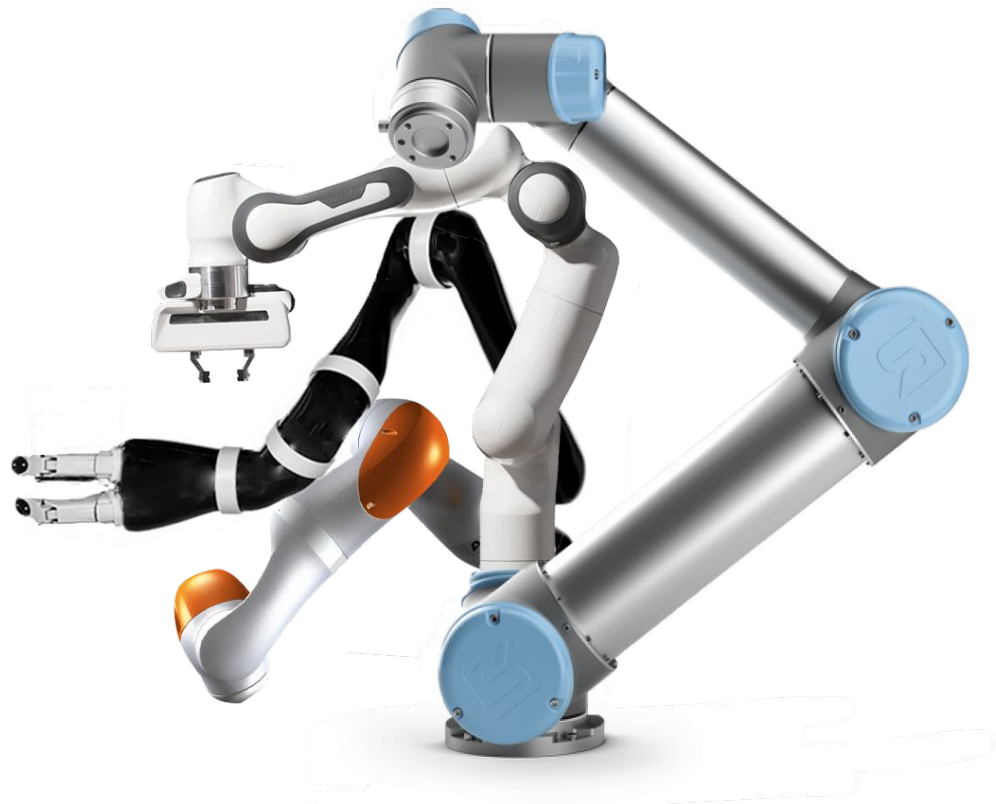


# Leveraging a Functional Approach for More Testable and Maintainable ROS 2 Code

BILAL GILL

# Outline

- Introduction
- Overview of ROS 2
- ROS 2 Conventional Approach
- Introduction to Functional Programming Principles
- Refactoring using Functional Programming Principles
- Conclusion



# Introduction

# About Me

- Robotics Engineer on the services team at PickNik Robotics
  - Contributed to a wide variety of client projects: remotely operated underwater inspection vehicles, autonomous mobile base for agriculture applications, and more
- Have worked at General Dynamics Electric Boat, MIT Lincoln Laboratory
- Interested in robotics since high school

# About PickNik Robotics

- **The Unstructured Robotics company**
  - Unstructured: When the robot is required to perform tasks that are not predetermined or predefined in an environment that may have a variety of obstacles, objects, or events occurring



# About PickNik Robotics

- *The* **Unstructured** Robotics company
  - Unstructured: When the robot is required to perform tasks that are not predetermined or predefined in an environment that may have a variety of obstacles, objects, or events occurring
- Main maintainers of MoveIt
  - MoveIt is an open source robotics manipulation platform for developing commercial applications, prototyping designs, and benchmarking algorithms



# About PickNik Robotics

- **The Unstructured Robotics company**
  - Unstructured: When the robot is required to perform tasks that are not predetermined or predefined in an environment that may have a variety of obstacles, objects, or events occurring
- **Main maintainers of MoveIt**
  - MoveIt is an open source robotics manipulation platform for developing commercial applications, prototyping designs, and benchmarking algorithms
- **Developing MoveIt Studio**
  - MoveIt Studio is a developer tool and SDK that leverages MoveIt to make it easier to create robotic arm applications





# About PickNik Robotics

- *The Unstructured Robotics company*
  - Unstructured: When the robot is required to perform tasks that are not predetermined or predefined in an environment that may have a variety of obstacles, objects, or events occurring
- Main maintainers of MoveIt
  - MoveIt is an open source robotics manipulation platform for developing commercial applications, prototyping designs, and benchmarking algorithms
- Developing MoveIt Studio
  - MoveIt Studio is a developer tool and SDK that leverages MoveIt to make it easier to create robotic arm applications
- Provide consulting services to companies that range from performing feasibility studies to developing robotics software and more





# Why use Robot Operating System?

- Robot Operating System (ROS) is the de facto middleware of choice across robotics academia and industry



# Why use Robot Operating System?

- Robot Operating System (ROS) is the de facto middleware of choice across robotics academia and industry
- According to the ROS 2022 Metrics Report, more than 740 companies use ROS!



# Why use Robot Operating System?

- Robot Operating System (ROS) is the de facto middleware of choice across robotics academia and industry
- According to the ROS 2022 Metrics Report, more than 740 companies use ROS!
- Using ROS allows PickNik to leverage open source software to quickly develop code



# Why give this talk?

- Engineers at PickNik experiment with different ways to architect code that uses ROS 2 – creating code that is easy to understand, test, maintain, and extend

# Why give this talk?

- Engineers at PickNik experiment with different ways to architect code that uses ROS 2 – creating code that is easy to understand, test, maintain, and extend
- At the end of a services project, code is handed over to the client

# Why give this talk?

- Engineers at PickNik experiment with different ways to architect code that uses ROS 2 – creating code that is easy to understand, test, maintain, and extend
- At the end of a services project, code is handed over to the client
- How can the client expect proper operation of the software once they start developing on top of it?



# Why give this talk?

- Engineers at PickNik experiment with different ways to architect code that uses ROS 2 – creating code that is easy to understand, test, maintain, and extend
- At the end of a services project, code is handed over to the client
- How can the client expect proper operation of the software once they start developing on top of it?

Answer: Tests and documentation! ***Lots and lots of documentation!***

# Why give this talk?

- Engineers at PickNik experiment with different ways to architect code that uses ROS 2 – creating code that is easy to understand, test, maintain, and extend
- At the end of a services project, code is handed over to the client
- How can the client expect proper operation of the software once they start developing on top of it?

Answer: Tests and documentation! ***Lots and lots of documentation!***

- ROS 2 documentation encourages an object-oriented paradigm that can lead to trouble writing code that achieves the goal

# Why give this talk?

- Engineers at PickNik experiment with different ways to architect code that uses ROS 2 – creating code that is easy to understand, test, maintain, and extend
- At the end of a services project, code is handed over to the client
- How can the client expect proper operation of the software once they start developing on top of it?

Answer: Tests and documentation! ***Lots and lots of documentation!***

- ROS 2 documentation encourages an object-oriented paradigm that can lead to trouble writing code that achieves the goal
- **Adopting functional programming techniques into our code has made it easier to test, maintain, and extend code!**

# Overview of ROS 2

# What is ROS 2?

- has a middleware layer that allows for message passing between different processes

# What is ROS 2?

- has a middleware layer that allows for message passing between different processes
- systems are made up of nodes that can
  - publish data to topics, subscribe to topics to receive data, act as a service client, act as a service server, act as an action client, or act as an action server



# What is ROS 2?

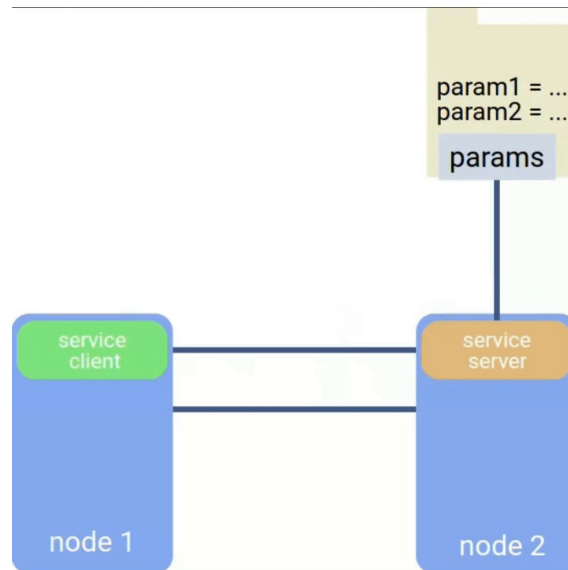
- has a middleware layer that allows for message passing between different processes
- systems are made up of nodes that can
  - publish data to topics, subscribe to topics to receive data, act as a service client, act as a service server, act as an action client, or act as an action server
  - provide configurable parameters which can be adjusted at run-time

# What is ROS 2?

- has a middleware layer that allows for message passing between different processes
- systems are made up of nodes that can
  - publish data to topics, subscribe to topics to receive data, act as a service client, act as a service server, act as an action client, or act as an action server
  - provide configurable parameters which can be adjusted at run-time
  - log telemetry data that is useful for introspection

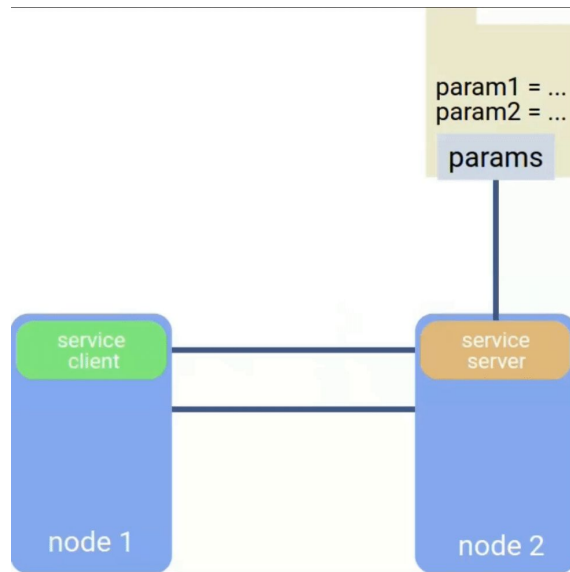
# What is ROS 2?

- In this ROS 2 example, there are 2 nodes in the system



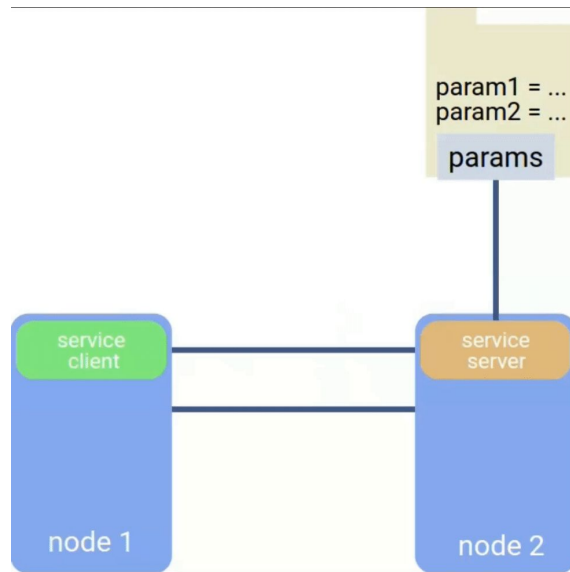
# What is ROS 2?

- In this ROS 2 example, there are 2 nodes in the system
  - Node 1 acts as a service client and sends requests to Node 2



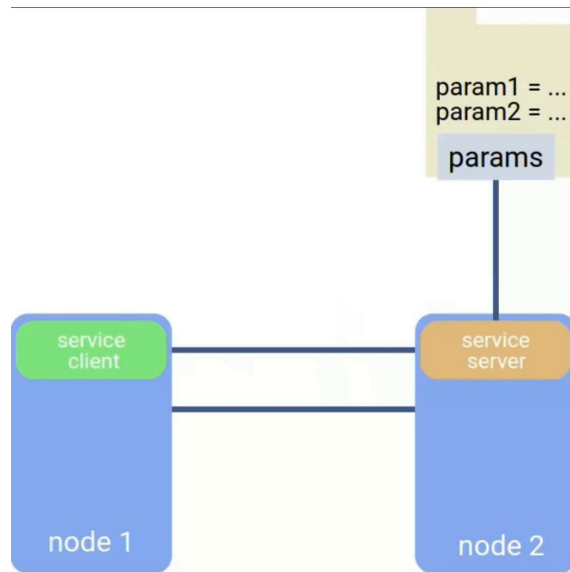
# What is ROS 2?

