
            var result = consumer.Elaborate(i, i);
            Console.WriteLine($"Counter: {i} with result: {result}");
            i++;
        }
    }
}
```

Example project: 01 MessagePassing

https://en.wikipedia.org/wiki/Message\_passing

#### Async programming



#### Example project: 02 AsyncAwait

On the C# side of things, the compiler transforms your code into a state machine that keeps track of things like yielding execution when an await is reached and resuming execution when a background job has finished.

https://devblogs.microsoft.com/dotnet/how-async-await-really-works/#async/await-under-the-covers

https://learn.microsoft.com/en-us/dotnet/csharp/asynchronous-programming/async-scenarios

#### Async programming (on single thread)

JavaScript is a single-threaded language!

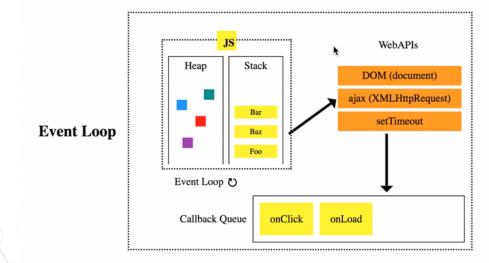
```
async function doWork()
```

```
console.log("frist");
await wait(1000);
console.log("second");
```

```
doWork();
```

{

https://developer.mozilla.org/en-US/docs/Web/JavaScript/Reference/Statements/async\_function

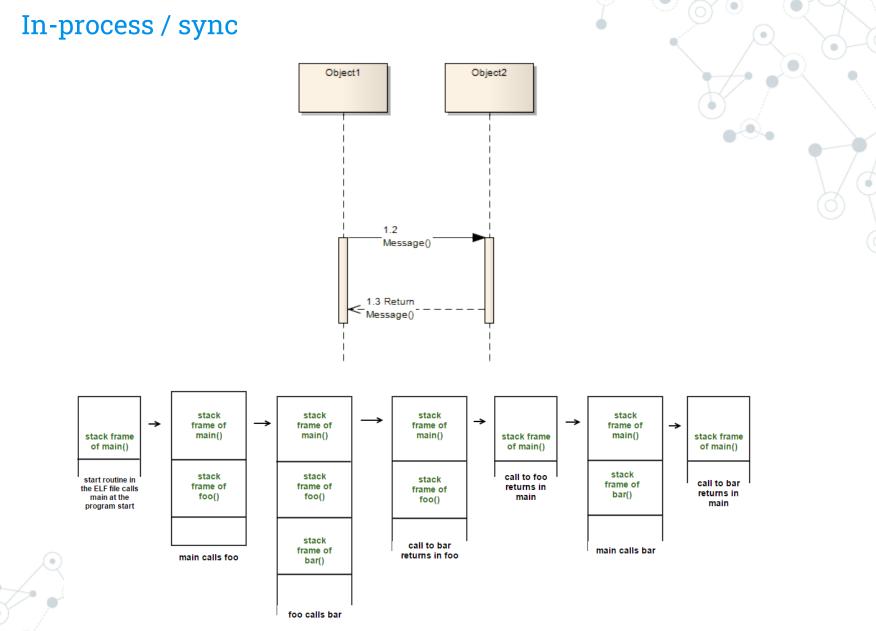


https://www.youtube.com/watch?v=8aGhZQkoFbQ

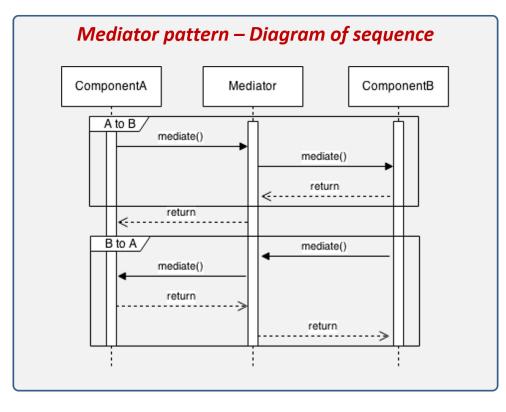
#### **Javascript – Callback and Promise**

*	loupe				he
1	Save + Run				
2		Call Stack	Web Apis		
3 +	<pre>function printHello() {</pre>				
4	<pre>console.log('Hello from baz');</pre>				
5	}				
6					
7 -	<pre>function baz() {</pre>				
8	<pre>setTimeout(printHello, 3000);</pre>				
9	}				
10					
11 -	function bar() {				
12	baz();				
13	}				
14					
	function foo() {				
16	bar();	L	L		
17	}				
18		🍝 🔶			
19	foo();				
Click	c me! Edit	Callback Queue		•	
				<b>⊳</b>	
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		https://latentflip.com/loupe/			

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#### In-process / sync with mediator pattern



Objects no longer communicate directly with each other, but instead communicate through the mediator. This reduces the dependencies between communicating objects, thereby reducing <u>coupling</u>.

https://en.wikipedia.org/wiki/Mediator\_pattern

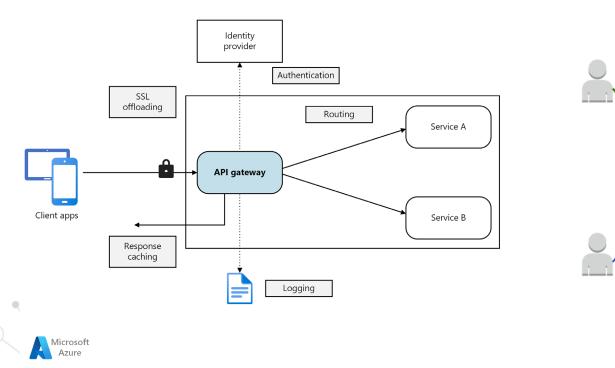
#### In-process / sync with mediator pattern

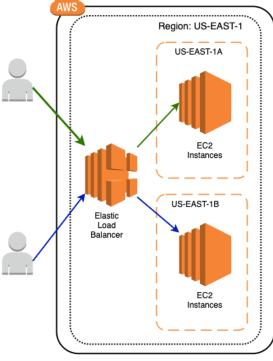
```
namespace Events.Controllers
    [ApiController]
    [Route("[controller]")]
    public class OrderController : ControllerBase
        private readonly IPublisher _publisher;
        public OrderController(IPublisher publisher)
            _publisher = publisher;
        }
        [HttpGet]
        public async Task NewOrder()
            var @event = new NewOrderEvent();
            await _publisher.Publish(@event)
        }
    }
}
```

Example project: 03 EventsInProcessByMediator

In-process / sync with mediator pattern

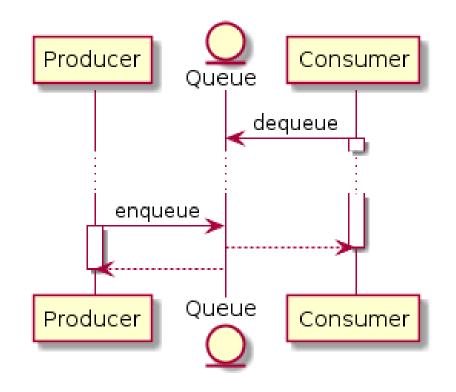
Performance Scalability Resilience Redundancy





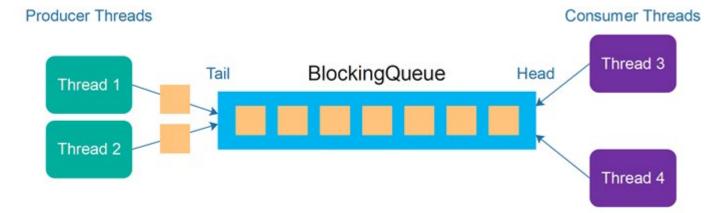
**Continue to book «Designing Data-Intensive Applications» page 13** 

#### Out of process / async





#### Out of process / async with producer/consumer





#### **Oueue Producer**

{

}

```
namespace EventsOutOfProcessByChannel.Controllers
    [ApiController]
    [Route("[controller]")]
    public class OrderController : ControllerBase
        private readonly ChannelWriter<NewOrderEvent> _channelWriter;
        public OrderController(ChannelWriter<NewOrderEvent> channelWriter)
            _channelWriter = channelWriter;
        [HttpGet]
        public async Task NewOrder()
            // Produce a new event and sent to channel
            var @event = new NewOrderEvent();
            await _channelWriter.WriteAsync(@event);
        }
```

C# Channels are an implementation of the producer/consumer programming model.

https://learn.microsoft.com/en-us/dotnet/core/extensions/channels

Example project: 04 EventsOutOfProcessByChannel

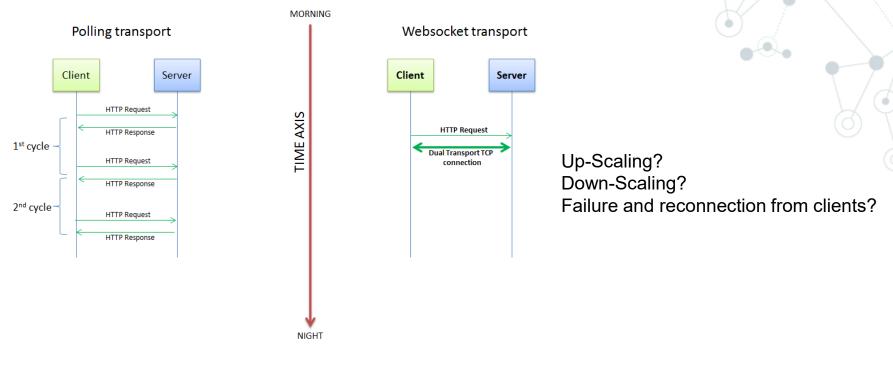
#### **Queue Consumer**

C# Channels are an implementation of the producer/consumer conceptual programming model.

https://learn.microsoft.com/en-us/dotnet/core/extensions/channels

Example project: 04 EventsOutOfProcessByChannel

#### Queue Consumer – user feedback – polling vs websocket



ASSERT (Night >= Morning)

https://mashhurs.wordpress.com/2016/09/30/polling-vs-websocket-transport/

https://dev.to/kevburnsjr/websockets-vs-long-polling-3a0o

#### Monolith



# Microservices

In a monolithic application running on a single process, components invoke one another using language-level method or function calls.

itoutposts.com

A microservices-based application is a distributed system running on multiple processes or services, usually even across multiple servers or hosts

https://learn.microsoft.com/en-us/dotnet/architecture/microservices/architectmicroservice-container-applications/communication-in-microservicearchitecture

#### Out of-process / sync with microservice