- In this ROS 2 example, there are 2 nodes in the system
  - Node 1 acts as a service client and sends requests to Node 2
  - Node 2 acts as a service server, receives requests from Node 1, and sends back responses



# What is ROS 2?

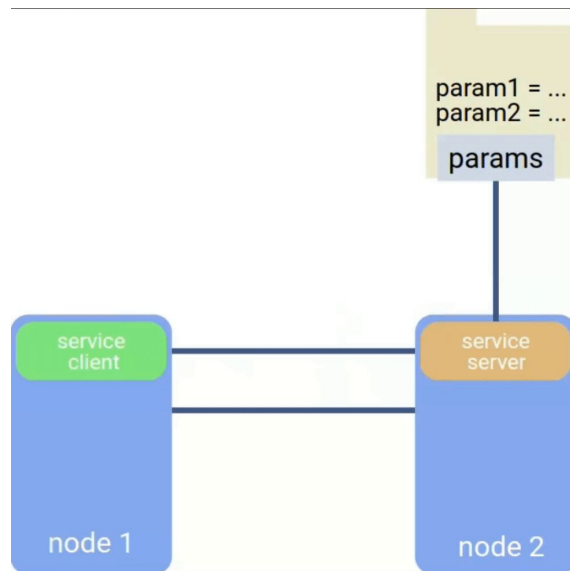
- In this ROS 2 example, there are 2 nodes in the system
  - Node 1 acts as a service client and sends requests to Node 2
  - Node 2 acts as a service server, receives requests from Node 1, and sends back responses
    - Node 2 also uses parameters at run-time to change its behavior





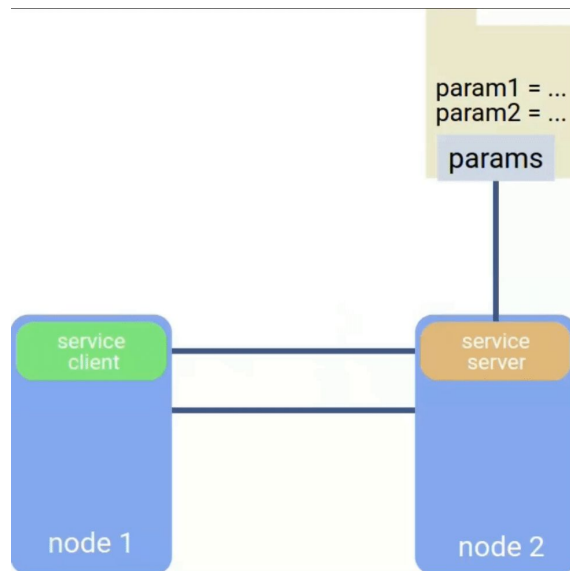
# What is ROS 2?

- In this ROS 2 example, there are 2 nodes in the system
  - Node 1 acts as a service client and sends requests to Node 2
  - Node 2 acts as a service server, receives requests from Node 1, and sends back responses
    - Node 2 also uses parameters at run-time to change its behavior
- Each node should be responsible for a single, modular purpose, (e.g. controlling the wheel motors or publishing the sensor data from a laser range-finder)



# What is ROS 2?

- In this ROS 2 example, there are 2 nodes in the system
  - Node 1 acts as a service client and sends requests to Node 2
  - Node 2 acts as a service server, receives requests from Node 1, and sends back responses
    - Node 2 also uses parameters at run-time to change its behavior
- Each node should be responsible for a single, modular purpose, (e.g. controlling the wheel motors or publishing the sensor data from a laser range-finder)
- The publishing/subscribing of data and service requests is done via the ROS 2 API



# Motivating Example

- Problem: A robot wants to navigate from its current location to some goal



# Motivating Example

- Problem: A robot wants to navigate from its current location to some goal
- The robot needs to know where obstacles are located in its environment



# Motivating Example

- Problem: A robot wants to navigate from its current location to some goal
- The robot needs to know where obstacles are located in its environment
- Enter: The occupancy map
  - A data structure used to represent the environment around a robot in terms of how “occupied” the cells in the map are



# Motivating Example

- Problem: A robot wants to navigate from its current location to some goal
- The robot needs to know where obstacles are located in its environment
- Enter: The occupancy map
  - A data structure used to represent the environment around a robot in terms of how “occupied” the cells in the map are
- Assumption: The robot knows its location in the occupancy map at all times





# Motivating Example

- Problem: A robot wants to navigate from its current location to some goal
- The robot needs to know where obstacles are located in its environment
- Enter: The occupancy map
  - A data structure used to represent the environment around a robot in terms of how “occupied” the cells in the map are
- Assumption: The robot knows its location in the occupancy map at all times
- Solution: The robot will send a request to a ROS 2 service that generates a path from the robot’s current location and goal location, given an occupancy map



# ROS 2 Conventional Approach

# Conventional Approach

```
class PathGenerator : public rclcpp::Node {
public:
    explicit PathGenerator(
        rclcpp::NodeOptions const& options = rclcpp::NodeOptions{})
        : Node("path_generator", options);

private:
    void set_map_service(
        const std::shared_ptr<example_srvs::srv::SetMap::Request> request,
        std::shared_ptr<example_srvs::srv::SetMap::Response> response);

    void generate_path_service(
        const std::shared_ptr<example_srvs::srv::GetPath::Request> request,
        std::shared_ptr<example_srvs::srv::GetPath::Response> response);

    bool set_costmap(const std_msgs::msg::UInt8MultiArray& costmap);

    Path generate_global_path(Position const& start, Position const& goal);

    Map<unsigned char> map_;
    int robot_size_;
    std::unique_ptr<CollisionChecker<unsigned char>> is_occupied_;
    rclcpp::Service<example_srvs::srv::SetMap>::SharedPtr map_setter_service_;
    rclcpp::Service<example_srvs::srv::GetPath>::SharedPtr path_generator_service_;
};
```

- PathGenerator will be used to generate the path for our robot
- This code was written using example code available from the ROS 2 documentation
- This implementation follows an object oriented approach

# Conventional Approach

```
class PathGenerator : public rclcpp::Node {
public:
    explicit PathGenerator(
        rclcpp::NodeOptions const& options = rclcpp::NodeOptions{})
        : Node("path_generator", options);

private:
    void set_map_service(
        const std::shared_ptr<example_srvs::srv::SetMap::Request> request,
        std::shared_ptr<example_srvs::srv::SetMap::Response> response);

    void generate_path_service(
        const std::shared_ptr<example_srvs::srv::GetPath::Request> request,
        std::shared_ptr<example_srvs::srv::GetPath::Response> response);

    bool set_costmap(const std_msgs::msg::UInt8MultiArray& costmap);

    Path generate_global_path(Position const& start, Position const& goal);

    Map<unsigned char> map_;
    int robot_size_;
    std::unique_ptr<CollisionChecker<unsigned char>> is_occupied_;
    rclcpp::Service<example_srvs::srv::SetMap>::SharedPtr map_setter_service_;
    rclcpp::Service<example_srvs::srv::GetPath>::SharedPtr path_generator_service_;
};
```

- PathGenerator inherits from rclcpp::Node making it inextricably linked to the ROS 2 API

# Conventional Approach

```
class PathGenerator : public rclcpp::Node {
public:
    explicit PathGenerator(
        rclcpp::NodeOptions const& options = rclcpp::NodeOptions{})
        : Node("path_generator", options);

private:
    void set_map_service(
        const std::shared_ptr<example_srvs::srv::SetMap::Request> request,
        std::shared_ptr<example_srvs::srv::SetMap::Response> response);

    void generate_path_service(
        const std::shared_ptr<example_srvs::srv::GetPath::Request> request,
        std::shared_ptr<example_srvs::srv::GetPath::Response> response);

    bool set_costmap(const std_msgs::msg::UInt8MultiArray& costmap);

    Path generate_global_path(Position const& start, Position const& goal);

    Map<unsigned char> map_;
    int robot_size_;
    std::unique_ptr<CollisionChecker<unsigned char>> is_occupied_;
    rclcpp::Service<example_srvs::srv::SetMap>::SharedPtr map_setter_service_;
    rclcpp::Service<example_srvs::srv::GetPath>::SharedPtr path_generator_service_;
};
```

- PathGenerator inherits from `rclcpp::Node` making it inextricably linked to the ROS 2 API
- `set_map_service` and `generate_path_service` are callback functions that run when requests are sent via the ROS 2 middleware

# Conventional Approach

```
class PathGenerator : public rclcpp::Node {
public:
    explicit PathGenerator(
        rclcpp::NodeOptions const& options = rclcpp::NodeOptions{})
        : Node("path_generator", options);

private:
    void set_map_service(
        const std::shared_ptr<example_srvs::srv::SetMap::Request> request,
        std::shared_ptr<example_srvs::srv::SetMap::Response> response);

    void generate_path_service(
        const std::shared_ptr<example_srvs::srv::GetPath::Request> request,
        std::shared_ptr<example_srvs::srv::GetPath::Response> response);

    bool set_costmap(const std_msgs::msg::UInt8MultiArray& costmap);

    Path generate_global_path(Position const& start, Position const& goal);

    Map<unsigned char> map_;
    int robot_size_;
    std::unique_ptr<CollisionChecker<unsigned char>> is_occupied_;
    rclcpp::Service<example_srvs::srv::SetMap>::SharedPtr map_setter_service_;
    rclcpp::Service<example_srvs::srv::GetPath>::SharedPtr path_generator_service_;
};
```

- PathGenerator inherits from rclcpp::Node making it inextricably linked to the ROS 2 API
- set\_map\_service and generate\_path\_service are callback functions that run when requests are sent via the ROS 2 middleware
- Those functions call the set\_costmap and generate\_global\_path functions, which are private functions that contain the actual business logic

# Conventional Approach

```
class PathGenerator : public rclcpp::Node {
public:
    explicit PathGenerator(
        rclcpp::NodeOptions const& options = rclcpp::NodeOptions{})
        : Node("path_generator", options);

private:
    void set_map_service(
        const std::shared_ptr<example_srvs::srv::SetMap::Request> request,
        std::shared_ptr<example_srvs::srv::SetMap::Response> response);

    void generate_path_service(
        const std::shared_ptr<example_srvs::srv::GetPath::Request> request,
        std::shared_ptr<example_srvs::srv::GetPath::Response> response);

    bool set_costmap(const std_msgs::msg::UInt8MultiArray& costmap);

    Path generate_global_path(Position const& start, Position const& goal);

    Map<unsigned char> map_;
    int robot_size_;
    std::unique_ptr<CollisionChecker<unsigned char>> is_occupied_;
    rclcpp::Service<example_srvs::srv::SetMap>::SharedPtr map_setter_service_;
    rclcpp::Service<example_srvs::srv::GetPath>::SharedPtr path_generator_service_;
};
```

- PathGenerator inherits from rclcpp::Node making it inextricably linked to the ROS 2 API
- set\_map\_service and generate\_path\_service are callback functions that run when requests are sent via the ROS 2 middleware
- Those functions call the set\_costmap and generate\_global\_path functions, which are private functions that contain the actual business logic
- Let's take a look at the PathGenerator constructor

# Conventional Approach

```
class PathGenerator : public rclcpp::Node {
public:
    explicit PathGenerator(rclcpp::NodeOptions const& options = rclcpp::NodeOptions{})
        : Node("path_generator", options) {
        robot_size_ = this->declare_parameter<int>("robot_size", 1);
        is_occupied_ = std::make_unique<CollisionChecker<unsigned char>>(robot_size_);

        // Services for setting the map and generating the path
        map_setter_service_ =
            this->create_service<example_srvs::srv::SetMap>("set_costmap",
                std::bind(&PathGenerator::set_map_service, this,
                    std::placeholders::_1, std::placeholders::_2));
        path_generator_service_ =
            this->create_service<example_srvs::srv::GetPath>("generate_global_path",
                std::bind(&PathGenerator::generate_path_service, this,
                    std::placeholders::_1, std::placeholders::_2));
    }

private:
    void set_map_service(
        const std::shared_ptr<example_srvs::srv::SetMap::Request> request,
        std::shared_ptr<example_srvs::srv::SetMap::Response> response);

    void generate_path_service(
        const std::shared_ptr<example_srvs::srv::GetPath::Request> request,
        std::shared_ptr<example_srvs::srv::GetPath::Response> response);

    /* Additional private methods and members */
};
```

- robot\_size\_ is a parameter that is required to construct a CollisionChecker object
- It is common in ROS to fetch parameters in the constructor of the Node
- This leads to the pattern of dynamically allocating the object because it cannot be initialized in the initializer list of the class



# Conventional Approach

```
class PathGenerator : public rclcpp::Node {
public:
    explicit PathGenerator(rclcpp::NodeOptions const& options = rclcpp::NodeOptions{})
        : Node("path_generator", options) {
        robot_size_ = this->declare_parameter<int>("robot_size", 1);
        is_occupied_ = std::make_unique<CollisionChecker<unsigned char>>(robot_size_);

        // Services for setting the map and generating the path
        map_setter_service_ =
            this->create_service<example_srvs::srv::SetMap>("set_costmap",
                std::bind(&PathGenerator::set_map_service, this,
                    std::placeholders::_1, std::placeholders::_2));
        path_generator_service_ =
            this->create_service<example_srvs::srv::GetPath>("generate_global_path",
                std::bind(&PathGenerator::generate_path_service, this,
                    std::placeholders::_1, std::placeholders::_2));
    }

private:
    void set_map_service(
        const std::shared_ptr<example_srvs::srv::SetMap::Request> request,
        std::shared_ptr<example_srvs::srv::SetMap::Response> response);

    void generate_path_service(
        const std::shared_ptr<example_srvs::srv::GetPath::Request> request,
        std::shared_ptr<example_srvs::srv::GetPath::Response> response);

    /* Additional private methods and members */
};
```

- robot\_size\_ is a parameter that is required to construct a CollisionChecker object
- It is common in ROS to fetch parameters in the constructor of the Node
- This leads to the pattern of dynamically allocating the object because it cannot be initialized in the initializer list of the class
- map\_setter\_service\_ and path\_generator\_service\_ are two servers that execute the set\_map\_service and generate\_path\_service as callbacks

# Conventional Approach

```
class PathGenerator : public rclcpp::Node {
public:
    explicit PathGenerator(rclcpp::NodeOptions const& options = rclcpp::NodeOptions{})
        : Node("path_generator", options) {
        robot_size_ = this->declare_parameter<int>("robot_size", 1);
        is_occupied_ = std::make_unique<CollisionChecker<unsigned char>>(robot_size_);

        // Services for setting the map and generating the path
        map_setter_service_ =
            this->create_service<example_srvs::srv::SetMap>("set_costmap",
                std::bind(&PathGenerator::set_map_service, this,
                    std::placeholders::_1, std::placeholders::_2));
        path_generator_service_ =
            this->create_service<example_srvs::srv::GetPath>("generate_global_path",
                std::bind(&PathGenerator::generate_path_service, this,
                    std::placeholders::_1, std::placeholders::_2));
    }

private:
    void set_map_service(
        const std::shared_ptr<example_srvs::srv::SetMap::Request> request,
        std::shared_ptr<example_srvs::srv::SetMap::Response> response);

    void generate_path_service(
        const std::shared_ptr<example_srvs::srv::GetPath::Request> request,
        std::shared_ptr<example_srvs::srv::GetPath::Response> response);

    /* Additional private methods and members */
};
```

- robot\_size\_ is a parameter that is required to construct a CollisionChecker object
- It is common in ROS to fetch parameters in the constructor of the Node
- This leads to the pattern of dynamically allocating the object because it cannot be initialized in the initializer list of the class
- map\_setter\_service\_ and path\_generator\_service\_ are two servers that execute the set\_map\_service and generate\_path\_service as callbacks
- Let's take a closer look at generate\_path\_service

# Conventional Approach

```
void generate_path_service(  
const std::shared_ptr<example_srvs::srv::GetPath::Request> request,  
    std::shared_ptr<example_srvs::srv::GetPath::Response> response) {  
    if (map_.get_data().size() == 0) {  
        RCLCPP_ERROR_STREAM(this->get_logger(), "MAP IS EMPTY!!");  
        response->code.code = example_srvs::msg::GetPathCodes::EMPTY_OCCUPANCY_MAP;  
        response->path = std_msgs::UInt8MultiArray();  
        return;  
    }  
    /* More error pre-checks */  
  
    auto const start = Position{request->start.data[0], request->start.data[1]};  
    auto const goal = Position{request->goal.data[0], request->goal.data[1]};  
  
    // Generate the path  
    auto const path = generate_global_path(start, goal);  
  
    // Start populating the response message  
    auto response_path = std_msgs::UInt8MultiArray();  
  
    /* Code about populating the message here */  
  
    response->code.code = !path.empty() ? example_srvs::msg::GetPathCodes::SUCCESS :  
example_srvs::msg::GetPathCodes::NO_VALID_PATH;  
    response->path = response_path;  
}
```

# Conventional Approach

```
void generate_path_service(  
const std::shared_ptr<example_srvs::srv::GetPath::Request> request,  
    std::shared_ptr<example_srvs::srv::GetPath::Response> response) {  
    if (map_.get_data().size() == 0) {  
        RCLCPP_ERROR_STREAM(this->get_logger(), "MAP IS EMPTY!!");  
        response->code.code = example_srvs::msg::GetPathCodes::EMPTY_OCCUPANCY_MAP;  
        response->path = std_msgs::UInt8MultiArray();  
        return;  
    }  
    /* More error pre-checks */  
  
    auto const start = Position{request->start.data[0], request->start.data[1]};  
    auto const goal = Position{request->goal.data[0], request->goal.data[1]};  
  
    // Generate the path  
    auto const path = generate_global_path(start, goal);  
  
    // Start populating the response message  
    auto response_path = std_msgs::UInt8MultiArray();  
  
    /* Code about populating the message here */  
  
    response->code.code = !path.empty() ? example_srvs::msg::GetPathCodes::SUCCESS :  
example_srvs::msg::GetPathCodes::NO_VALID_PATH;  
    response->path = response_path;  
}
```

- response is an out parameter that is set in the function

# Conventional Approach

```
void generate_path_service(  
const std::shared_ptr<example_srvs::srv::GetPath::Request> request,  
    std::shared_ptr<example_srvs::srv::GetPath::Response> response) {  
    if (map.get_data().size() == 0) {  
        RCLCPP_ERROR_STREAM(this->get_logger(), "MAP IS EMPTY!!");  
        response->code.code = example_srvs::msg::GetPathCodes::EMPTY_OCCUPANCY_MAP;  
        response->path = std_msgs::msg::UInt8MultiArray();  
        return;  
    }  
    /* More error pre-checks */  
  
    auto const start = Position{request->start.data[0], request->start.data[1]};  
    auto const goal = Position{request->goal.data[0], request->goal.data[1]};  
  
    // Generate the path  
    auto const path = generate_global_path(start, goal);  
  
    // Start populating the response message  
    auto response_path = std_msgs::msg::UInt8MultiArray();  
  
    /* Code about populating the message here */  
  
    response->code.code = !path.empty() ? example_srvs::msg::GetPathCodes::SUCCESS :  
example_srvs::msg::GetPathCodes::NO_VALID_PATH;  
    response->path = response_path;  
}
```

- response is an out parameter that is set in the function
- Error handling is done both by printing to logs and returning an error code via the service response

# Conventional Approach

```
void generate_path_service(  
const std::shared_ptr<example_srvs::srv::GetPath::Request> request,  
    std::shared_ptr<example_srvs::srv::GetPath::Response> response) {  
    if (map_.get_data().size() == 0) {  
        RCLCPP_ERROR_STREAM(this->get_logger(), "MAP IS EMPTY!!");  
        response->code.code = example_srvs::msg::GetPathCodes::EMPTY_OCCUPANCY_MAP;  
        response->path = std_msgs::msg::UInt8MultiArray();  
        return;  
    }  
    /* More error pre-checks */  
  
    auto const start = Position{request->start.data[0], request->start.data[1]};  
    auto const goal = Position{request->goal.data[0], request->goal.data[1]};  
  
    // Generate the path  
    auto const path = generate_global_path(start, goal);  
  
    // Start populating the response message  
    auto response_path = std_msgs::msg::UInt8MultiArray();  
  
    /* Code about populating the message here */  
  
    response->code.code = !path.empty() ? example_srvs::msg::GetPathCodes::SUCCESS :  
example_srvs::msg::GetPathCodes::NO_VALID_PATH;  
    response->path = response_path;  
}
```

- response is an out parameter that is set in the function
- Error handling is done both by printing to logs and returning an error code via the service response
- `generate_global_path` is the function that generates the path and cannot be tested directly, since it is a private function
- The occupancy map used by `generate_global_path` is a private member variable, tying this algorithm to the class

# Limitations of the Conventional Approach

- Tight coupling between the path generating algorithm and the runtime API
  - By inheriting from `rclcpp::Node`, the `PathGenerator` is tightly coupled with the ROS 2 API
  - Testing the code is challenging without involving ROS 2 specifics

# Limitations of the Conventional Approach

- Tight coupling between the path generating algorithm and the runtime API
  - By inheriting from `rclcpp::Node`, the `PathGenerator` is tightly coupled with the ROS 2 API
  - Testing the code is challenging without involving ROS 2 specifics
- The `PathGenerator` class is doing multiple things: managing ROS 2 communication, performing calculations, and implementing logic
  - Doesn't follow Separation of Concerns and can even be considered to violate the Single Responsibility Principle



# Limitations of the Conventional Approach

- Tight coupling between the path generating algorithm and the runtime API
  - By inheriting from `rcpp::Node`, the `PathGenerator` is tightly coupled with the ROS 2 API
  - Testing the code is challenging without involving ROS 2 specifics
- The `PathGenerator` class is doing multiple things: managing ROS 2 communication, performing calculations, and implementing logic
  - Doesn't follow Separation of Concerns and can even be considered to violate the Single Responsibility Principle
- Inflexibility of extensions
  - Implementing more features or handling more types of services will cause the class to grow quickly
  - Data are private variables, which causes the algorithms to be coupled with the class

# Testing the Conventional Approach

```
class TaskPlanningFixture : public testing::Test {
protected:
    // Adapted from minimal_integration_test
    TaskPlanningFixture() : node_(std::make_shared<rclcpp::Node>("test_client")) {
        // Create ROS2 clients to set the map and calculate the path
        map_setter_client_ =
node_->create_client<example_srvs::srv::SetMap>("set_costmap");

        path_generator_client_ =
node_->create_client<example_srvs::srv::GetPath>("generate_global_path");
    }

    rclcpp::FutureReturnCode populateAndSetMap();

    std::pair<example_srvs::srv::GetPath::Response::SharedPtr, rclcpp::FutureReturnCode>
    sendPathRequest(const example_srvs::srv::GetPath::Request::SharedPtr request);

    // Member variables
    rclcpp::Node::SharedPtr node_;

    rclcpp::Client<example_srvs::srv::SetMap>::SharedPtr map_setter_client_;
    rclcpp::Client<example_srvs::srv::GetPath>::SharedPtr path_generator_client_;
};
```

# Testing the Conventional Approach

```
class TaskPlanningFixture : public testing::Test {
protected:
    // Adapted from minimal_integration_test
    TaskPlanningFixture() : node_(std::make_shared<rclcpp::Node>("test_client")) {
        // Create ROS2 clients to set the map and calculate the path
        map_setter_client_ =
node_->create_client<example_srvs::srv::SetMap>("set_costmap");

        path_generator_client_ =
node_->create_client<example_srvs::srv::GetPath>("generate_global_path");
    }

    rclcpp::FutureReturnCode populateAndSetMap();

    std::pair<example_srvs::srv::GetPath::Response::SharedPtr, rclcpp::FutureReturnCode>
    sendPathRequest(const example_srvs::srv::GetPath::Request::SharedPtr request);

    // Member variables
    rclcpp::Node::SharedPtr node_;

    rclcpp::Client<example_srvs::srv::SetMap>::SharedPtr map_setter_client_;
    rclcpp::Client<example_srvs::srv::GetPath>::SharedPtr path_generator_client_;
};
```

- Testing the conventional approach requires creating run-time clients to send requests to the PathGenerator service

# Testing the Conventional Approach

```
class TaskPlanningFixture : public testing::Test {
protected:
    // Adapted from minimal_integration_test
    TaskPlanningFixture() : node_(std::make_shared<rclcpp::Node>("test_client")) {
        // Create ROS2 clients to set the map and calculate the path
        map_setter_client_ =
node_->create_client<example_srvs::srv::SetMap>("set_costmap");

        path_generator_client_ =
node_->create_client<example_srvs::srv::GetPath>("generate_global_path");
    }

    rclcpp::FutureReturnCode populateAndSetMap();

    std::pair<example_srvs::srv::GetPath::Response::SharedPtr, rclcpp::FutureReturnCode>
sendPathRequest(const example_srvs::srv::GetPath::Request::SharedPtr request);

    // Member variables
    rclcpp::Node::SharedPtr node_;

    rclcpp::Client<example_srvs::srv::SetMap>::SharedPtr map_setter_client_;
    rclcpp::Client<example_srvs::srv::GetPath>::SharedPtr path_generator_client_;
};
```