```
namespace MicroserviceA.Controllers
    [ApiController]
    [Route("[controller]")]
    public class OrderController : ControllerBase
        private readonly HttpClient _client;
        public OrderController(HttpClient client)
            _client = client;
        }
        [HttpGet]
        public async Task<long> NewOrder()
           Console.WriteLine("Sending request to MicroserviceB");
            var paymentResult = await _client.GetFromJsonAsync<long>("https://localhost:7165/payment");
            Console.WriteLine($"Sent request MicroserviceB with result {paymentResult}");
    }
}
                                       Example project: 05 MicroserviceA/B
```

#### Out of-process / sync with microservice

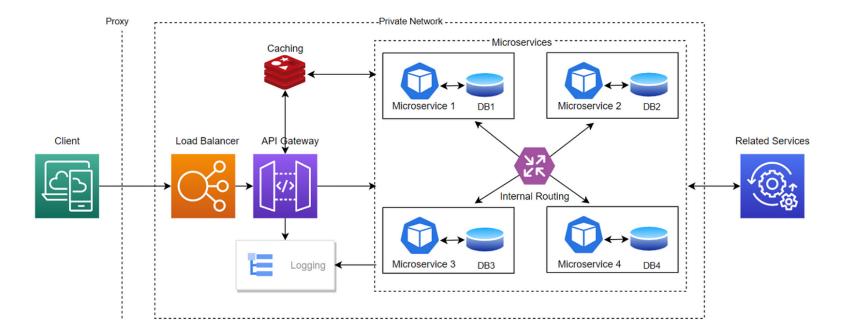
}

```
namespace MicroserviceB.Controllers
{
    [ApiController]
    [Route("[controller]")]
    public class PaymentController : ControllerBase
    {
        [HttpGet]
        public long Get()
        {
            Console.WriteLine("Elaborating request");
            var result = Random.Shared.Next(0, 100);
            Thread.Sleep(1000);
            Console.WriteLine($"Elaborated request with result: {result}");
            return result;
        }
    }
}
```

Example project: 05 MicroserviceA/B

Out of-process / sync with microservice

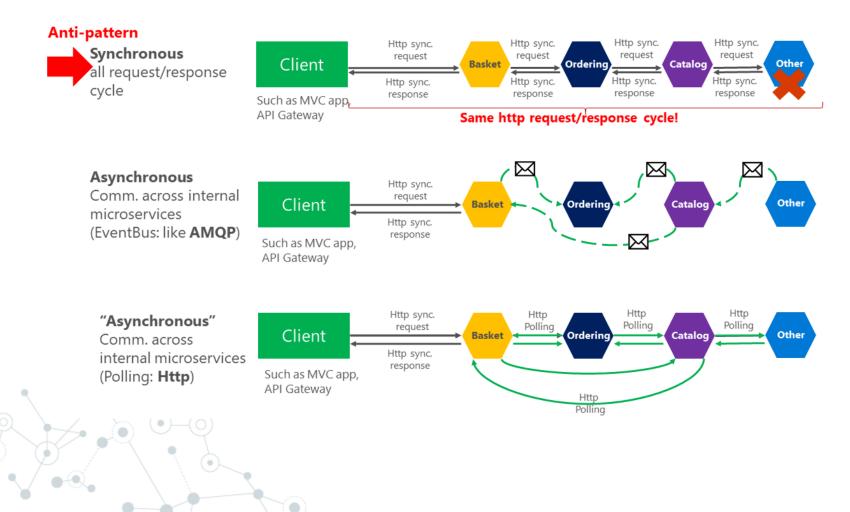
Performance Scalability Resilience Redundancy



https://medium.com/@beuttam/building-scalable-microservices-with-proxy-load-balancer-apigateway-private-network-services-f25c73cc8e02

#### **Communication types**

#### Synchronous vs. async communication across microservices



#### Out of-process / async with microservice - producer

```
namespace EventsOutOfProcessByDB.Controllers
    [ApiController]
    [Route("[controller]")]
    public class OrderController : ControllerBase
        private readonly EventBusContext _eventBusContext;
        public OrderController(EventBusContext eventBusContext)
            _eventBusContext = eventBusContext,
        [HttpGet]
        public async Task NewOrder()
            // Produce a new event and sent to channel
            var @event = new NewOrderEvent();
            @event.UserEmail = "diego@bonura.dev";
            var content = JsonSerializer.Serialize(@event, @event.GetType());
            var typeName = @event.GetType().FullName!;
            var message = new Message()
                Type = typeName,
                Content = content
            };
            _eventBusContext.Add(message);
            await _eventBusContext.SaveChangesAsync();
```

{

Example project: 06 EventsOutOfProcessByDatabaseConsumer

#### Out of-process / async with microservice - consumer

```
protected override async Task ExecuteAsync(CancellationToken stoppingToken)
   while (true)
        var messageToElaborate = _eventBusContext.Set<Message>().Where(m => m.ProcessedOn == null).OrderBy(m
=> m.OccurredOn).FirstOrDefault();
        if (messageToElaborate != null)
            var type = AppDomain.CurrentDomain.GetAssemblies().Where(a => !a.IsDynamic).SelectMany(a =>
a.GetTypes()).FirstOrDefault(t => t.FullName == messageToElaborate.Type);
            var domainEvent = (INotification)JsonSerializer.Deserialize(messageToElaborate.Content, type);
            await _publisher.Publish(domainEvent);
            messageToElaborate.ProvessedOn = DateTime.Now;
            await _eventBusContext.SaveChangesAsync();
        }
        await Task.Delay(1000);
    ł
}
```

Out of-process / async with microservice consumer

Performance Scalability Resilience Redundancy

Is it easy to add new consumers to increase performance?

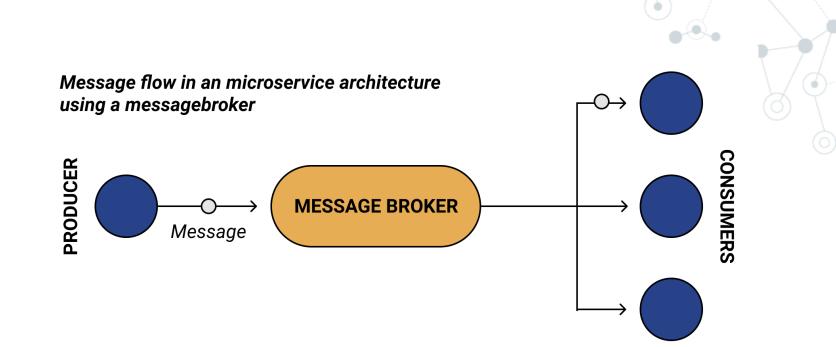
we need to introduce a row lock (on db side) or optimistic concurrency control (occ)

https://medium.com/@beuttam/building-scalable-microservices-with-proxy-load-balancer-apigateway-private-network-services-f25c73cc8e02

## Message broker

an intermediary for messaging

#### Message broker





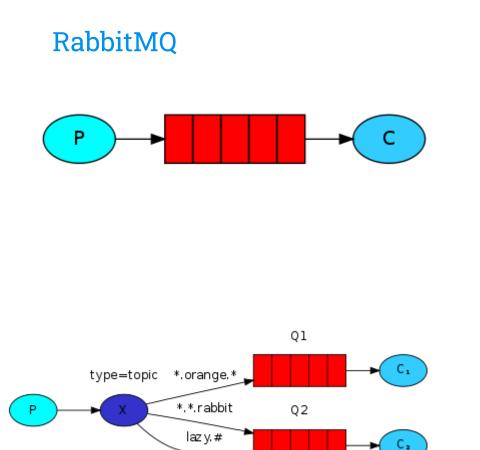
## Message broker

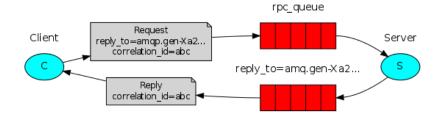
Message brokers

- can validate, store, route, and deliver messages to the appropriate destinations.
- act as intermediaries between other applications, allowing senders to issue messages without knowing where the recipients are located, whether or not they are active, or how many there are.
- simplifies the separation of processes and services within systems.

Protocols

- AMQP: The Advanced Message Queuing Protocol (RabbitMQ/ Azure Service Bus / Amazon MQ / Apache ActiveMQ)
- Kafka: binary protocol over TCP
- MQTT: Lightweight and Efficient for IoT Messages (Mosquitto)





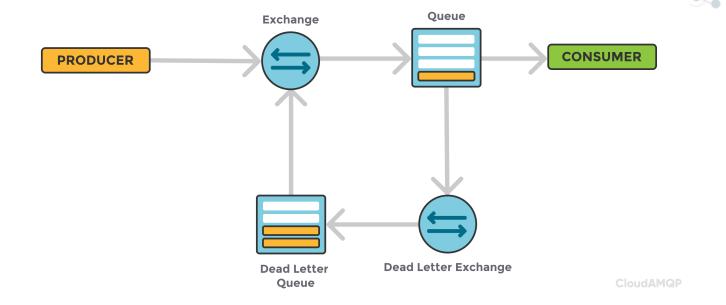
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# RabbitMQ





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## RabbitMQ - Producer

```
public class EventBusRabbitMQ : IEventBus
{
    public void Publish(IEvent @event)
       var factory = new ConnectionFactory { HostName = "localhost" };
       using var connection = factory.CreateConnection();
       using var channel = connection.CreateModel();
       channel.QueueDeclare(queue: "task_queue",
                             durable: true,
                             exclusive: false,
                             autoDelete: false,
                             arguments: null);
       string message = JsonSerializer.Serialize(@event, typeof(NewOrderEvent));
       var body = Encoding.UTF8.GetBytes(message);
       var properties = channel.CreateBasicProperties();
       properties.Persistent = true;
       channel.BasicPublish(exchange: string.Empty,
                routingKey: "task_queue",
                 basicProperties: properties,
                 body: body);
```

### RabbitMQ - Consumer

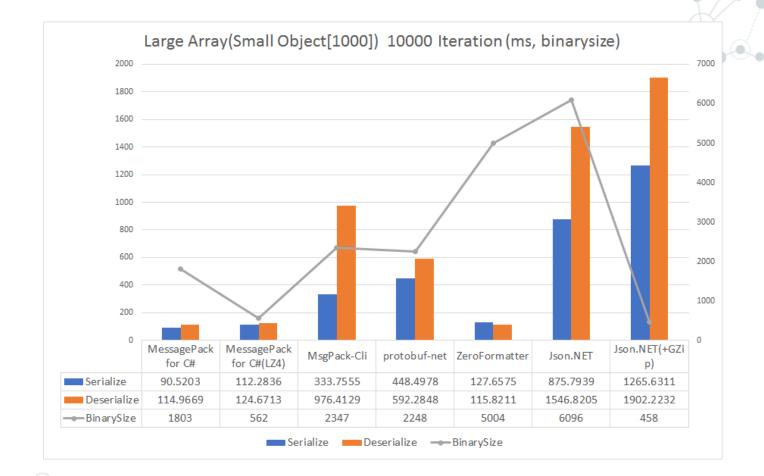
```
var factory = new ConnectionFactory { HostName = "localhost" };
using var connection = factory.CreateConnection();
using var channel = connection.CreateModel();
channel.QueueDeclare(queue: "task_queue",
                        durable: true,
                        exclusive: false,
                        autoDelete: false,
                        arguments: null);
channel.BasicQos(prefetchSize: 0, prefetchCount: 1, global: false);
var messageConsumer = new EventingBasicConsumer(channel);
messageConsumer.Received += async (model, ea) =>
{
    byte body = ea.Body.ToArray();
    @event = (NewOrderEvent)JsonSerializer.Deserialize(body, typeof(NewOrderEvent));
    Console.WriteLine($"Received from {@event.UserEmail}");
    await Task.Delay(100);
    channel.BasicAck(deliveryTag: ea.DeliveryTag, multiple: false);
};
channel.BasicConsume(queue: "task_queue",
                     autoAck: false,
                     consumer: messageConsumer);
console.ReadLine();
```

Distribute application with message broker

Performance Scalability Resilience Redundancy

Is it easy to add new consumers to increase performance?

## Serialization performance



https://github.com/neuecc/Utf8Json

https://github.com/MessagePack-CSharp/MessagePack-CSharp

# Serialization performance

#### Json

Overview			Messages			Message rates			+/-	
Name	Туре	Features	State	Ready	Unacked	Total	incoming	deliver / get	ack	
task_queue	classic	D	running	1,835	0	1,835	36/s			

#### Add a new queue

#### Protobuf

Overview			Messages			Message rates			+/-	
Name	Туре	Features	State	Ready	Unacked	Total	incoming	deliver / get	ack	
task_queue	classic	D	running	237	0	237	52/s			

Add a new queue

# Generate Ids on distributed application

We need to generate Id on the client before inserting a new row into the database:

Possibilities:

- GUID generated on client (too big not sortable)
- Sql server single table (Single point of failure Not scalable)
- Specific services as snowflake and zookeeper (Scalable but another service to mantain)
- Sequence on db and cache chunks