- Testing the conventional approach requires creating run-time clients to send requests to the PathGenerator service
- Additional utility functions are needed to keep tests concise
- This is additional code and logic also invokes the run-time environment

# Testing the Conventional Approach

```
class TaskPlanningFixture : public testing::Test {
protected:
    // Adapted from minimal_integration_test
    TaskPlanningFixture() : node_(std::make_shared<rclcpp::Node>("test_client")) {
        // Create ROS2 clients to set the map and calculate the path
        map_setter_client_ =
node_->create_client<example_srvs::srv::SetMap>("set_costmap");

        path_generator_client_ =
node_->create_client<example_srvs::srv::GetPath>("generate_global_path");
    }

    rclcpp::FutureReturnCode populateAndSetMap();

    std::pair<example_srvs::srv::GetPath::Response::SharedPtr, rclcpp::FutureReturnCode>
    sendPathRequest(const example_srvs::srv::GetPath::Request::SharedPtr request);

    // Member variables
    rclcpp::Node::SharedPtr node_;

    rclcpp::Client<example_srvs::srv::SetMap>::SharedPtr map_setter_client_;
    rclcpp::Client<example_srvs::srv::GetPath>::SharedPtr path_generator_client_;
};
```

- Note the `rclcpp::Node` member variable
- This is another common pattern used to create an interface with the ROS 2 API (as opposed to inheriting from `rclcpp::Node`)

# Testing the Conventional Approach

```
class TaskPlanningFixture : public testing::Test {
protected:
    // Adapted from minimal_integration_test
    TaskPlanningFixture() : node_(std::make_shared<rclcpp::Node>("test_client")) {
        // Create ROS2 clients to set the map and calculate the path
        map_setter_client_ =
node_->create_client<example_srvs::srv::SetMap>("set_costmap");

        path_generator_client_ =
node_->create_client<example_srvs::srv::GetPath>("generate_global_path");
    }

    rclcpp::FutureReturnCode populateAndSetMap();

    std::pair<example_srvs::srv::GetPath::Response::SharedPtr, rclcpp::FutureReturnCode>
    sendPathRequest(const example_srvs::srv::GetPath::Request::SharedPtr request);

    // Member variables
    rclcpp::Node::SharedPtr node_;

    rclcpp::Client<example_srvs::srv::SetMap>::SharedPtr map_setter_client_;
    rclcpp::Client<example_srvs::srv::GetPath>::SharedPtr path_generator_client_;
};
```

- Note the `rclcpp::Node` member variable
- This is another common pattern used to create an interface with the ROS 2 API (as opposed to inheriting from `rclcpp::Node`)
- Let's take a closer look at `sendPathRequest`, a utility function used in tests

# Testing the Conventional Approach

```
std::pair<example_srvs::srv::GetPath::Response::SharedPtr, rclcpp::FutureReturnCode>
sendPathRequest( const example_srvs::srv::GetPath::Request::SharedPtr request) {
    while (!path_generator_client_->wait_for_service(1s)) {
        if (!rclcpp::ok()) {
            RCLCPP_ERROR_STREAM(
                node_->get_logger(),
                "Interrupted while waiting for path generator service. Exiting.");
            return {std::make_shared<example_srvs::srv::GetPath::Response>(),
                    rclcpp::FutureReturnCode::TIMEOUT};
        }
        RCLCPP_INFO_STREAM(
            node_->get_logger(),
            "Path generator service not available, waiting again...");
    }

    auto generate_path_result = path_generator_client_->async_send_request(request);

    return std::make_pair(generate_path_result.get(),
        rclcpp::spin_until_future_complete(node_, generate_path_result));
}
```

# Testing the Conventional Approach

```
std::pair<example_srvs::srv::GetPath::Response::SharedPtr, rclcpp::FutureReturnCode>
sendPathRequest( const example_srvs::srv::GetPath::Request::SharedPtr request) {
    while (!path_generator_client_->wait_for_service(1s)) {
        if (!rclcpp::ok()) {
            RCLCPP_ERROR_STREAM(
                node_->get_logger(),
                "Interrupted while waiting for path generator service. Exiting.");
            return {std::make_shared<example_srvs::srv::GetPath::Response>(),
                    rclcpp::FutureReturnCode::TIMEOUT};
        }
        RCLCPP_INFO_STREAM(
            node_->get_logger(),
            "Path generator service not available, waiting again...");
    }

    auto generate_path_result = path_generator_client_->async_send_request(request);

    return std::make_pair(generate_path_result.get(),
        rclcpp::spin_until_future_complete(node_, generate_path_result));
}
```

- There is a loop that waits for the service to become available



# Testing the Conventional Approach

```
std::pair<example_srvs::srv::GetPath::Response::SharedPtr, rclcpp::FutureReturnCode>
sendPathRequest( const example_srvs::srv::GetPath::Request::SharedPtr request) {
    while (!path_generator_client_->wait_for_service(1s)) {
        if (!rclcpp::ok()) {
            RCLCPP_ERROR_STREAM(
                node_->get_logger(),
                "Interrupted while waiting for path generator service. Exiting.");
            return {std::make_shared<example_srvs::srv::GetPath::Response>(),
                    rclcpp::FutureReturnCode::TIMEOUT};
        }
        RCLCPP_INFO_STREAM(
            node_->get_logger(),
            "Path generator service not available, waiting again...");
    }

    auto generate_path_result = path_generator_client_->async_send_request(request);

    return std::make_pair(generate_path_result.get(),
        rclcpp::spin_until_future_complete(node_, generate_path_result));
}
```

- There is a loop that waits for the service to become available
- sendPathRequest sends an asynchronous request to the generate\_global\_path service

# Testing the Conventional Approach

```
std::pair<example_srvs::srv::GetPath::Response::SharedPtr, rclcpp::FutureReturnCode>
sendPathRequest( const example_srvs::srv::GetPath::Request::SharedPtr request) {
    while (!path_generator_client_->wait_for_service(1s)) {
        if (!rclcpp::ok()) {
            RCLCPP_ERROR_STREAM(
                node_->get_logger(),
                "Interrupted while waiting for path generator service. Exiting.");
            return {std::make_shared<example_srvs::srv::GetPath::Response>(),
                    rclcpp::FutureReturnCode::TIMEOUT};
        }
        RCLCPP_INFO_STREAM(
            node_->get_logger(),
            "Path generator service not available, waiting again...");
    }

    auto generate_path_result = path_generator_client_->async_send_request(request);

    return std::make_pair(generate_path_result.get(),
        rclcpp::spin_until_future_complete(node_, generate_path_result));
}
```

- There is a loop that waits for the service to come available
- sendPathRequest sends an asynchronous request to the generate\_global\_path service
- **Involving the middleware into the testing process is where flakiness can be introduced**

# Testing the Conventional Approach

```
std::pair<example_srvs::srv::GetPath::Response::SharedPtr, rclcpp::FutureReturnCode>
sendPathRequest( const example_srvs::srv::GetPath::Request::SharedPtr request) {
    while (!path_generator_client_->wait_for_service(1s)) {
        if (!rclcpp::ok()) {
            RCLCPP_ERROR_STREAM(
                node_->get_logger(),
                "Interrupted while waiting for path generator service. Exiting.");
            return {std::make_shared<example_srvs::srv::GetPath::Response>(),
                    rclcpp::FutureReturnCode::TIMEOUT};
        }
        RCLCPP_INFO_STREAM(
            node_->get_logger(),
            "Path generator service not available, waiting again...");
    }

    auto generate_path_result = path_generator_client_->async_send_request(request);

    return std::make_pair(generate_path_result.get(),
        rclcpp::spin_until_future_complete(node_, generate_path_result));
}
```

- There is a loop that waits for the service to come available
- sendPathRequest sends an asynchronous request to the generate\_global\_path service
- Involving the middleware into the testing process is where flakiness can be introduced
- When unit testing core logic, inter-process communication should be avoided
- Let's look at a test

# Testing the Conventional Approach

```
TEST_F(TaskPlanningFixture, no_path) {
    auto executor = std::make_shared<rcpp::executors::SingleThreadedExecutor>();
    std::thread executor_thread;

    auto const pg = std::make_shared<PathGenerator>();

    executor->add_node(pg);
    executor_thread = std::thread([&executor]() { executor->spin(); });

    // GIVEN a populated costmap that is set without error
    auto const return_code = populateAndSetMap();

    EXPECT_EQ(return_code, rcpp::FutureReturnCode::SUCCESS)
        << "Setting the map failed";

    // WHEN a path is requested between two positions that do not have a valid
    // path between them given the algorithm
    auto const request = std::make_shared<example_srvs::srv::GetPath::Request>();

    request->start.data = {2, 2};
    request->goal.data = {5, 5};

    auto const result = sendPathRequest(request);

    EXPECT_EQ(result.second, rcpp::FutureReturnCode::SUCCESS) << "Generating path
failed";

    // THEN the global path produced should be empty
    std::vector<Position> const expected{};
    EXPECT_EQ(result.first->code.code, example_srvs::msg::GetPathCodes::NO_VALID_PATH);
    EXPECT_EQ(parseGeneratedPath(result.first->path), expected)
        << parseGeneratedPath(result.first->path);

    executor->cancel();
    executor_thread.join();
}
```

# Testing the Conventional Approach

```
TEST_F(TaskPlanningFixture, no_path) {
    auto executor = std::make_shared<rcpp::executors::SingleThreadedExecutor>();
    std::thread executor_thread;

    auto const pg = std::make_shared<PathGenerator>();

    executor->add_node(pg);
    executor_thread = std::thread([&executor]() { executor->spin(); });

    // GIVEN a populated costmap that is set without error
    auto const return_code = populateAndSetMap();

    EXPECT_EQ(return_code, rcpp::FutureReturnCode::SUCCESS)
        << "Setting the map failed";

    // WHEN a path is requested between two positions that do not have a valid
    // path between them given the algorithm
    auto const request = std::make_shared<example_srvs::srv::GetPath::Request>();

    request->start.data = {2, 2};
    request->goal.data = {5, 5};

    auto const result = sendPathRequest(request);

    EXPECT_EQ(result.second, rcpp::FutureReturnCode::SUCCESS) << "Generating path
failed";

    // THEN the global path produced should be empty
    std::vector<Position> const expected{};
    EXPECT_EQ(result.first->code.code, example_srvs::msg::GetPathCodes::NO_VALID_PATH);
    EXPECT_EQ(parseGeneratedPath(result.first->path), expected)
        << parseGeneratedPath(result.first->path);

    executor->cancel();
    executor_thread.join();
}
```

This test:

- Verifies that the Path Generator will return an empty path if it cannot find a path between a start and goal position

# Testing the Conventional Approach

```
TEST_F(TaskPlanningFixture, no_path) {  
    auto executor = std::make_shared<rc1cpp::executors::SingleThreadedExecutor>();  
    std::thread executor_thread;  
  
    auto const pg = std::make_shared<PathGenerator>();  
  
    executor->add_node(pg);  
    executor_thread = std::thread([&executor]() { executor->spin(); });  
  
    // GIVEN a populated costmap that is set without error  
    auto const return_code = populateAndSetMap();  
  
    EXPECT_EQ(return_code, rc1cpp::FutureReturnCode::SUCCESS)  
        << "Setting the map failed";  
  
    // WHEN a path is requested between two positions that do not have a valid  
    // path between them given the algorithm  
    auto const request = std::make_shared<example_srvs::srv::GetPath::Request>();  
  
    request->start.data = {2, 2};  
    request->goal.data = {5, 5};  
  
    auto const result = sendPathRequest(request);  
  
    EXPECT_EQ(result.second, rc1cpp::FutureReturnCode::SUCCESS) << "Generating path  
failed";  
  
    // THEN the global path produced should be empty  
    std::vector<Position> const expected{};  
    EXPECT_EQ(result.first->code.code, example_srvs::msg::GetPathCodes::NO_VALID_PATH);  
    EXPECT_EQ(parseGeneratedPath(result.first->path), expected)  
        << parseGeneratedPath(result.first->path);  
  
    executor->cancel();  
    executor_thread.join();  
}
```

This test:

- Verifies that the Path Generator will return an empty path if it cannot find a path between a start and goal position
- Requires creating a thread that executes callbacks for the PathGenerator server

# Testing the Conventional Approach

```
TEST_F(TaskPlanningFixture, no_path) {
    auto executor = std::make_shared<rcpp::executors::SingleThreadedExecutor>();
    std::thread executor_thread;

    auto const pg = std::make_shared<PathGenerator>();

    executor->add_node(pg);
    executor_thread = std::thread([&executor]() { executor->spin(); });

    // GIVEN a populated costmap that is set without error
    auto const return_code = populateAndSetMap();

    EXPECT_EQ(return_code, rcpp::FutureReturnCode::SUCCESS)
        << "Setting the map failed";

    // WHEN a path is requested between two positions that do not have a valid
    // path between them given the algorithm
    auto const request = std::make_shared<example_srvs::srv::GetPath::Request>();

    request->start.data = {2, 2};
    request->goal.data = {5, 5};

    auto const result = sendPathRequest(request);

    EXPECT_EQ(result.second, rcpp::FutureReturnCode::SUCCESS) << "Generating path
failed";

    // THEN the global path produced should be empty
    std::vector<Position> const expected{};
    EXPECT_EQ(result.first->code.code, example_srvs::msg::GetPathCodes::NO_VALID_PATH);
    EXPECT_EQ(parseGeneratedPath(result.first->path), expected)
        << parseGeneratedPath(result.first->path);

    executor->cancel();
    executor_thread.join();
}
```

This test:

- Verifies that the Path Generator will return an empty path if it cannot find a path between a start and goal position
- Requires creating a thread that executes callbacks for the PathGenerator server
- Sends two requests: one for setting the map and one for generating the path
- Each request blocks until a response is received or the request times out

# Testing the Conventional Approach

```
TEST_F(TaskPlanningFixture, no_path) {
    auto executor = std::make_shared<rcpp::executors::SingleThreadedExecutor>();
    std::thread executor_thread;

    auto const pg = std::make_shared<PathGenerator>();

    executor->add_node(pg);
    executor_thread = std::thread([&executor]() { executor->spin(); });

    // GIVEN a populated costmap that is set without error
    auto const return_code = populateAndSetMap();

    EXPECT_EQ(return_code, rcpp::FutureReturnCode::SUCCESS)
        << "Setting the map failed";

    // WHEN a path is requested between two positions that do not have a valid
    // path between them given the algorithm
    auto const request = std::make_shared<example_srvs::srv::GetPath::Request>();

    request->start.data = {2, 2};
    request->goal.data = {5, 5};

    auto const result = sendPathRequest(request);

    EXPECT_EQ(result.second, rcpp::FutureReturnCode::SUCCESS) << "Generating path
failed";

    // THEN the global path produced should be empty
    std::vector<Position> const expected{};
    EXPECT_EQ(result.first->code.code, example_srvs::msg::GetPathCodes::NO_VALID_PATH);
    EXPECT_EQ(parseGeneratedPath(result.first->path), expected)
        << parseGeneratedPath(result.first->path);

    executor->cancel();
    executor_thread.join();
}
```

This test:

- Verifies that the Path Generator will return an empty path if it cannot find a path between a start and goal position
- Requires creating a thread that executes callbacks for the PathGenerator server
- Sends two requests: one for setting the map and one for generating the path
- Each request blocks until a response is received or the request times out
- Tests the response from the path generator service



# Testing the Conventional Approach

```
TEST_F(TaskPlanningFixture, no_path) {
    auto executor = std::make_shared<rcpp::executors::SingleThreadedExecutor>();
    std::thread executor_thread;

    auto const pg = std::make_shared<PathGenerator>();

    executor->add_node(pg);
    executor_thread = std::thread([&executor]() { executor->spin(); });

    // GIVEN a populated costmap that is set without error
    auto const return_code = populateAndSetMap();

    EXPECT_EQ(return_code, rcpp::FutureReturnCode::SUCCESS)
        << "Setting the map failed";

    // WHEN a path is requested between two positions that do not have a valid
    // path between them given the algorithm
    auto const request = std::make_shared<example_srvs::srv::GetPath::Request>();

    request->start.data = {2, 2};
    request->goal.data = {5, 5};

    auto const result = sendPathRequest(request);

    EXPECT_EQ(result.second, rcpp::FutureReturnCode::SUCCESS) << "Generating path
failed";

    // THEN the global path produced should be empty
    std::vector<Position> const expected{};
    EXPECT_EQ(result.first->code.code, example_srvs::msg::GetPathCodes::NO_VALID_PATH);
    EXPECT_EQ(parseGeneratedPath(result.first->path), expected)
        << parseGeneratedPath(result.first->path);

    executor->cancel();
    executor_thread.join();
}
```

This test:

- Verifies that the Path Generator will return an empty path if it cannot find a path between a start and goal position
- Requires creating a thread that executes callbacks for the PathGenerator server
- Sends two requests: one for setting the map and one for generating the path
- Each request blocks until a response is received or the request times out
- Tests the response from the path generator service

At the end of the test, the executor and thread must be dealt with accordingly

# Testing the Conventional Approach

```
TEST_F(TaskPlanningFixture, no_path) {
    auto executor = std::make_shared<rcpp::executors::SingleThreadedExecutor>();
    std::thread executor_thread;

    auto const pg = std::make_shared<PathGenerator>();

    executor->add_node(pg);
    executor_thread = std::thread([&executor]() { executor->spin(); });

    // GIVEN a populated costmap that is set without error
    auto const return_code = populateAndSetMap();

    EXPECT_EQ(return_code, rcpp::FutureReturnCode::SUCCESS)
        << "Setting the map failed";

    // WHEN a path is requested between two positions that do not have a valid
    // path between them given the algorithm
    auto const request = std::make_shared<example_srvs::srv::GetPath::Request>();

    request->start.data = {2, 2};
    request->goal.data = {5, 5};

    auto const result = sendPathRequest(request);

    EXPECT_EQ(result.second, rcpp::FutureReturnCode::SUCCESS) << "Generating path
failed";

    // THEN the global path produced should be empty
    std::vector<Position> const expected{};
    EXPECT_EQ(result.first->code.code, example_srvs::msg::GetPathCodes::NO_VALID_PATH);
    EXPECT_EQ(parseGeneratedPath(result.first->path), expected)
        << parseGeneratedPath(result.first->path);

    executor->cancel();
    executor_thread.join();
}
```

This test:

- Verifies that the Path Generator will return an empty path if it cannot find a path between a start and goal position
- Requires creating a thread that executes callbacks for the PathGenerator server
- Sends two requests: one for setting the map and one for generating the path
- Each request blocks until a response is received or the request times out
- Tests the response from the path generator service

At the end of the test, the executor and thread must be dealt with accordingly

- **Look at all the middleware invocations needed for a simple test**

# Testing the Conventional Approach

```
TEST_F(TaskPlanningFixture, no_path) {
    auto executor = std::make_shared<rcclcpp::executors::SingleThreadedExecutor>();
    std::thread executor_thread;

    auto const pg = std::make_shared<PathGenerator>();

    executor->add_node(pg);
    executor_thread = std::thread([&executor]() { executor->spin(); });

    // GIVEN a populated costmap that is set without error
    auto const return_code = populateAndSetMap();

    EXPECT_EQ(return_code, rcclcpp::FutureReturnCode::SUCCESS)
        << "Setting the map failed";

    // WHEN a path is requested between two positions that do not have a valid
    // path between them given the algorithm
    auto const request = std::make_shared<example_srvs::srv::GetPath::Request>();

    request->start.data = {2, 2};
    request->goal.data = {5, 5};

    auto const result = sendPathRequest(request);

    EXPECT_EQ(result.second, rcclcpp::FutureReturnCode::SUCCESS) << "Generating path
failed";

    // THEN the global path produced should be empty
    std::vector<Position> const expected{};
    EXPECT_EQ(result.first->code.code, example_srvs::msg::GetPathCodes::NO_VALID_PATH);
    EXPECT_EQ(parseGeneratedPath(result.first->path), expected)
        << parseGeneratedPath(result.first->path);

    executor->cancel();
    executor_thread.join();
}
```

This test:

- Verifies that the Path Generator will return an empty path if it cannot find a path between a start and goal position
- Requires creating a thread that executes callbacks for the PathGenerator server
- Sends two requests: one for setting the map and one for generating the path
- Each request blocks until a response is received or the request times out
- Tests the response from the path generator service

At the end of the test, the executor and thread must be dealt with accordingly

- Look at all the middleware invocations needed for a simple test
- Is there a way to refactor the code so it can be tested without invoking the middleware?

# Introduction to Functional Programming Principles

# What is Functional Programming?

- A programming paradigm characterized by the use of mathematical functions and the avoidance of side effects

# What is Functional Programming?

- A programming paradigm characterized by the use of mathematical functions and the avoidance of side effects
- Functional programming is identified by the use of higher order functions, pure functions, monads, declarative syntax

# What is Functional Programming?

- A programming paradigm characterized by the use of mathematical functions and the avoidance of side effects
- Functional programming is identified by the use of higher order functions, pure functions, monads, declarative syntax
  - C++ has all the tools to implement functional programming, including lambda functions, `std::function`, `std::optional`, `std::expected`, and more

# What is Functional Programming?

- A programming paradigm characterized by the use of mathematical functions and the avoidance of side effects
- Functional programming is identified by the use of higher order functions, pure functions, monads, declarative syntax
  - C++ has all the tools to implement functional programming, including lambda functions, `std::function`, `std::optional`, `std::expected`, and more
  - Want to maximize use of these features to write code with a minimal number of side effects



# What is Functional Programming?

- A programming paradigm characterized by the use of mathematical functions and the avoidance of side effects
- Functional programming is identified by the use of higher order functions, pure functions, monads, declarative syntax
  - C++ has all the tools to implement functional programming, including lambda functions, `std::function`, `std::optional`, `std::expected`, and more
  - Want to maximize use of these features to write code with a minimal number of side effects
- Let's go over some principles and how they can be applied using C++

# Pure Functions

- A pure function is a function that
  - is deterministic: They always return the same output for the same set of inputs

# Pure Functions

- A pure function is a function that
  - is deterministic: They always return the same output for the same set of inputs
  - has no side effects: They don't alter the state of the program, global variables, or produce any observable interactions with the outside world, such as writing to files or displaying output

# Pure Functions

- A pure function is a function that
  - is deterministic: They always return the same output for the same set of inputs
  - has no side effects: They don't alter the state of the program, global variables, or produce any observable interactions with the outside world, such as writing to files or displaying output
- Why is this desirable?

# Pure Functions

- A pure function is a function that
  - is deterministic: They always return the same output for the same set of inputs
  - has no side effects: They don't alter the state of the program, global variables, or produce any observable interactions with the outside world, such as writing to files or displaying output
- Why is this desirable?
  - local reasoning: The code can be understood just by looking at that portion and a limited scope around it

# Pure Functions

- A pure function is a function that
  - is deterministic: They always return the same output for the same set of inputs
  - has no side effects: They don't alter the state of the program, global variables, or produce any observable interactions with the outside world, such as writing to files or displaying output
- Why is this desirable?
  - local reasoning: The code can be understood just by looking at that portion and a limited scope around it
  - testability: Testing pure functions is trivial

# Pure Functions

- A pure function is a function that
  - is deterministic: They always return the same output for the same set of inputs
  - has no side effects: They don't alter the state of the program, global variables, or produce any observable interactions with the outside world, such as writing to files or displaying output
- Why is this desirable?
  - local reasoning: The code can be understood just by looking at that portion and a limited scope around it
  - testability: Testing pure functions is trivial
- Practically, pure functions do not:
  - contain state (static variables or class member variables)

# Pure Functions

- A pure function is a function that
  - is deterministic: They always return the same output for the same set of inputs
  - has no side effects: They don't alter the state of the program, global variables, or produce any observable interactions with the outside world, such as writing to files or displaying output
- Why is this desirable?
  - local reasoning: The code can be understood just by looking at that portion and a limited scope around it
  - testability: Testing pure functions is trivial
- Practically, pure functions do not:
  - contain state (static variables or class member variables)
  - mutate input parameters



# Pure Functions

- A pure function is a function that
  - is deterministic: They always return the same output for the same set of inputs
  - has no side effects: They don't alter the state of the program, global variables, or produce any observable interactions with the outside world, such as writing to files or displaying output
- Why is this desirable?
  - local reasoning: The code can be understood just by looking at that portion and a limited scope around it
  - testability: Testing pure functions is trivial
- Practically, pure functions do not:
  - contain state (static variables or class member variables)
  - mutate input parameters
- A function is pure if and only if it could be replaced by a lookup table (potentially infinitely large!)