```
0 references
protected override void OnModelCreating(ModelBuilder modelBuilder)
{
    modelBuilder.HasSequence<int>("BlogIdSequence")
    .IncrementsBy(100); //10 is default
    modelBuilder.Entity<Blog>()
    .Property(b => b.Name)
    .IsUnicode(false)
    .HasMaxLength(20);
    modelBuilder.Entity<Blog>()
    .Property(b => b.BlogId)
    .UseHiLo("BlogIdSequence");
}
```

https://medium.com/@sandeep4.verma/system-design-distributed-global-unique-id-generation-d6a440cc8e5

https://medium.com/@jitenderkmr/demystifying-snowflake-ids-a-unique-identifier-in-distributed-computing-72796a827c9d

https://phanikumaryadavilli.medium.com/generating-distributed-uuids-using-zookeeper-a02cabfda0e9

# Distributed application with a framework

## Masstransit

# Easily build reliable distributed applications

MassTransit provides a developer-focused, modern platform for creating distributed applications without complexity.

- First class testing support
- Write once, then deploy using RabbitMQ, Azure Service Bus, and Amazon SQS
- Observability via Open Telemetry (OTEL)
- Fully-supported, widely-adopted, a complete end-to-end solution

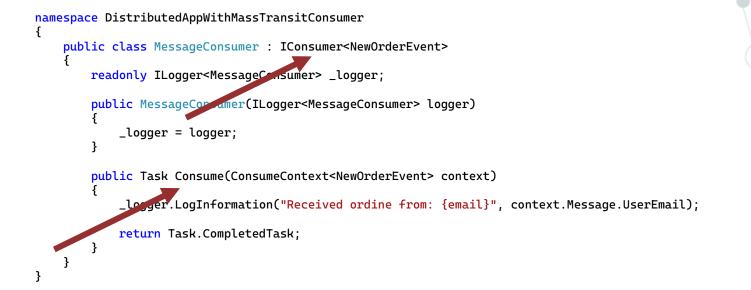


### **Masstransit - Producer**

```
public class OrderController : ControllerBase
{
    private readonly IBus _bus;
    public OrderController(IBus bus)
    {
        _bus = bus;
    }
    [HttpGet]
    public async Task NewOrderAsync()
    {
        // Produce a new event and sent to channel
        var @event = new NewOrderEvent();
        @event.UserEmail = "diego@bonura.dev";
        await _bus.Publish(@event);
    }
}
```



### Masstransit - Consumer



# Applications go wrong

The major difference between a thing that might go wrong and a thing that cannot possibly go wrong is that when a thing that cannot possibly go wrong goes wrong it usually turns out to be impossible to get at or repair.

-Douglas Adams, Mostly Harmless (1992)

# Applications go wrong

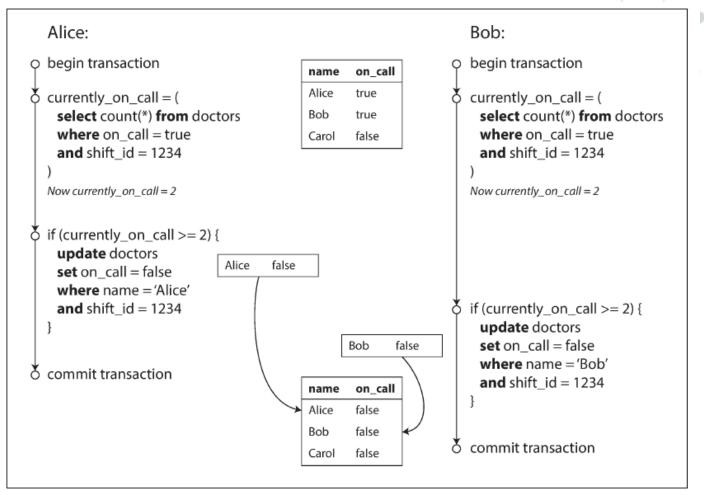
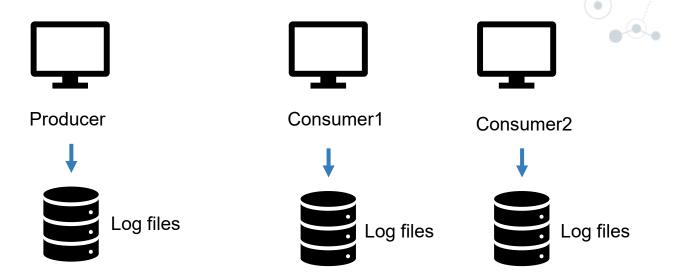


Figure 7-8. Example of write skew causing an application bug.

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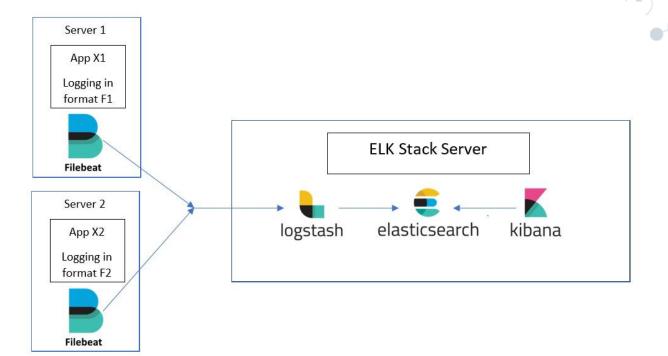
# Logging on distributed application



## How to get information when things go wrong?

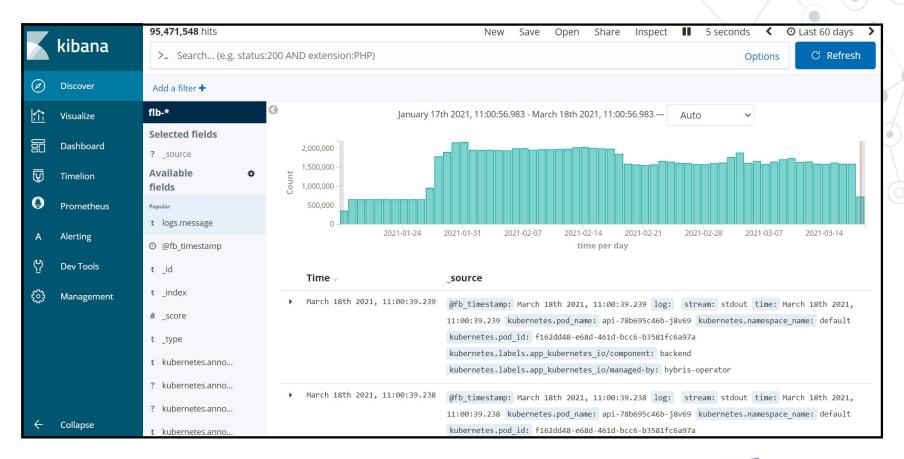


## Callect logs in one place





# Call logs in one place





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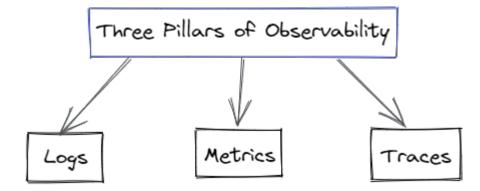


# **Observability**

On distributed application logs monitoring could be difficult



# Main concepts of observability



**Logs** in the technology and development field give a written record of happenings within a system, similar to the captain's log on a ship.

**Metrics** are a set of values that are tracked over time.

A **trace** is a means to track a user request from the user interface all the way through the system and back to the user when they receive confirmation that their request has been completed. As part of the trace, every operation executed in response to the request is recorded.

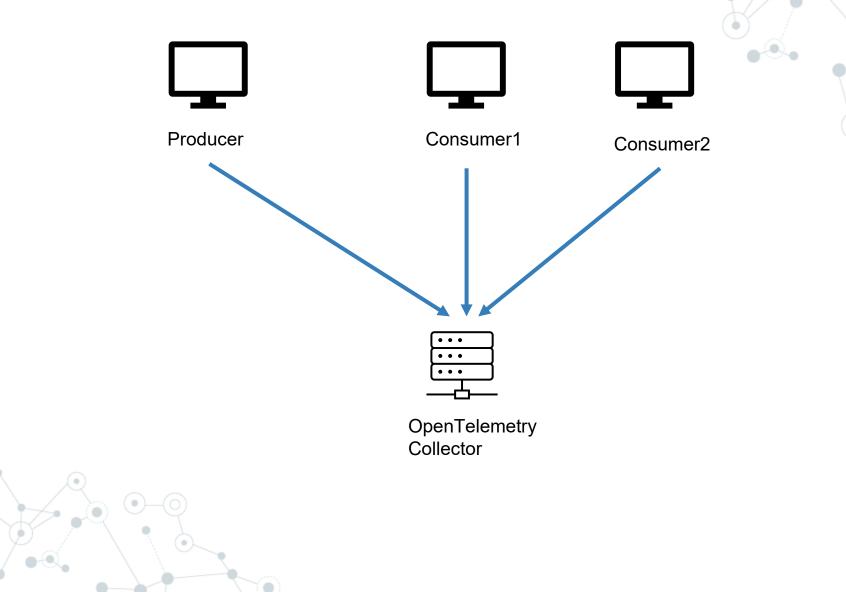
### **Observability standard**



OpenTelemetry is an open-source CNCF (Cloud Native Computing Foundation) project formed from the merger of the OpenCensus and OpenTracing projects. It provides a collection of tools, APIs, and SDKs for capturing metrics, distributed traces and logs from applications.

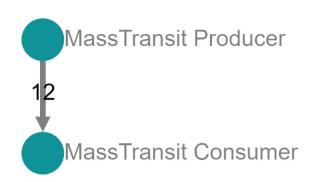


# OpenTelemetry on distributed application



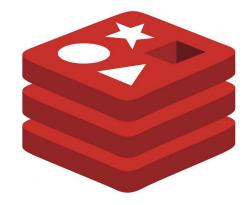
Example Trace: MassTransit Producer Order 182a1d 10.58ms		a minute ago
Trace:	4 Spans MassTransit Consumer (2) MassTransit Producer (2)	Today   4:59:17 pm
	MassTransit Producer Order 182a1dc	10.58ms
Example	Trace:	
	Example	

#### **Metric:**



# **Distributed lock**

Distributed locks are a very useful primitive in many environments where different processes must operate with shared resources in a mutually exclusive way.

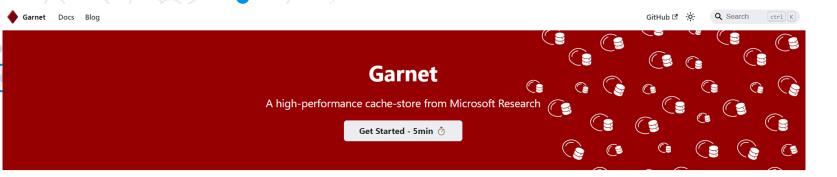


# Redis

The open source, in-memory data store used by millions of developers as a database, cache, streaming engine, and message broker.

Created by: Salvatore Sanfilippo

https://redis.io/





#### **High Performance**

Garnet uses a thread-scalable storage layer called Tsavorite, and provides cache-friendly sharedmemory scalability with tiered storage support. Garnet supports cluster mode (sharding and replication). It has a fast pluggable network design to get high end-to-end performance (throughput and 99th percentile latency). Garnet can reduce costs for large services.



#### Rich & Extensible

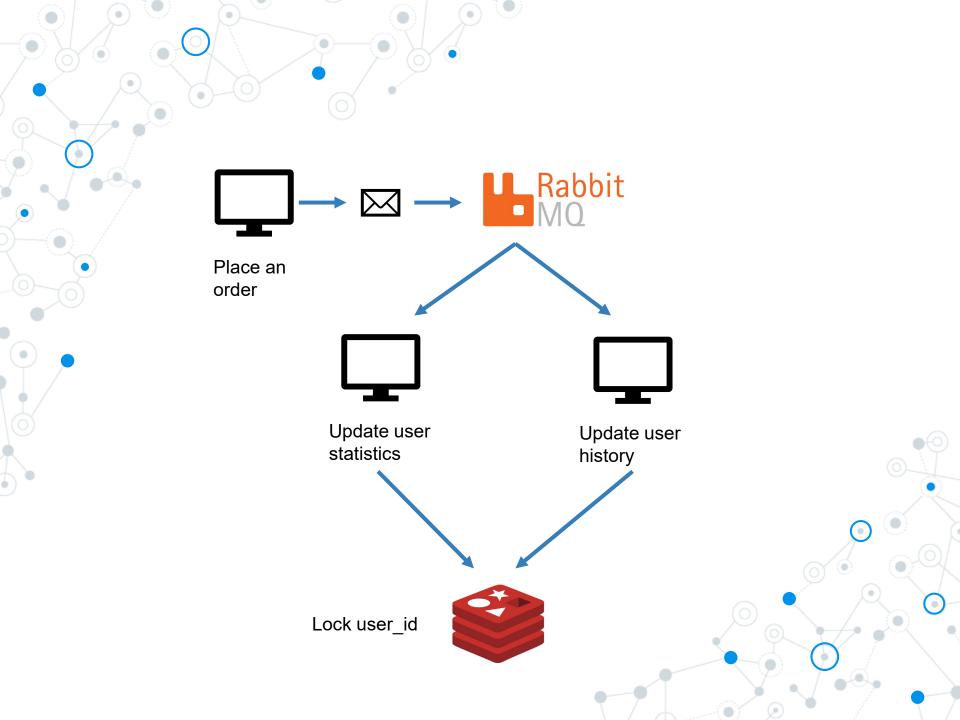
Garnet uses the popular RESP wire protocol, allowing it to be used with unmodified Redis clients in any language. Garnet supports a large fraction of the Redis API surface, including raw strings and complex data structures such as sorted sets, bitmaps, and HyperLogLog. Garnet also has scalable extensibility and transactional stored procedure capabilities.



#### Modern & Secure

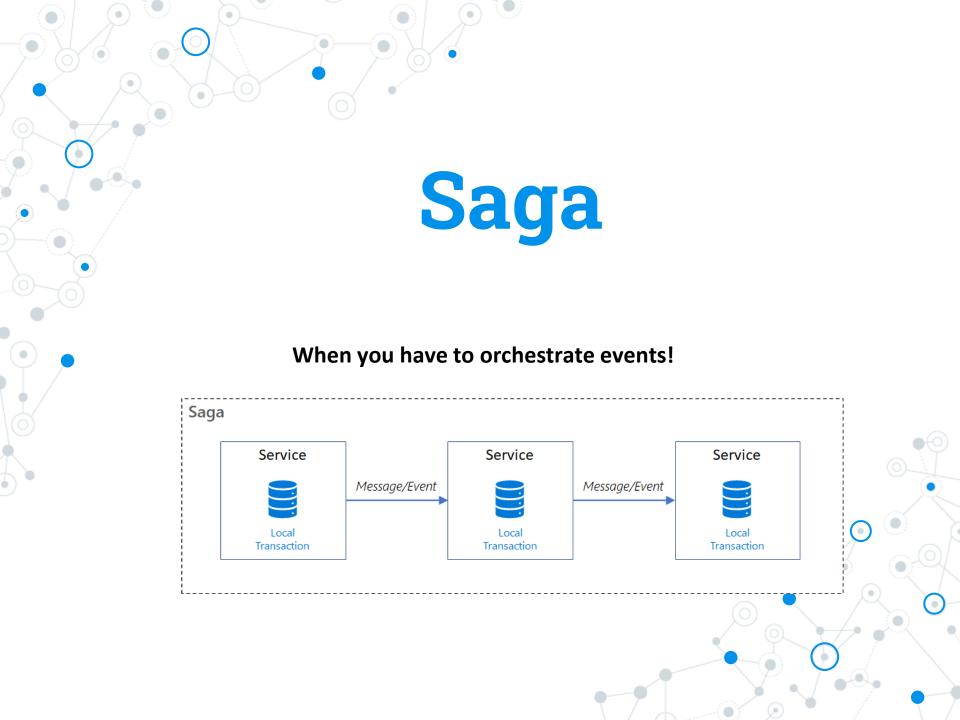
The Garnet server is written in modern .NET C#, and runs efficiently on almost any platform. It works equally well on Windows and Linux, and is designed to not incur garbage collection overheads. You can also extend Garnet's capabilities using new .NET data structures to go beyond the core API. Finally, Garnet has efficient TLS support out of the box.

#### https://microsoft.github.io/garnet/



### Redis lock

```
static async Task Main(string[] args)
{
    var endPoints = new List<RedLockEndPoint> { new DnsEndPoint("localhost", 6379) };
    var redlockFactory = RedLockFactory.Create(endPoints);
    var resource = "my-order-id";
    var expiry = TimeSpan.FromSeconds(30);
    await using (var redLock = await redlockFactory.CreateLockAsync(resource, expiry))
    {
        // make sure we got the lock
        if (redLock.IsAcquired)
        {
            // do stuff
        }
    }
}
```



## Saga: consistency models

**Immediate consistency**: once a write operation (e.g., updating a piece of data) is completed, any subsequent read operation (e.g., retrieving that data) will reflect the updated value.

- expensive in terms of performance
- not ideal in all distributed systems

ACID (atomicity, consistency, isolation, durability).

**Eventual consistency**: may be a period of time during which different nodes or replicas in the system have different versions of the data.

• commonly used in systems like NoSQL databases

BASE (basically-available, soft-state, eventual consistency)

## Saga: trade off

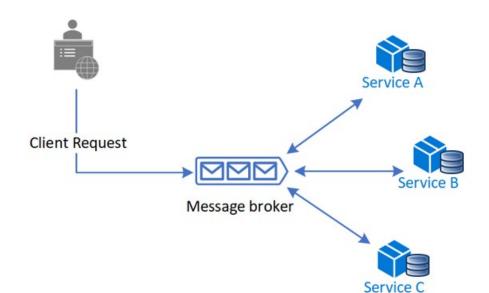


https://priyalwalpita.medium.com/steering-clear-of-distributed-monolith-traps-in-your-journey-toeffective-microservices-86671be0b604

https://www.youtube.com/watch?v=p2GIRToY5HI

Saga approaches: choreography and orchestration

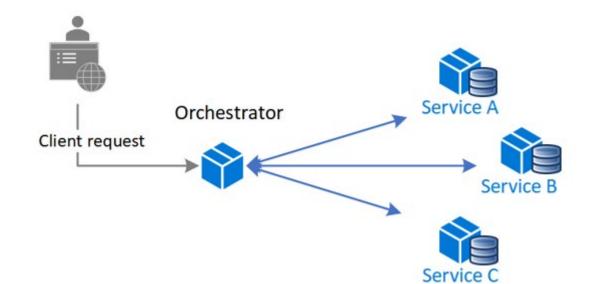
Choreography: without a centralized point of control



https://learn.microsoft.com/en-us/azure/architecture/reference-architectures/saga/saga

Saga approaches: choreography and orchestration

Orchestration: centralized controller tells participants what to execute



https://learn.microsoft.com/en-us/azure/architecture/reference-architectures/saga/saga