# (im)Pure Functions

```
std::string get_timestamp() {
    std::time_t t = std::time(nullptr);
    std::tm tm = *std::localtime(&t);
    /* Implementation code */
    return oss.str();
}

void log(std::string const& message)
{
    std::cout << get_timestamp() << " [INFO] " << message << '\n';
}

auto filter = [x_previous = 0.] (double xn) mutable -> double {
    /* Implementation code */
    x_previous = xn;
    return yn;
};

void filter_timeseries(std::vector<double> const& x,
std::vector<double>& y) {
    /* Implementation code */
    for (auto const& xn : x) {
        y.push_back(f(xn));
    }
}

int main()
{
    auto f = filter;
    f(1); // 0.7
    f(1); // 1.0
    std::vector<double> const x = {1, 1, 1};
    std::vector<double> y;
    filter_timeseries(x, y);
}
```

- Here is a simple implementation of a smoothing filter

# (im)Pure Functions

```
std::string get_timestamp() {
    std::time_t t = std::time(nullptr);
    std::tm tm = *std::localtime(&t);
    /* Implementation code */
    return oss.str();
}

void log(std::string const& message)
{
    std::cout << get_timestamp() << " [INFO] " << message << '\n';
}

auto filter = [x_previous = 0.] (double xn) mutable -> double {
    /* Implementation code */
    x_previous = xn;
    return yn;
};

void filter_timeseries(std::vector<double> const& x,
std::vector<double>& y) {
    /* Implementation code */
    for (auto const& xn : x) {
        y.push_back(f(xn));
    }
}

int main()
{
    auto f = filter;
    f(1); // 0.7
    f(1); // 1.0
    std::vector<double> const x = {1, 1, 1};
    std::vector<double> y;
    filter_timeseries(x, y);
}
```

- Here is a simple implementation of a smoothing filter
- None of these functions are pure

# (im)Pure Functions

```
std::string get_timestamp() {  
    std::time_t t = std::time(nullptr);  
    std::tm tm = *std::localtime(&t);  
    /* Implementation code */  
    return oss.str();  
}  
  
void log(std::string const& message)  
{  
    std::cout << get_timestamp() << " [INFO] " << message << '\n';  
}  
  
auto filter = [x_previous = 0.] (double xn) mutable -> double {  
    /* Implementation code */  
    x_previous = xn;  
    return y;  
};  
  
void filter_timeseries(std::vector<double> const& x,  
std::vector<double>& y) {  
    /* Implementation code */  
    for (auto const& xn : x) {  
        y.push_back(f(xn));  
    }  
}  
  
int main()  
{  
    auto f = filter;  
    f(1); // 0.7  
    f(1); // 1.0  
    std::vector<double> const x = {1, 1, 1};  
    std::vector<double> y;  
    filter_timeseries(x, y);  
}
```

- Here is a simple implementation of a smoothing filter
- None of these functions are pure
- `get_timestamp` gets the time from the local machine
  - That is an input side effect

# (im)Pure Functions

```
std::string get_timestamp() {
    std::time_t t = std::time(nullptr);
    std::tm tm = *std::localtime(&t);
    /* Implementation code */
    return oss.str();
}

void log(std::string const& message)
{
    std::cout << get_timestamp() << " [INFO] " << message << '\n';
}

auto filter = [x_previous = 0.] (double xn) mutable -> double {
    /* Implementation code */
    x_previous = xn;
    return xn;
};

void filter_timeseries(std::vector<double> const& x,
std::vector<double>& y) {
    /* Implementation code */
    for (auto const& xn : x) {
        y.push_back(f(xn));
    }
}

int main()
{
    auto f = filter;
    f(1); // 0.7
    f(1); // 1.0
    std::vector<double> const x = {1, 1, 1};
    std::vector<double> y;
    filter_timeseries(x, y);
}
```

- Here is a simple implementation of a smoothing filter
- None of these functions are pure
- `get_timestamp` gets the time from the local machine
  - That is an input side effect
- Each invocation of `get_timestamp` will almost always return a different value

# (im)Pure Functions

```
std::string get_timestamp() {
    std::time_t t = std::time(nullptr);
    std::tm tm = *std::localtime(&t);
    /* Implementation code */
    return oss.str();
}

void log(std::string const& message)
{
    std::cout << get_timestamp() << " [INFO] " << message << '\n';
}

auto filter = [x_previous = 0.] (double xn) mutable -> double {
    /* Implementation code */
    x_previous = xn;
    return xn;
};

void filter_timeseries(std::vector<double> const& x,
std::vector<double>& y) {
    /* Implementation code */
    for (auto const& xn : x) {
        y.push_back(f(xn));
    }
}

int main()
{
    auto f = filter;
    f(1); // 0.7
    f(1); // 1.0
    std::vector<double> const x = {1, 1, 1};
    std::vector<double> y;
    filter_timeseries(x, y);
}
```

- Here is a simple implementation of a smoothing filter
- None of these functions are pure
- `get_timestamp` gets the time from the local machine
  - That is an input side effect
- Each invocation of `get_timestamp` will almost always return a different value
- `log` prints directly to the console

# (im)Pure Functions

```
std::string get_timestamp() {
    std::time_t t = std::time(nullptr);
    std::tm tm = *std::localtime(&t);
    /* Implementation code */
    return oss.str();
}

void log(std::string const& message)
{
    std::cout << get_timestamp() << " [INFO] " << message << '\n';
}

auto filter = [x_previous = 0.] (double xn) mutable -> double {
    /* Implementation code */
    x_previous = xn;
    return xn;
};

void filter_timeseries(std::vector<double> const& x,
std::vector<double>& y) {
    /* Implementation code */
    for (auto const& xn : x) {
        y.push_back(f(xn));
    }
}

int main()
{
    auto f = filter;
    f(1); // 0.7
    f(1); // 1.0
    std::vector<double> const x = {1, 1, 1};
    std::vector<double> y;
    filter_timeseries(x, y);
}
```

- Here is a simple implementation of a smoothing filter
- None of these functions are pure
- `get_timestamp` gets the time from the local machine
  - That is an input side effect
- Each invocation of `get_timestamp` will almost always return a different value
- `log` prints directly to the console
  - This is an output side effect

# (im)Pure Functions

```
std::string get_timestamp() {
    std::time_t t = std::time(nullptr);
    std::tm tm = *std::localtime(&t);
    /* Implementation code */
    return oss.str();
}

void log(std::string const& message)
{
    std::cout << get_timestamp() << " [INFO] " << message << '\n';
}

auto filter = [x_previous = 0.] (double xn) mutable -> double {
    /* Implementation code */
    x_previous = xn;
    return xn;
};

void filter_timeseries(std::vector<double> const& x,
std::vector<double>& y) {
    /* Implementation code */
    for (auto const& xn : x) {
        y.push_back(f(xn));
    }
}

int main()
{
    auto f = filter;
    f(1); // 0.7
    f(1); // 1.0
    std::vector<double> const x = {1, 1, 1};
    std::vector<double> y;
    filter_timeseries(x, y);
}
```

- Here is a simple implementation of a smoothing filter
- None of these functions are pure
- `get_timestamp` gets the time from the local machine
  - That is an input side effect
- Each invocation of `get_timestamp` will almost always return a different value
- `log` prints directly to the console
  - This is an output side effect
- `filter` contains state with the variable that is initialized in the lambda capture



# (im)Pure Functions

```
std::string get_timestamp() {
    std::time_t t = std::time(nullptr);
    std::tm tm = *std::localtime(&t);
    /* Implementation code */
    return oss.str();
}

void log(std::string const& message)
{
    std::cout << get_timestamp() << " [INFO] " << message << '\n';
}

auto filter = [x_previous = 0.] (double xn) mutable -> double {
    /* Implementation code */
    x_previous = xn;
    return xn;
};

void filter_timeseries(std::vector<double> const& x,
std::vector<double>& y) {
    /* Implementation code */
    for (auto const& xn : x) {
        y.push_back(f(xn));
    }
}

int main()
{
    auto f = filter;
    f(1); // 0.7
    f(1); // 1.0
    std::vector<double> const x = {1, 1, 1};
    std::vector<double> y;
    filter_timeseries(x, y);
}
```

- Here is a simple implementation of a smoothing filter
- None of these functions are pure
- `get_timestamp` gets the time from the local machine
  - That is an input side effect
- Each invocation of `get_timestamp` will almost always return a different value
- `log` prints directly to the console
  - This is an output side effect
- `filter` contains state with the variable that is initialized in the lambda capture
  - Running `filter` multiple times with the same input returns different outputs

# (im)Pure Functions

```
std::string get_timestamp() {
    std::time_t t = std::time(nullptr);
    std::tm tm = *std::localtime(&t);
    /* Implementation code */
    return oss.str();
}

void log(std::string const& message)
{
    std::cout << get_timestamp() << " [INFO] " << message << '\n';
}

auto filter = [x_previous = 0.] (double xn) mutable -> double {
    /* Implementation code */
    x_previous = xn;
    return xn;
};

void filter_timeseries(std::vector<double> const& x,
std::vector<double>& y) {
    /* Implementation code */
    for (auto const& xn : x) {
        y.push_back(f(xn));
    }
}

int main()
{
    auto f = filter;
    f(1); // 0.7
    f(1); // 1.0
    std::vector<double> const x = {1, 1, 1};
    std::vector<double> y;
    filter_timeseries(x, y);
}
```

- Here is a simple implementation of a smoothing filter
- None of these functions are pure
- `get_timestamp` gets the time from the local machine
  - That is an input side effect
- Each invocation of `get_timestamp` will almost always return a different value
- `log` prints directly to the console
  - This is an output side effect
- `filter` contains state with the variable that is initialized in the closure
  - Running `filter` multiple times with the same input returns different outputs
- `filter_timeseries` has an out parameter that is modified

# Closures and Partial Applications

```
int main()
{
    // Create a multiplication function
    const auto multiply = [](int a, int b){
        return a*b;
    };

    // Partially apply the 'multiply' function by fixing the
first argument to 2
    auto multiplyBy2 = [multiply](int b) {
        return multiply(2, b);
    };

    // Now 'multiplyBy2' only requires one argument
    int result = multiplyBy2(3);
    std::cout << result << std::endl; // Output: 6
}
```

- A closure is a function object that has an environment of its own, which keeps track of the variables captured from the outer scope

# Closures and Partial Applications

```
int main()
{
    // Create a multiplication function
    const auto multiply = [](int a, int b){
        return a*b;
    };

    // Partially apply the 'multiply' function by fixing the
    first argument to 2
    auto multiplyBy2 = [multiply](int b) {
        return multiply(2, b);
    };

    // Now 'multiplyBy2' only requires one argument
    int result = multiplyBy2(3);
    std::cout << result << std::endl; // Output: 6
}
```

- A closure is a function object that has an environment of its own, which keeps track of the variables captured from the outer scope
  - A closure can access and manipulate these captured variables throughout its lifetime

# Closures and Partial Applications

```
int main()
{
    // Create a multiplication function
    const auto multiply = [](int a, int b){
        return a*b;
    };

    // Partially apply the 'multiply' function by fixing the
    first argument to 2
    auto multiplyBy2 = [multiply](int b) {
        return multiply(2, b);
    };

    // Now 'multiplyBy2' only requires one argument
    int result = multiplyBy2(3);
    std::cout << result << std::endl; // Output: 6
}
```

- A closure is a function object that has an environment of its own, which keeps track of the variables captured from the outer scope
  - A closure can access and manipulate these captured variables throughout its lifetime
  - Essentially the lambda capture!