```
Saga with MassTransit
```

```
public OrderStateMachine()
   InstanceState(x => x.CurrentState);
   Event(() => NewOrderEvent, x => x.CorrelateById(context => context.Message.OrderId));
   Event(() => OrderProcessed, x => x.CorrelateById(context => context.Message.OrderId));
   Event(() => OrderCancelled, x => x.CorrelateById(context => context.Message.OrderId));
   Initiallv(
       When(NewOrderEvent)
            .Then(context =>
            {
                context.Saga.ProcessingId = Guid.NewGuid();
            })
            .Publish(context => new ProcessOrder(context.Saga.CorrelationId))
            .TransitionTo(Pending)
            .Then(context => Console.Out.WriteLineAsync($"From New to Pending: {context.Saga.CorrelationId}"))
   );
    During(Pending,
       When(OrderProcessed)
            .TransitionTo(Accepted)
            .Then(context => Console.Out.WriteLineAsync($"From Pending to Accepted: {context.Saga.CorrelationId}"))
            .Finalize(),
       When(OrderCancelled)
            .TransitionTo(Cancelled)
            .Then(context => Console.Out.WriteLineAsync($"From Pending to Faulted: {context.Saga.CorrelationId} for reason:
{context.Message.Reason}"))
            .Finalize()
       );
    SetCompletedWhenFinalized();
```

# Saga choreography

#### MassTransit elaborates saga and creates few queue and exchanges on RabbitMq

Exchanges		
<ul><li>All exchanges (13)</li></ul>		
Pagination		
Page 1 🗸 of 1 - Filter:	Regev 2	

Virtual host	Name	Туре	Features	Message rate in	Message rate out
/	(AMQP default)	direct	D		
/	Message	fanout	D		
/	OrderState	fanout	D		
/	${\bf SagaWith Masstransit Shared: New Order Event}$	fanout	D	0.00/s	0.00/s
/	${\bf SagaWith Masstransit Shared: Order Cancelled}$	fanout	D	0.00/s	0.00/s
/	${\bf SagaWith Masstransit Shared: Order Processed}$	fanout	D	0.00/s	0.00/s
/	${\bf SagaWith Masstransit Shared: Process Order}$	fanout	D	0.00/s	0.00/s
/	amq.direct	direct	D		
/	amq.fanout	fanout	D		
/	amg.headers	headers	D		
/	amg.match	headers	D		
/	amg.rabbitmg.trace	topic	DI		
/	amq.topic	topic	D		

# Actor model

Instead of calling methods, actors send messages to each other!

https://doc.akka.io/docs/akka/current/typed/guide/actors-intro.html https://learn.microsoft.com/en-us/dotnet/orleans/overview

### Actor model

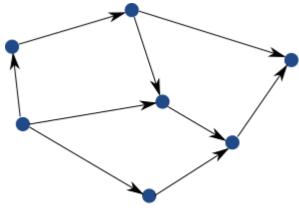
# The Actor Model: A Paradigm for Concurrent and Distributed Computing

The actor model is a programming model in which each actor is a lightweight, concurrent, immutable object that encapsulates a piece of state and corresponding behavior. Actors communicate exclusively with each other using asynchronous messages.



### Actor model

When we have a Producer and Consumer we usually send message to a queue

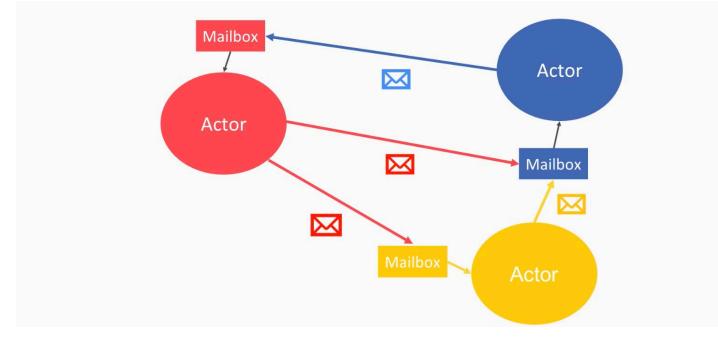


Actors interacting with each other by sending messages to each other

On actor model, we can implement Producer and Consumer as actor.

In Producer, we just get the actor reference of Consumer actor to send messages to Consumer's mailbox.





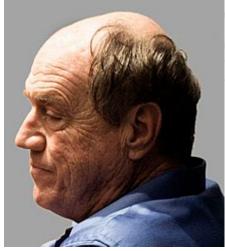
•



### Actor model: History 1973

The Actor Model is a mathematical theory of computation that treats "Actors" as the universal conceptual primitives of concurrent digital computation.

#### The actor model was inspired by physics



Carl Hewitt

Actors is based on "behavior" as opposed to the "class" concept of object-oriented programming.

https://en.wikipedia.org/wiki/Actor\_model

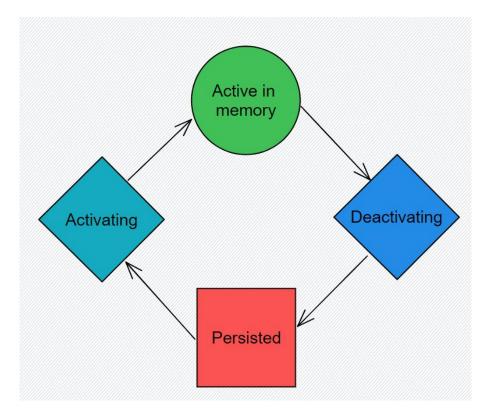
### Actor model

#### Main principles:

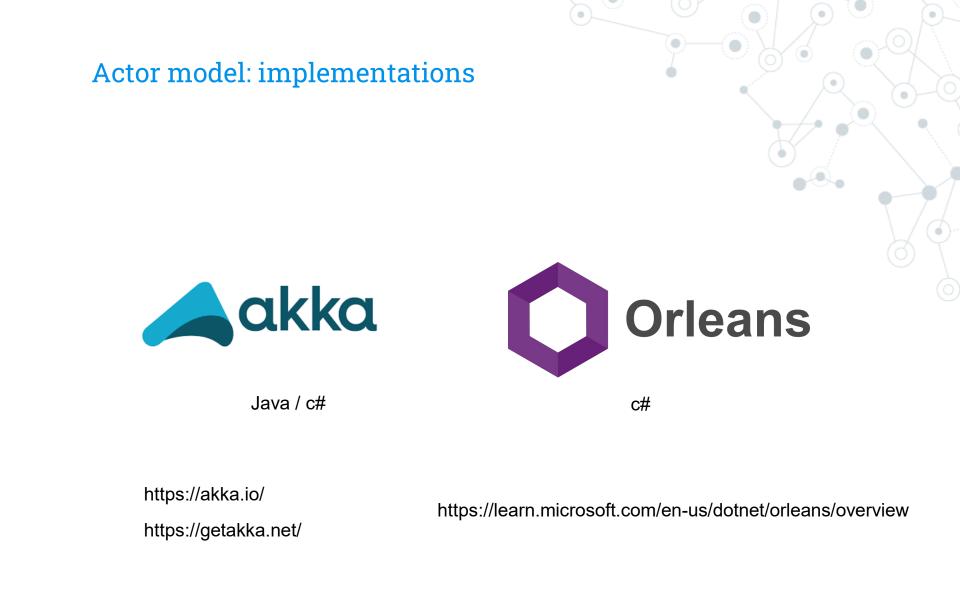
- **1. Isolation**: Actors are independent, with their own state and behavior.
- 2. Single thread: Actors process requests one at time
- **3. Messaging**: Actors interact by exchanging asynchronous messages.
- 4. Location Transparency: Actors' locations are abstracted, enabling distribution.



# Actor model: life cycle







### Actor model implementations on Orleans Microsoft research (2010)

https://www.microsoft.com/en-us/research/project/orleans-virtual-actors/

#### **Orleans invented the Virtual Actor abstraction**

Actors are purely logical entities that always exist, virtually. An actor cannot be explicitly created nor destroyed, and its virtual existence is unaffected by the failure of a server that executes it. Since actors always exist, they are always addressable.

# Actor model implementations on Orleans - Grain

- **1. Grain**: grains are implementation of a virtual actor.
- 2. Interfaces: grains define interfaces.
- **3. Grain:** has always an identity (string, number, guid)
- 4. Persistence: grains could volatile or persisted
- 5. Lifecycle: grains could be terminated to free computer resources

https://learn.microsoft.com/en-us/dotnet/orleans/overview#what-are-grains

### Actor model implementations on Orleans - Silo

Cluster (1/n)

A silo hosts one or more grains

You can have any number of clusters, each cluster has one or more silos, and each silo has one or more grains

https://learn.microsoft.com/en-us/dotnet/orleans/overview#what-are-silo

S

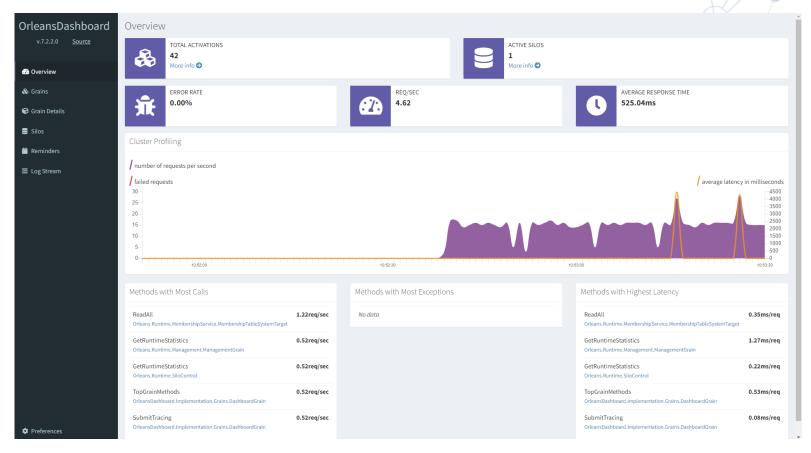
# Actor model implementations on Orleans - Silo

- 1. Host grains
- 2. Responsible to activate and deactivate grains
- 3. Typically: 1 silo per container/node
- 4. Could be embedded into main application or in separate container/node
- 5. Clustering silos is easy



# Actor model implementations on Orleans - Dashboard

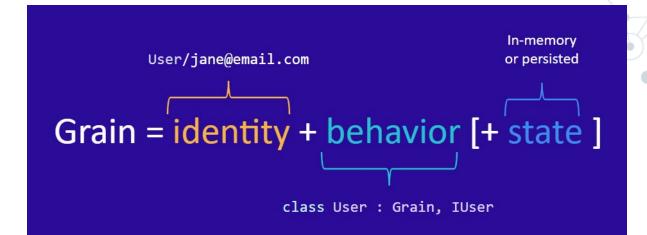
#### https://github.com/OrleansContrib/OrleansDashboard





http://localhost:8080

### Actor model implementations on Orleans – Calling actors



You can start an actor using grainFactory:

\_grainFactory.GetGrain<IGrainA>("my-id");

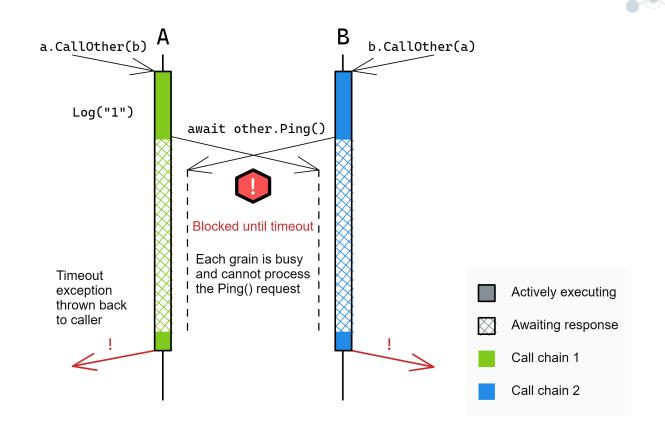
Inside an actor:

var grainB = this.GrainFactory.GetGrain<IGrainB>(id);

Orleans: Actor mailbox addresses are full typed

### Actor model implementations on Orleans – Deadlock

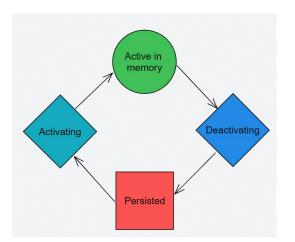
**Single thread**: Actors process requests one at time



https://learn.microsoft.com/it-it/dotnet/orleans/grains/request-scheduling

#### Es 14: MicrosoftOrleansDeadlock

### Actor model implementations on Orleans – Persistence



public HelloGrain(

[PersistentState("hello")] IPersistentState<HelloState> helloState, ILogger<HelloGrain> logger)