# Closures and Partial Applications

```
int main()
{
    // Create a multiplication function
    const auto multiply = [](int a, int b){
        return a*b;
    };

    // Partially apply the 'multiply' function by fixing the
    first argument to 2
    auto multiplyBy2 = [multiply](int b) {
        return multiply(2, b);
    };

    // Now 'multiplyBy2' only requires one argument
    int result = multiplyBy2(3);
    std::cout << result << std::endl; // Output: 6
}
```

- A closure is a function object that has an environment of its own, which keeps track of the variables captured from the outer scope
  - A closure can access and manipulate these captured variables throughout its lifetime
  - Essentially the lambda capture!
- Partial applications are a concept in functional programming where a function is fixed with a certain number of arguments, producing a new function with a lesser number of arguments

# Closures and Partial Applications

```
Path plan(Position const& start, Position const& goal, Map const& map) {  
    /* Variable setup */  
    auto is_occupied = [&](auto const x, auto const y) -> bool {  
        return map.at(x, y) == 255;  
    };  
    for (size_t i = 0; i < (std::abs(del_x)); ++i) {  
        if (is_occupied(path.back().x + del_x_sign, path.back().y)) {  
            return {};  
        }  
        path.push_back({path.back().x + del_x_sign, path.back().y});  
    }  
    /* More implementation code */  
    return path;  
}  
  
int main() {  
    // Create map  
    auto map = Map(4, 4);  
    map.data() = {  
        0, 0, 0, 0, //  
        0, 0, 0, 0, //  
        0, 0, 0, 0, //  
        0, 0, 0, 0, //  
    };  
    auto const planner = [map](auto const& start, auto const& goal){  
        return plan(start, goal, map);  
    };  
    auto const plan = planner(Position{0, 0}, Position{2, 2});  
    /* More implementation code */  
}
```

- Here is more code that shows closures and partial applications

# Closures and Partial Applications

```
Path plan(Position const& start, Position const& goal, Map const& map) {  
    /* Variable setup */  
    auto is_occupied = [&](auto const x, auto const y) -> bool {  
        return map.at(x, y) == 255;  
    };  
    for (size_t i = 0; i < (std::abs(del_x)); ++i) {  
        if (is_occupied(path.back().x + del_x_sign, path.back().y)) {  
            return {};  
        }  
        path.push_back({path.back().x + del_x_sign, path.back().y});  
    }  
    /* More implementation code */  
    return path;  
}  
  
int main() {  
    // Create map  
    auto map = Map(4, 4);  
    map.data() = {  
        0, 0, 0, 0, //  
        0, 0, 0, 0, //  
        0, 0, 0, 0, //  
        0, 0, 0, 0, //  
    };  
    auto const planner = [map](auto const& start, auto const& goal){  
        return plan(start, goal, map);  
    };  
    auto const plan = planner(Position{0, 0}, Position{2, 2});  
    /* More implementation code */  
}
```

- Here is more code that shows closures and partial applications
- `is_occupied` is a lambda function in `plan` that checks if a cell in a map is occupied



# Closures and Partial Applications

```
Path plan(Position const& start, Position const& goal, Map const& map) {
    /* Variable setup */
    auto is_occupied = [&](auto const x, auto const y) -> bool {
        return map.at(x, y) == 255;
    };
    for (size_t i = 0; i < (std::abs(del_x)); ++i) {
        if (is_occupied(path.back().x + del_x_sign, path.back().y)) {
            return {};
        }
        path.push_back({path.back().x + del_x_sign, path.back().y});
    }
    /* More implementation code */
    return path;
}

int main() {
    // Create map
    auto map = Map(4, 4);
    map.data() = {
        0, 0, 0, 0, //
        0, 0, 0, 0, //
        0, 0, 0, 0, //
        0, 0, 0, 0, //
    };
    auto const planner = [map](auto const& start, auto const& goal){
        return plan(start, goal, map);
    };
    auto const plan = planner(Position{0, 0}, Position{2, 2});
    /* More implementation code */
}
```

- Here is more code that shows closures and partial applications
- `is_occupied` is a lambda function in `plan` that checks if a cell in a map is occupied
  - `is_occupied` captures the input parameters and all variables that come before it by reference

# Closures and Partial Applications

```
Path plan(Position const& start, Position const& goal, Map const& map) {  
    /* Variable setup */  
    auto is_occupied = [&](auto const x, auto const y) -> bool {  
        return map.at(x, y) == 255;  
    };  
    for (size_t i = 0; i < (std::abs(del_x)); ++i) {  
        if (is_occupied(path.back().x + del_x_sign, path.back().y)) {  
            return {};  
        }  
        path.push_back({path.back().x + del_x_sign, path.back().y});  
    }  
    /* More implementation code */  
    return path;  
}  
  
int main() {  
    // Create map  
    auto map = Map(4, 4);  
    map.data() = {  
        0, 0, 0, 0, //  
        0, 0, 0, 0, //  
        0, 0, 0, 0, //  
        0, 0, 0, 0, //  
    };  
    auto const planner = [map](auto const& start, auto const& goal){  
        return plan(start, goal, map);  
    };  
    auto const plan = planner(Position{0, 0}, Position{2, 2});  
    /* More implementation code */  
}
```

- Here is more code that shows closures and partial applications
- `is_occupied` is a lambda function in `plan` that checks if a cell in a map is occupied
  - `is_occupied` captures the input parameters and all variables that come before it by reference
  - That is a closure

# Closures and Partial Applications

```
Path plan(Position const& start, Position const& goal, Map const& map) {
    /* Variable setup */
    auto is_occupied = [&](auto const x, auto const y) -> bool {
        return map.at(x, y) == 255;
    };
    for (size_t i = 0; i < (std::abs(del_x)); ++i) {
        if (is_occupied(path.back().x + del_x_sign, path.back().y)) {
            return {};
        }
        path.push_back({path.back().x + del_x_sign, path.back().y});
    }
    /* More implementation code */
    return path;
}

int main() {
    // Create map
    auto map = Map(4, 4);
    map.data() = {
        0, 0, 0, 0, //
        0, 0, 0, 0, //
        0, 0, 0, 0, //
        0, 0, 0, 0, //
    };
    auto const planner = [map](auto const& start, auto const& goal){
        return plan(start, goal, map);
    };
    auto const plan = planner(Position{0, 0}, Position{2, 2});
    /* More implementation code */
}
```

- Here is more code that shows closures and partial applications
- `is_occupied` is a lambda function in `plan` that checks if a cell in a map is occupied
  - `is_occupied` captures the input parameters and all variables that come before it by reference
  - That is a closure
- `planner` is a lambda function that captures `map` and partially applies that map to `plan`

# Closures and Partial Applications

```
Path plan(Position const& start, Position const& goal, Map const& map) {
    /* Variable setup */
    auto is_occupied = [&](auto const x, auto const y) -> bool {
        return map.at(x, y) == 255;
    };
    for (size_t i = 0; i < (std::abs(del_x)); ++i) {
        if (is_occupied(path.back().x + del_x_sign, path.back().y)) {
            return {};
        }
        path.push_back({path.back().x + del_x_sign, path.back().y});
    }
    /* More implementation code */
    return path;
}

int main() {
    // Create map
    auto map = Map(4, 4);
    map.data() = {
        0, 0, 0, 0, //
        0, 0, 0, 0, //
        0, 0, 0, 0, //
        0, 0, 0, 0, //
    };
    auto const planner = [map](auto const& start, auto const& goal){
        return plan(start, goal, map);
    };
    auto const plan = planner(Position{0, 0}, Position{2, 2});
    /* More implementation code */
}
```

- Here is more code that shows closures and partial applications
- `is_occupied` is a lambda function in `plan` that checks if a cell in a map is occupied
  - `is_occupied` captures the input parameters and all variables that come before it by reference
  - That is a closure
- `planner` is a lambda function that captures `map` and partially applies that map to `plan`
  - This reduces the number of required input arguments

# Higher Order Functions

- A higher order function is a function that can:
  - accept other functions as arguments

# Higher Order Functions

- A higher order function is a function that can:
  - accept other functions as arguments
  - return functions as a result

# Higher Order Functions

- A higher order function is a function that can:
  - accept other functions as arguments
  - return functions as a result
- Why is this desirable?

# Higher Order Functions

- A higher order function is a function that can:
  - accept other functions as arguments
  - return functions as a result
- Why is this desirable?
  - Modularity and reusability: The behavior of a higher order function is configurable and they can be used in different contexts



# Higher Order Functions

- A higher order function is a function that can:
  - accept other functions as arguments
  - return functions as a result
- Why is this desirable?
  - Modularity and reusability: The behavior of a higher order function is configurable and they can be used in different contexts
  - Control flow abstraction: control flows, like looping and conditional execution, can be abstracted in a readable and reusable manner

# Higher Order Functions

- A higher order function is a function that can:
  - accept other functions as arguments
  - return functions as a result
- Why is this desirable?
  - Modularity and reusability: The behavior of a higher order function is configurable and they can be used in different contexts
  - Control flow abstraction: control flows, like looping and conditional execution, can be abstracted in a readable and reusable manner
  - Testability: Smaller well-defined functions are easier to test

# Higher Order Functions

- A higher order function is a function that can:
  - accept other functions as arguments
  - return functions as a result
- Why is this desirable?
  - Modularity and reusability: The behavior of a higher order function is configurable and they can be used in different contexts
  - Control flow abstraction: control flows, like looping and conditional execution, can be abstracted in a readable and reusable manner
  - Testability: Smaller well-defined functions are easier to test
- The Standard Template Library contains many higher order functions!

# Higher Order Functions

- A higher order function is a function that can:
  - accept other functions as arguments
  - return functions as a result
- Why is this desirable?
  - Modularity and reusability: The behavior of a higher order function is configurable and they can be used in different contexts
  - Control flow abstraction: control flows, like looping and conditional execution, can be abstracted in a readable and reusable manner
  - Testability: Smaller well-defined functions are easier to test
- The Standard Template Library contains many higher order functions!
  - `std::transform`, `std::find_if`, `std::copy`, and more

# Higher Order Functions

- A higher order function is a function that can:
  - accept other functions as arguments
  - return functions as a result
- Why is this desirable?
  - Modularity and reusability: The behavior of a higher order function is configurable and they can be used in different contexts
  - Control flow abstraction: control flows, like looping and conditional execution, can be abstracted in a readable and reusable manner
  - Testability: Smaller well-defined functions are easier to test
- The Standard Template Library contains many higher order functions!
  - `std::transform`, `std::find_if`, `std::copy`, and more
  - Let's look at some STL higher order functions

# Higher Order Functions in the STL

```
std::vector<int> input {0, 1, 2, 3, 4};

const auto triple = [](const auto num) -> int {return num*3;};

// input = {0, 1, 2, 3, 4}
std::transform(input.cbegin(), input.cend(), input.begin(), triple);
// input = {0, 3, 6, 9, 12}

const auto less_than_5 = [](const auto num) -> int {return num < 5;};

const auto new_end = std::remove_if(input.begin(), input.end() ,
less_than_5);
// input = {6, 9, 12, 9, 12}
input.resize(std::distance(input.begin(), new_end));
// input = {6, 9, 12}

const auto result = std::accumulate(input.cbegin(), input.cend(), 0);
// result = 27
```

- The code:
  - Multiplies each element of a vector by 3

# Higher Order Functions in the STL

```
std::vector<int> input {0, 1, 2, 3, 4};

const auto triple = [](const auto num) -> int {return num*3;};

// input = {0, 1, 2, 3, 4}
std::transform(input.cbegin(), input.cend(), input.begin(), triple);
// input = {0, 3, 6, 9, 12}

const auto less_than_5 = [](const auto num) -> int {return num < 5;};

const auto new_end = std::remove_if(input.begin(), input.end() ,
less_than_5);
// input = {6, 9, 12, 9, 12}
input.resize(std::distance(input.begin(), new_end));
// input = {6, 9, 12}

const auto result = std::accumulate(input.cbegin(), input.cend(), 0);
// result = 27
```

- The code:
  - Multiplies each element of a vector by 3
  - Removes any element less than 5

# Higher Order Functions in the STL

```
std::vector<int> input {0, 1, 2, 3, 4};

const auto triple = [](const auto num) -> int {return num*3;};

// input = {0, 1, 2, 3, 4}
std::transform(input.cbegin(), input.cend(), input.begin(), triple);
// input = {0, 3, 6, 9, 12}

const auto less_than_5 = [](const auto num) -> int {return num < 5;};

const auto new_end = std::remove_if(input.begin(), input.end() ,
less_than_5);
// input = {6, 9, 12, 9, 12}
input.resize(std::distance(input.begin(), new_end));
// input = {6, 9, 12}

const auto result = std::accumulate(input.cbegin(), input.cend(), 0);
// result = 27
```

- The code:
  - Multiplies each element of a vector by 3
  - Removes any element less than 5
  - Sums up all of the elements



# Higher Order Functions in the STL

```
std::vector<int> input {0, 1, 2, 3, 4};

const auto triple = [](const auto num) -> int {return num*3;};

// input = {0, 1, 2, 3, 4}
std::transform(input.cbegin(), input.cend(), input.begin(), triple);
// input = {0, 3, 6, 9, 12}

const auto less_than_5 = [](const auto num) -> int {return num < 5;};

const auto new_end = std::remove_if(input.begin(), input.end() ,
less_than_5);
// input = {6, 9, 12, 9, 12}
input.resize(std::distance(input.begin(), new_end));
// input = {6, 9, 12}

const auto result = std::accumulate(input.cbegin(), input.cend(), 0);
// result = 27
```

- The code:
  - Multiplies each element of a vector by 3
  - Removes any element less than 5
  - Sums up all of the elements
- The three algorithms used, transform, reduce\_if, and accumulate are very common in the functional paradigm