```
_logger = logger;
_helloState = helloState;
```

}

ł

}

{

{

public override Task OnActivateAsync(CancellationToken cancellationToken)
{

return base.OnActivateAsync(cancellationToken);

public async Task<string> SayHello(string greeting)

```
_helloState.State.Counter++;
_logger.LogInformation("Start say Hello for {grainId} with counter {counter}",
IdentityString, _helloState.State.Counter);
await Task.Delay(1000);
```

// Store state
await \_helloState.WriteStateAsync();

```
//DeactivateOnIdle();
return $"Hello, {greeting}!";
```

public override Task OnDeactivateAsync(DeactivationReason reason, CancellationToken
cancellationToken)

return base.OnDeactivateAsync(reason, cancellationToken);

Es 15: MicrosoftOrleansPersistence

### Actor model implementations on Orleans – Streaming

A typical scenario for Orleans Streams is when you have per-user streams and you want to perform different processing for each user, within the context of an individual user.

#### Producer

\_stream = this.GetStreamProvider("StreamProvider").GetStream<int>(streamId);

#### Consumer

// ImplicitStreamSubscription attribute here is to subscribe implicitely to all stream within
// a given namespace: whenever some data is pushed to the streams of namespace
Constants.StreamNamespace,
// a grain of type ConsumerGrain with the same guid of the stream will receive the message.
// Even if no activations of the grain currently exist, the runtime will automatically
// create a new one and send the message to it.
[ImplicitStreamSubscription("StreamNamespace")]
public class ConsumerGrain : Grain, IConsumerGrain, IStreamSubscriptionObserver

https://learn.microsoft.com/en-us/dotnet/orleans/streaming/streams-why

#### Es 16: MicrosoftOrleansStreams

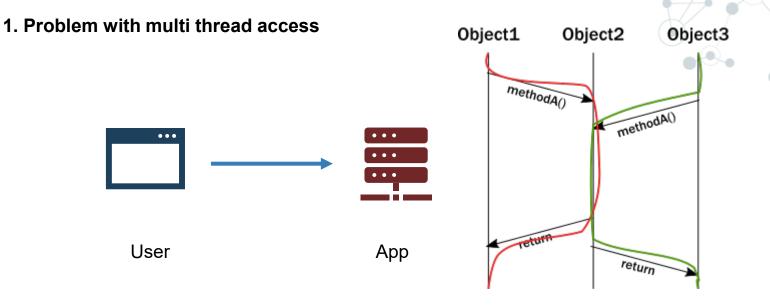
### Actor model implementations on Orleans – Transactions

Orleans supports distributed ACID transactions against persistent grain state.

```
public interface IAccountGrain : IGrainWithStringKey
{
    [Transaction(TransactionOption.Join)]
    Task Withdraw(int amount);
    [Transaction(TransactionOption.Join)]
    Task Deposit(int amount);
    [Transaction(TransactionOption.CreateOrJoin)]
    Task<int> GetBalance();
}
await _transactionOption.Create,
    async () =>
    {
        await fromAccount.Withdraw(transferAmount);
        await toAccount.Deposit(transferAmount);
    });
```

https://learn.microsoft.com/en-us/dotnet/orleans/grains/transactions

Es 17: MicrosoftOrleansTransactions



- 1. Few users call an API
- 2. Shared services running on same APP
- 3. Few threads could access same service

https://getakka.net/articles/intro/what-are-actors.html#the-illusion-of-encapsulation

#### 1. Problem with multi thread access – classical solution

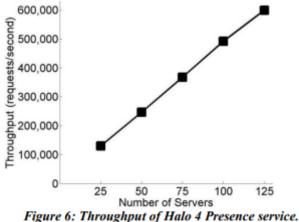
```
public void Credit(User user, decimal amount)
{
    if (user.amount < 0)
    {
        throw new ArgumentOutOfRangeException(nameof(amount), "The credit amount cannot be negative.");
    }
    lock (balanceLock)
    {
        user.balance += amount;
    }
}</pre>
```

Test	IsCorrect	One Thread Ticks	Two Thread Ticks
No Sync	False	385315	668500
Lock Statement	True	1846390	8938287

#### Lock is not performant

1. Problem with multi thread access – actor model solution

- 1. One actor per user
- 2. No need to synchronize methods
- 3. Actors process requests one at time
- 4. Actors are small



Linear scalability as number of server increases.

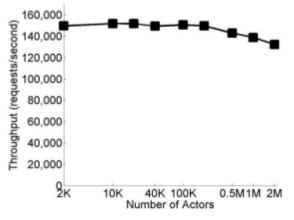
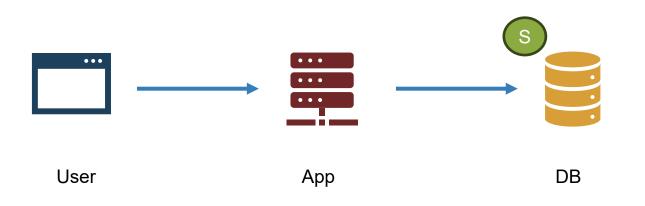


Figure 7: Throughput of Halo 4 Presence service. Linear scalability as number of actors increases.

https://www.microsoft.com/en-us/research/wp-content/uploads/2016/02/Orleans-MSR-TR-2014-41.pdf

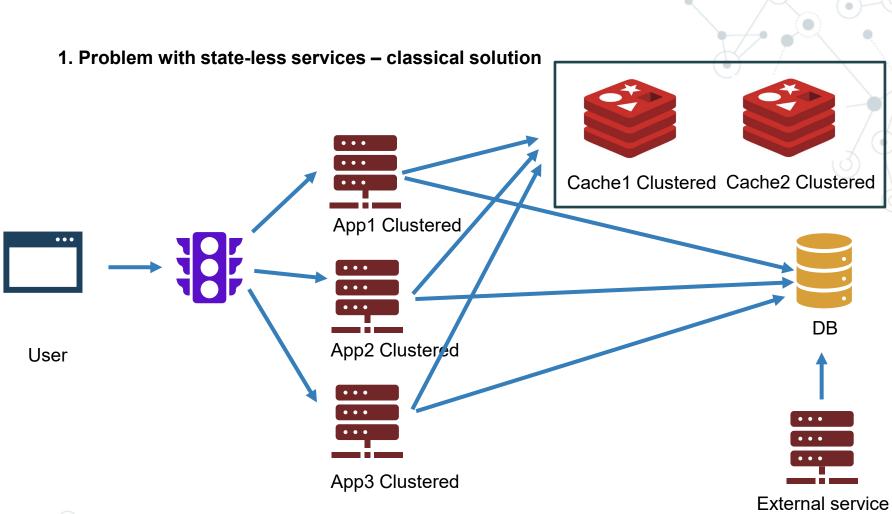
1. Problem with state-less services



- 1. User calls an API
- 2. App loads state from DB
- 3. App holds state in memory for better performance

https://www.youtube.com/watch?v=iE8cisVgoj8

- 1. Problem with state-less services • • • • • • • • • App1 Clustered • • • App2 Clustered User DB . . . • • • • • • App3 Clustered
  - 1. User calls an API on App1
  - 2. App1 loads state from DB
  - 3. App1 holds state in memory for better performance
  - 4. User calls an API on App3

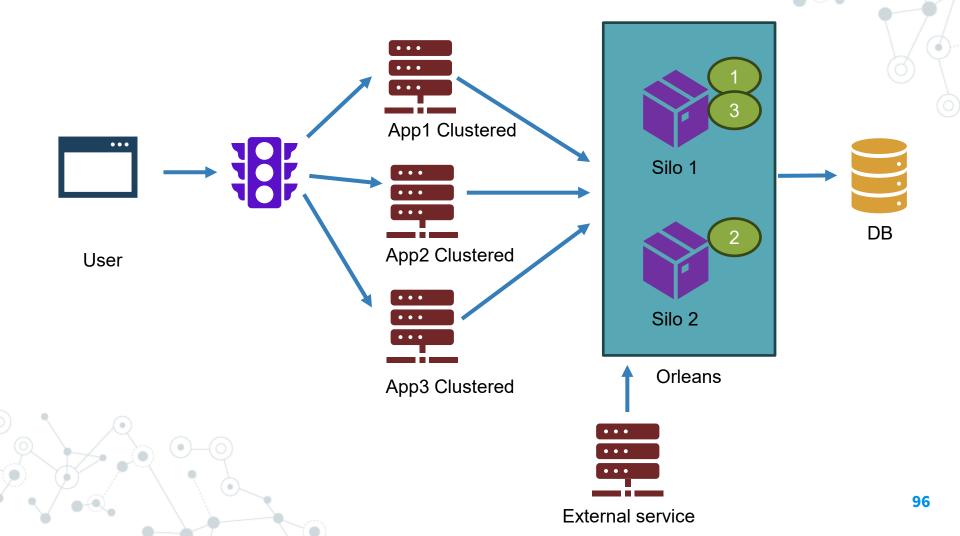


There are only two hard things in Computer Science: cache invalidation and naming things.

-- Phil Karlton

-

1. Problem with state-less services – actor model solution





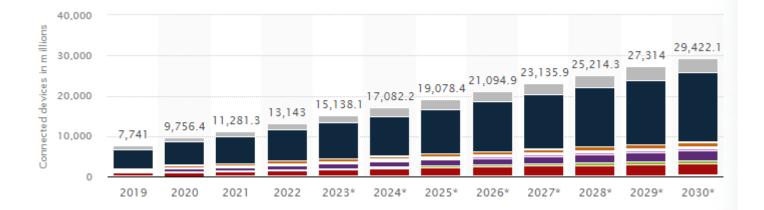
- 1. Actor are small enough to be single-thread
- 2. Many entities loosely coupled (billions!)
- 3. No need of a global coordinator, only between actors
- 4. You know your project



- 1. Entity must access to the state of other entities
- 2. Entities relations are complex (ERP, MES...)
- 3. Small entities but fat
- 4. You don't know your project

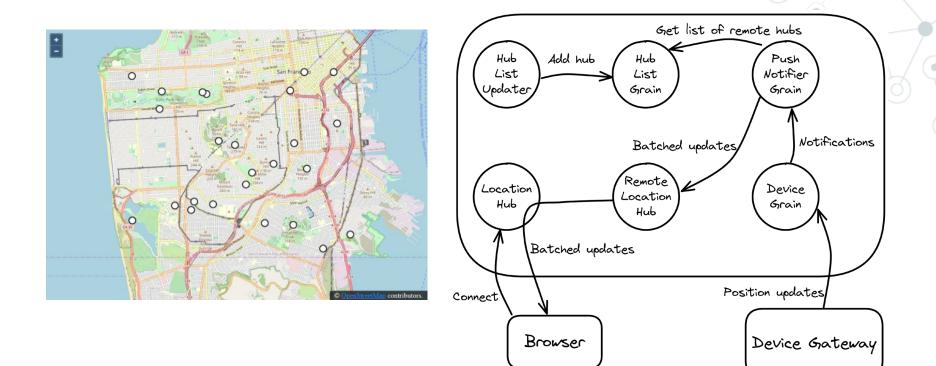
Actor model: examples

# Number of Internet of Things (IoT) connected devices worldwide from 2019 to 2030



https://www.statista.com/statistics/1194682/iot-connected-devices-vertically/

### Actor model: examples



https://learn.microsoft.com/en-us/dotnet/orleans/tutorials-and-samples/

•Security in Distributed Applications





# Man in the middle

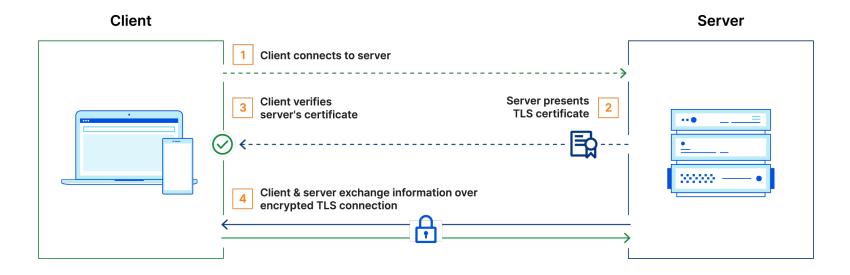
# Different services with different protocols:

- 1. Web http/https
- 2. gRPC
- 3. AMQP
- 4. Database



## Man in the middle

TLS: the server has a TLS certificate and a public/private key pair, while the client does not

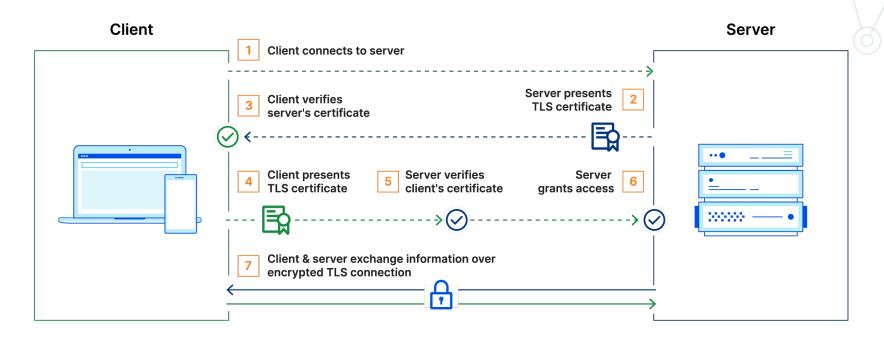


But we have server to server communications!

# Man in the middle

#### mTLS: mutual TLS (internal CA)

\*Zero Trust means that no user, device, or network traffic is trusted by default, an approach that helps eliminate many security vulnerabilities.



https://www.elastic.co/guide/en/kibana/current/elasticsearch-mutual-tls.html

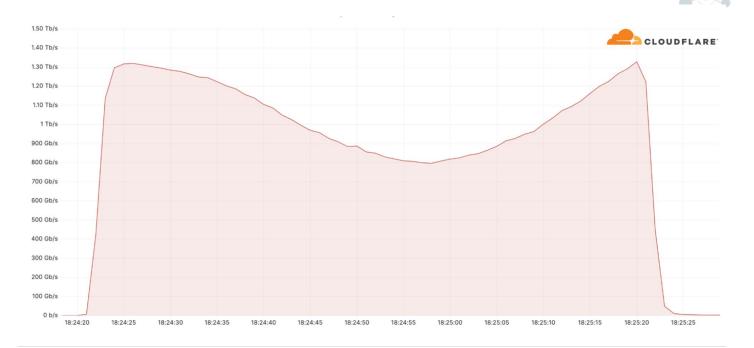
https://www.rabbitmq.com/ssl.html#peer-verification https://learn.microsoft.com/en-us/samples/dotnet/samples/orleans-transport-layersecurity-tls/

# **Distributed Denial of Service**

# Million of requests per seconds from different clients



# **Distributed Denial of Service**



https://blog.cloudflare.com/ddos-threat-report-2023-q1/

#### **Cloud providers have few services.**

https://azure.microsoft.com/it-it/products/ddos-protection/ https://aws.amazon.com/it/shield/

### **Distributed Denial of Service**

#### Rate limit on http:

429 Too Many Requests The 429 status code indicates that the user has sent too many requests in a given amount of time ("rate limiting").



6000				
5000				
4000				
3000				
2000				
1000	100			
0				
	t < 800ms	800ms < t < 1.2s	t > 1.2s	failed

https://learn.microsoft.com/en-us/aspnet/core/performance/rate-limit?view=aspnetcore-8.0

#### Es 18: MicrosoftRateLimit

# Handling secrets

Services could need to connect:

- 1. Databases
- 2. Caches
- 3. External services on cloud
- 4. Other clusters
- 5. Other services



How to handle secrets correctly?



# Handling secrets

🔶 Blogpost | Certificates & secrets 👒

Search (Ctrl+/)      Overview		pplications to identify themselves to the authentication service surance, we recommend using a certificate (instead of a client se	5	sable location (using an HTTPS	
<ul><li>Quickstart</li><li>Integration assistant (preview)</li></ul>	Certificates Certificates can be used as secre	ts to prove the application's identity when requesting a token. A	lso can be referred to as public keys.		ľ
Manage	Upload certificate				
<b>B</b> randing	Thumbprint	Start date	Expires		
Authentication	No certificates have been added	for this application.			
📍 Certificates & secrets					
Token configuration					
➔ API permissions	Client secrets				
🙆 Expose an API	A secret string that the application	on uses to prove its identity when requesting a token. Also can b	be referred to as application password.		
n Owners	+New client secret			•	

Using certificates to prove application identity!

- 1. No need to share password
- 2. Security is on network layer (mTLS)



🔶 Test Azure App   Ce	Fest Azure App   Certificates & secrets       ****						
✓ Search «	🖗 Got feedback?						
🌉 Overview							
📣 Quickstart	Credentials enable confidential applications to scheme). For a higher level of assurance, we re-			kens at a web addressable location (using an HT ial	TPS		
🚀 Integration assistant	scheme), for a higher level of assurance, we re-	commente using a cert	incate (instead of a client secret) as a creden	iai.			
Manage	Application registration certificates, secrets	and federated credenti	als can be found in the tabs below.		×		
🧮 Branding & properties	•						
Authentication	Certificates (0) Client secrets (2) Fe	derated credentials	0)				
📍 Certificates & secrets							
Token configuration	A secret string that the application uses to pr	ove its identity when r	equesting a token. Also can be referred to as	application password.			
<ul> <li>API permissions</li> </ul>	+ New client secret						
Expose an API	Description 3	Expires	Value 🛈	Secret ID			
Not the second s	Azure	12/31/2033	mmm************	4 1946061 datid 4836 b6c2 d1be97 sb 🗅	Ŵ		
A Owners	Authentication Code	12/31/9999	aqE************	3 D	Ŵ		

Using secrets to prove application identity!

- 1. Services must send secret to other service
- 2. Security is on application layer



What happens is a certificate or secrets is stolen?

#### Problems:

- 1. If a certificate/secrets is compromised on one single service, I must invalidate it
- 2. Change certificate/secrets could be done on runtime but on cluster is complex
- 3. Certificates/Secrets must have an expire time

🔶 Example App   Cert	ificates & secrets 👒 🐇		
	₽ Got feedback?	Description	Enter a description for this client secret
Search (Ctrl+/)	Ar Got feedback?	Expires	Recommended: 6 months 🗸 🗸
Cverview 0	Credentials enable confidential applicat		Recommended: 6 months
Quickstart	addressable location (using an HTTPS s secret) as a credential.		3 months
💉 Integration assistant	secretj as a credential.		12 months
Manage	Certificates (0) Client secrets (0		18 months
🗮 Branding	A secret string that the application use		24 months
Authentication			Custom
📍 Certificates & secrets	+ New client secret		
Token configuration	Description		
<ul> <li>API permissions</li> </ul>	No client secrets have been created fc		
Expose an API			
K App roles			
A Owners			
• Palas and administration ( Paulas			

Service to handle secrets



HashiCorp Vault



Secrets management Centrally store, access, and deploy secrets across applications, systems, and infrastructure.	Dynamic secrets A dynamic secret is generated on demand and is unique to a client, instead of a static secret, which is defined ahead of time and shared.	Kubernetes secrets Install Vault using a Helm chart and then leverage Vault and Kubernetes to securely inject secrets into your application stack.	Database credential rotation Automatically rotate database passwords with Vault's database secrets engine.	AWS Secrets Manager
$\rightarrow$	<i>→</i>	$\rightarrow$	$\rightarrow$	
Automated PKI infrastructure Use Vault to quickly create X.509 certificates on demand and reduce the manual overhead.	Identity-based access Authenticate and access different clouds, systems, and endpoints using trusted identities.	Data encryption and tokenization Keep application data secure with one centralized workflow for data that resides in untrusted or semi- trusted systems outside of Vault.	Key management Use a standardized workflow for distribution and lifecycle management across KMS providers.	https://www.vaultproject.io/
$\rightarrow$	$\rightarrow$	$\rightarrow$	$\rightarrow$	

#### 111

# HashiCorp Vault Net APP

READ DATA FROM THE DATABASE USING THE VAULT MANAGED CREDENTIALS

```
static async Task Main(string[] args)
{
    // Initialize one of the several auth methods.
    IAuthMethodInfo authMethod = new TokenAuthMethodInfo("testtoken");
    // Initialize settings. You can also set proxies, custom delegates etc. here.
    var vaultClientSettings = new VaultClientSettings("http://localhost:8200", authMethod);
    IVaultClient vaultClient = new VaultClient(vaultClientSettings);
    var myKeys = await vaultClient.V1.Secrets.Cubbyhole.ReadSecretAsync("my-path");
}
```

DATABASE

#### Es 19: SecretsWithVault

How to use it?



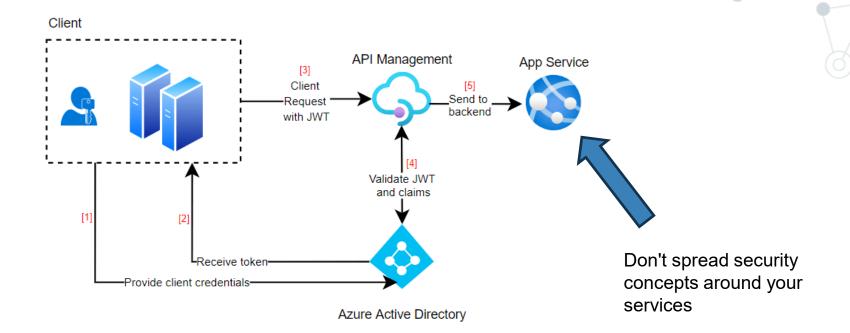


```
C#
SecretClientOptions options = new SecretClientOptions()
    {
        Retry =
            Delay= TimeSpan.FromSeconds(2),
            MaxDelay = TimeSpan.FromSeconds(16),
            MaxRetries = 5,
            Mode = RetryMode.Exponential
    };
var client = new SecretClient(new Uri("https://<your-unique-key-vault-name>.vault.azure.net/"), new DefaultAzu
KeyVaultSecret secret = client.GetSecret("<mySecret>");
string secretValue = secret.Value;
```

# • User Authorization



### User authentication/authorization



How can we manage Authorization in distributed application?

### Contexts

How can we manage Authorization in distributed application?

Context: a way to pass data between methods and grains

Set context



RequestContext.Set("UserRole", "Admin");

Get context



Statics methods but we are in a multi thread environment!

https://learn.microsoft.com/en-us/dotnet/orleans/grains/request-context

RequestContext.Get("UserRole");

https://learn.microsoft.com/en-us/aspnet/core/fundamentals/http-context

Es 20: MicrosoftOrleansRequestContext

### Contexts

AsyncLocal

Represents ambient data that is local to a given asynchronous control flow, such as an asynchronous method.

AsyncLocal<T> is used to persist a value across an asynchronous flow.

https://learn.microsoft.com/en-us/dotnet/api/system.threading.asynclocal-1?view=net-8.0

# **:NET** Aspire



A cloud ready stack for building observable, production ready, distributed applications

**First Preview Available Today** 

aka.ms/dotnet-aspire

**Engage with team on GitHub** 

github.com/dotnet/aspire

### .NET Aspire

.NET Aspire is an **opinionated** stack for building resilient, observable, and configurable cloud-native applications with .NET

var builder = DistributedApplication.CreateBuilder(args);

var apiservice = builder.AddProject<Projects.aspire\_ApiService>("apiservice");

```
builder.AddProject<Projects.aspire_Web>("webfrontend")
    .WithReference(apiservice);
```

builder.Build().Run();



### .NET Aspire: dashboard

🔺 aspire Dashboard								(9) 段
E Projects	Projects							
Containers	Name	State	Start Time	Process Id	Source Location	Endpoints	Environm	Logs
Executables	apiservice	Running	25/11/2023 15:29:48	39472	D:\Projects\github.com\Parallel and Distributed Programming\Aspire	http://localhost:5453/weatherf	View	View
⊫ Logs ~	webfrontend	Running	25/11/2023 15:29:48	39508	D:\Projects\github.com\Parallel and Distributed Programming\Aspire	http://localhost:5154	View	View
Project								
E Container								
E Executable								
📑 Structured								
🖪 Traces								
C <sub>al</sub> Metrics								



### .NET Aspire: deploy

#### https://learn.microsoft.com/en-us/dotnet/aspire/deployment/overview

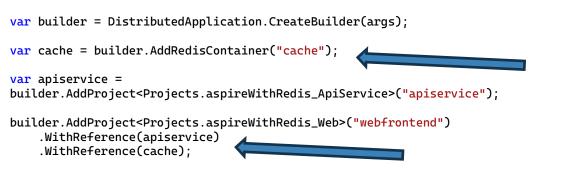
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< Previous Page 1 V of 1 Next >

Give feedback

dotnet run --project .\aspire.AppHost\aspire.AppHost.csproj --publisher
manifest --output-path aspire-manifest.json

### .NET Aspire: infrastructure as code



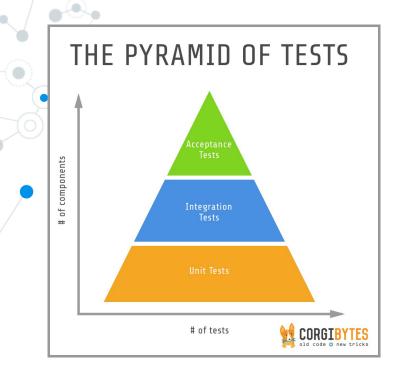
builder.Build().Run();

spireWithRedis Dashboard () 8										
E Projects	Containers							Q Filter		
Containers	Name	Container ID	State	Start Time	Container Image	Ports	Endpoints	Env Logs		
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https://www.youtube.com/watch?v=DORZA\_S7f9w https://www.youtube.com/watch?v=HYe6y1kBuGI

Es 22: Aspire with Redis

# Testing





### Unit test

```
public sealed class HelloGrain : Grain, IHelloGrain
    public HelloGrain()
    }
    public async Task<string> SayHello(string greeting)
        await Task.Delay(100);
        return $"Hello, {greeting}!";
    }
}
                                     namespace ProjectToTest.Tests
                                     {
                                         public class HelloGrainTests
                                         {
                                             [Fact]
                                             public async Task TestSayHello()
                                             Ł
                                                 // ARRANGE
                                                 var helloGrain = new HelloGrain();
                                                 // ACT
                                                 var result = await helloGrain.SayHello("Diego");
                                                 // ASSERT
                                                 Assert.Equal("Hello, Diego!", result);
                                             }
                                         }
                                     }
                                                                 Es 23: ProjectToTest
                                                                                                            124
```

### Unit test: mock a service



public sealed class HelloGrainUsingAService : Grain, IHelloGrainUsingAService
{
 private readonly IAService \_service;
 public HelloGrainUsingAService(IAService service)
 {
 \_service = service;
 }
 public async Task<int> Count()
 {
 return await \_service.GetCoundFromDataBase();
 }
}



## **NSubstitute**

A friendly substitute for .NET mocking libraries

Es 23: ProjectToTest

### Unit test: mock a service

}

}

```
public class HelloGrainUsingAServiceTests
{
    [Fact]
    public async Task TestCount()
    {
        // ARRANGE
        var service = Substitute.For<IAService>();
        service.GetCoundFromDataBase().Returns(5);
        var helloGrain = new HelloGrainUsingAService(service);
        // ACT
        var result = await helloGrain.Count();
        // ASSERT
        Assert.Equal(5, result);
    }
}
```

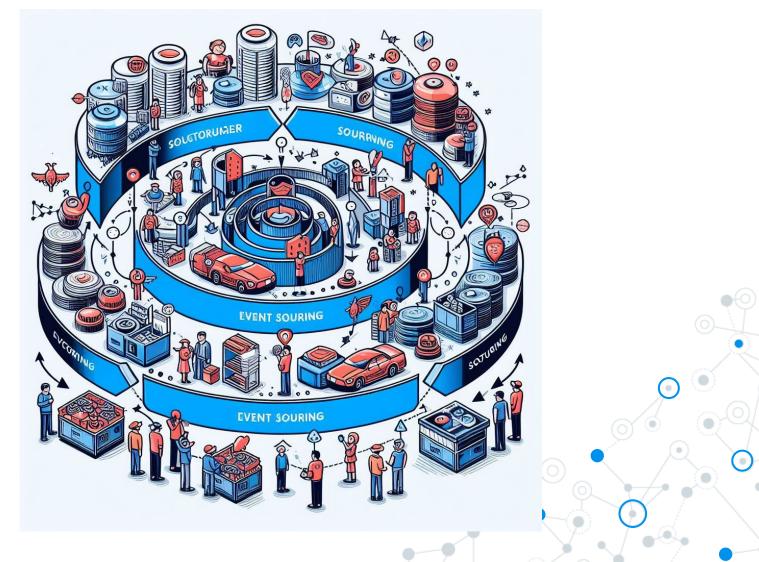
### Unit test: Orleans

The **Microsoft.Orleans.TestingHost** NuGet package contains **TestCluster** which can be used to create an in-memory cluster, comprised of two silos by default, which can be used to test grains.

```
public class HelloGrainTestsTestCluster
{
    [Fact]
    public async Task TestSayHello()
    {
        // ARRANGE
        var builder = new TestClusterBuilder();
        var cluster = builder.Build();
        cluster.Deploy();
        // ACT
        var hello = cluster.GrainFactory.GetGrain<IHelloGrain>("my-id");
        var result = await hello.SayHello("Diego");
        cluster.StopAllSilos();
        // ASSERT
        Assert.Equal("Hello, Diego!", result);
    }
}
```

https://learn.microsoft.com/en-us/dotnet/orleans/tutorials-and-samples/testing

# **Event Sourcing**



### Crud

Applications store their current state in a database:

- 1) Previous state is lost
- 2) No way to restore states
- 3) Store operation could be slow
- 4) Data update conflicts
- 5) History is lost

### Create - Read - Update - Delete

#### CRUD

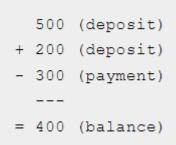
https://learn.microsoft.com/en-us/azure/architecture/patterns/event-sourcing

### **Event Sourcing**



Event Sourcing does not persist the current state of a record, but instead stores the individual changes as a series of deltas that led to the current state over time.

Similar to the way a bank manages an account

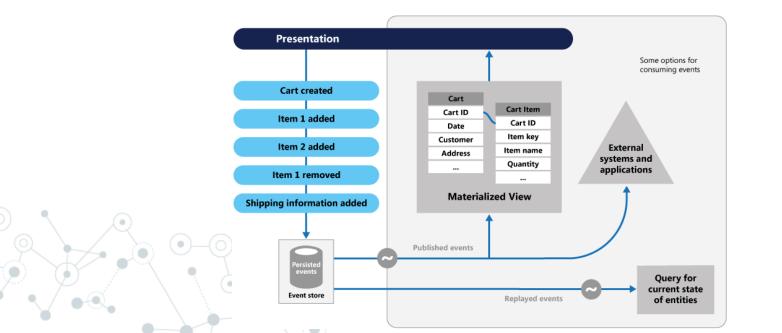


Events are immutable and can be stored using an append-only operation.

### Event Sourcing: storing data as events

**Event sourcing** is a Microservice design pattern that involves capturing all changes to an application's state as a **sequence of events**, rather than simply updating the state itself. Each event **represents a discrete change** to the system and is stored in an event log, which can be used to **reconstruct the system's state at any point in time**.

- 1) The complete history of changes is available for auditing purposes.
- 2) The ability to query the state of the system at any point in time.
- 3) Easy integration with distributed systems.
- 4) Event-driven systems can scale horizontally by adding more event consumers.
- 5) Easier to trace and diagnose issues by examining the event log.



**Event Sourcing: problems** 

### Complexity

Event sourcing can introduce complexity, especially in understanding the flow of events and reconstructing the current state from a series of events.

### Performance

the process of replaying events to rebuild state or responding to queries might impact performance, especially as the volume of events grows

### Storage

Storing every change as an event can lead to increased storage requirements compared to traditional CRUD-based approaches.