# Higher Order Functions in the STL

```
std::vector<int> input {0, 1, 2, 3, 4};

const auto triple = [](const auto num) -> int {return num*3;};

// input = {0, 1, 2, 3, 4}
std::transform(input.cbegin(), input.cend(), input.begin(), triple);
// input = {0, 3, 6, 9, 12}

const auto less_than_5 = [](const auto num) -> int {return num < 5;};

const auto new_end = std::remove_if(input.begin(), input.end() ,
less_than_5);
// input = {6, 9, 12, 9, 12}
input.resize(std::distance(input.begin(), new_end));
// input = {6, 9, 12}

const auto result = std::accumulate(input.cbegin(), input.cend(), 0);
// result = 27
```

- The code:
  - Multiplies each element of a vector by 3
  - Removes any element less than 5
  - Sums up all of the elements
- The three algorithms used, transform, reduce\_if, and accumulate are very common in the functional paradigm
  - They are canonically known as map, filter, reduce

# Higher Order Functions in the STL

```
std::vector<int> input {0, 1, 2, 3, 4};

const auto triple = [](const auto num) -> int {return num*3;};

// input = {0, 1, 2, 3, 4}
std::transform(input.cbegin(), input.cend(), input.begin(), triple);
// input = {0, 3, 6, 9, 12}

const auto less_than_5 = [](const auto num) -> int {return num < 5;};

const auto new_end = std::remove_if(input.begin(), input.end() ,
less_than_5);
// input = {6, 9, 12, 9, 12}
input.resize(std::distance(input.begin(), new_end));
// input = {6, 9, 12}

const auto result = std::accumulate(input.cbegin(), input.cend(), 0);
// result = 27
```

- The code:
  - Multiplies each element of a vector by 3
  - Removes any element less than 5
  - Sums up all of the elements
- The three algorithms used, transform, reduce\_if, and accumulate are very common in the functional paradigm
  - They are canonically known as map, filter, reduce
- The declarative syntax of the code makes it easy to understand

# Higher Order Functions in the STL

```
std::vector<int> input {0, 1, 2, 3, 4};

const auto triple = [](const auto num) -> int {return num*3;};

// input = {0, 1, 2, 3, 4}
std::transform(input.cbegin(), input.cend(), input.begin(), triple);
// input = {0, 3, 6, 9, 12}

const auto less_than_5 = [](const auto num) -> int {return num < 5;};

const auto new_end = std::remove_if(input.begin(), input.end() ,
less_than_5);
// input = {6, 9, 12, 9, 12}
input.resize(std::distance(input.begin(), new_end));
// input = {6, 9, 12}

const auto result = std::accumulate(input.cbegin(), input.cend(), 0);
// result = 27
```

- The code:
  - Multiplies each element of a vector by 3
  - Removes any element less than 5
  - Sums up all of the elements
- The three algorithms used, transform, reduce\_if, and accumulate are very common in the functional paradigm
  - They are canonically known as map, filter, reduce
- The declarative syntax of the code makes it easy to understand
- Higher order functions are extremely flexible

# Higher Order Functions

```
using WaypointGenerator = std::function<Waypoint(Position const&,
Waypoint const&, Speed)>;
Waypoint interpolate(Position const& p, Waypoint const& w, Speed
s) {
    auto const distance = norm(p, w.p);
    auto const duration = distance / s;
    return {p, duration + w.stamp};
}
Trajectory generate_trajectory(Path const& path, Speed speed,
WaypointGenerator next_waypoint) {
    Trajectory traj = {{path.front(), 0.}};
    std::transform(std::next(path.begin()), path.end(),
std::back_inserter(traj),
        [&](auto const& point) {
            return next_waypoint(point, traj.back(), speed);
        }
    );
    return traj;
}
int main() {
    Path p = { {1, 2}, {2, 3}, {3, 4} };
    auto const t = generate_trajectory(p, 1, interpolate);
    /* More Implementation Code */
}
```

- Here is a simplified implementation of a trajectory generator

# Higher Order Functions

```
using WaypointGenerator = std::function<Waypoint(Position const&,
Waypoint const&, Speed)>;
Waypoint interpolate(Position const& p, Waypoint const& w, Speed
s) {
    auto const distance = norm(p, w.p);
    auto const duration = distance / s;
    return {p, duration + w.stamp};
}
```

```
Trajectory generate_trajectory(Path const& path, Speed speed,
WaypointGenerator next_waypoint) {
    Trajectory traj = {{path.front(), 0.}};
    std::transform(std::next(path.begin()), path.end(),
std::back_inserter(traj),
    [&](auto const& point) {
        return next_waypoint(point, traj.back(), speed);
    }
);
    return traj;
}
```

```
int main() {
    Path p = { {1, 2}, {2, 3}, {3, 4} };
    auto const t = generate_trajectory(p, 1, interpolate);
    /* More Implementation Code */
}
```

- Here is a simplified implementation of a trajectory generator
- `generate_trajectory` is a higher order function

# Higher Order Functions

```
using WaypointGenerator = std::function<Waypoint(Position const&,
Waypoint const&, Speed)>;
Waypoint interpolate(Position const& p, Waypoint const& w, Speed
s) {
    auto const distance = norm(p, w.p);
    auto const duration = distance / s;
    return {p, duration + w.stamp};
}
Trajectory generate_trajectory(Path const& path, Speed speed,
WaypointGenerator next_waypoint) {
    Trajectory traj = {{path.front(), 0.}};
    std::transform(std::next(path.begin()), path.end(),
std::back_inserter(traj),
        [&](auto const& point) {
            return next_waypoint(point, traj.back(), speed);
        }
    );
    return traj;
}
int main() {
    Path p = { {1, 2}, {2, 3}, {3, 4} };
    auto const t = generate_trajectory(p, 1, interpolate);
    /* More Implementation Code */
}
```

- Here is a simplified implementation of a trajectory generator
- generate\_trajectory is a higher order function
  - It can take in a function of type WaypointGenerator

# Higher Order Functions

```
using WaypointGenerator = std::function<Waypoint(Position const&,
Waypoint const&, Speed)>;
Waypoint interpolate(Position const& p, Waypoint const& w, Speed
s) {
    auto const distance = norm(p, w.p);
    auto const duration = distance / s;
    return {p, duration + w.stamp};
}
Trajectory generate_trajectory(Path const& path, Speed speed,
WaypointGenerator next_waypoint) {
    Trajectory traj = {{path.front(), 0.}};
    std::transform(std::next(path.begin()), path.end(),
std::back_inserter(traj),
    [&](auto const& point) {
        return next_waypoint(point, traj.back(), speed);
    }
);
    return traj;
}
int main() {
    Path p = { {1, 2}, {2, 3}, {3, 4} };
    auto const t = generate_trajectory(p, 1, interpolate);
    /* More Implementation Code */
}
```

- Here is a simplified implementation of a trajectory generator
- generate\_trajectory is a higher order function
  - It can take in a function of type WaypointGenerator
- In main, interpolate is passed into generate\_trajectory



# Higher Order Functions

```
using WaypointGenerator = std::function<Waypoint(Position const&,
Waypoint const&, Speed)>;
Waypoint interpolate(Position const& p, Waypoint const& w, Speed
s) {
    auto const distance = norm(p, w.p);
    auto const duration = distance / s;
    return {p, duration + w.stamp};
}
Trajectory generate_trajectory(Path const& path, Speed speed,
WaypointGenerator next_waypoint) {
    Trajectory traj = {{path.front(), 0.}};
    std::transform(std::next(path.begin()), path.end(),
std::back_inserter(traj),
        [&](auto const& point) {
            return next_waypoint(point, traj.back(), speed);
        }
    );
    return traj;
}
int main() {
    Path p = { {1, 2}, {2, 3}, {3, 4} };
    auto const t = generate_trajectory(p, 1, interpolate);
    /* More Implementation Code */
}
```

- Here is a simplified implementation of a trajectory generator
- `generate_trajectory` is a higher order function
  - It can take in a function of type `WaypointGenerator`
- In main, `interpolate` is passed into `generate_trajectory`
- The type of trajectory that can be generated is customizable by passing in a different `WaypointGenerator` function

# Monadic Error Handling

- Monadic error handling is a functional programming technique for dealing with errors in a clean, compositional, and type-safe way

# Monadic Error Handling

- Monadic error handling is a functional programming technique for dealing with errors in a clean, compositional, and type-safe way
- This approach encapsulates error handling into types and operations on these types

# Monadic Error Handling

- Monadic error handling is a functional programming technique for dealing with errors in a clean, compositional, and type-safe way
- This approach encapsulates error handling into types and operations on these types
- Why is this desirable?

# Monadic Error Handling

- Monadic error handling is a functional programming technique for dealing with errors in a clean, compositional, and type-safe way
- This approach encapsulates error handling into types and operations on these types
- Why is this desirable?
  - Type encapsulation: Monadic error handling encapsulates the result of computations along with possible errors within a single type

# Monadic Error Handling

- Monadic error handling is a functional programming technique for dealing with errors in a clean, compositional, and type-safe way
- This approach encapsulates error handling into types and operations on these types
- Why is this desirable?
  - Type encapsulation: Monadic error handling encapsulates the result of computations along with possible errors within a single type
  - Compositional error handling: Monadic error handling allows composition of operations that might fail, in a way that if any operation fails, the whole computation fails

# Monadic Error Handling

- Monadic error handling is a functional programming technique for dealing with errors in a clean, compositional, and type-safe way
- This approach encapsulates error handling into types and operations on these types
- Why is this desirable?
  - Type encapsulation: Monadic error handling encapsulates the result of computations along with possible errors within a single type
  - Compositional error handling: Monadic error handling allows composition of operations that might fail, in a way that if any operation fails, the whole computation fails
  - Error Propagation: Errors can be automatically propagated through a sequence of computations until they are explicitly handled

# Monadic Error Handling

- Monadic error handling is a functional programming technique for dealing with errors in a clean, compositional, and type-safe way
- This approach encapsulates error handling into types and operations on these types
- Why is this desirable?
  - Type encapsulation: Monadic error handling encapsulates the result of computations along with possible errors within a single type
  - Compositional error handling: Monadic error handling allows composition of operations that might fail, in a way that if any operation fails, the whole computation fails
  - Error Propagation: Errors can be automatically propagated through a sequence of computations until they are explicitly handled
- Let's look at some ways to handle errors before looking at monadic error handling



# Error Handling

```
int divide(int a, int b) { return a / b; }
int divide_try(int a, int b) {
    if (b == 0) throw std::domain_error("Denominator is zero");
    return a / b;
}
std::error_code divide_errc(int a, int b, int& out) {
    if (b == 0) return std::make_error_code(std::errc::invalid_argument);
    out = a / b;
    return {};
}
int main() {
    // No error handling
    std::cout << divide(4, 2) << "\n";
    // std::cout << divide(1, 0); // Program terminated with signal: SIGFPE
    // Exceptions
    try {
        std::cout << divide_try(1, 0);
    } catch (std::exception const& e) {
        std::cerr << e.what() << "\n";
    }

    // Error codes
    {
        int result;
        auto const error = divide_errc(1, 0, result);
        if (error) {
            std::cerr << error.message() << "\n";
        } else {
            std::cout << result;
        }
    }
}
```

- Here is code that shows some ways to handle errors

# Error Handling

```
int divide(int a, int b) { return a / b; }
int divide_try(int a, int b) {
    if (b == 0) throw std::domain_error("Denominator is zero");
    return a / b;
}
std::error_code divide_errc(int a, int b, int& out) {
    if (b == 0) return std::make_error_code(std::errc::invalid_argument);
    out = a / b;
    return {};
}
int main() {
    // No error handling
    std::cout << divide(4, 2) << "\n";
    // std::cout << divide(1, 0); // Program terminated with signal: SIGFPE
    // Exceptions
    try {
        std::cout << divide_try(1, 0);
    } catch (std::exception const& e) {
        std::cerr << e.what() << "\n";
    }

    // Error codes
    {
        int result;
        auto const error = divide_errc(1, 0, result);
        if (error) {
            std::cerr << error.message() << "\n";
        } else {
            std::cout << result;
        }
    }
}
```

- Here is code that shows some ways to handle errors
- The first way to “handle” an error is to do nothing, just let the program terminate

# Error Handling

```
int divide(int a, int b) { return a / b; }
int divide_try(int a, int b) {
    if (b == 0) throw std::domain_error("Denominator is zero");
    return a / b;
}
std::error_code divide_errc(int a, int b, int& out) {
    if (b == 0) return std::make_error_code(std::errc::invalid_argument);
    out = a / b;
    return {};
}
int main() {
    // No error handling
    std::cout << divide(4, 2) << "\n";
    // std::cout << divide(1, 0); // Program terminated with signal: SIGFPE
    // Exceptions
    try {
        std::cout << divide_try(1, 0);
    } catch (std::exception const& e) {
        std::cerr << e.what() << "\n";
    }
    // Error codes
    {
        int result;
        auto const error = divide_errc(1, 0, result);
        if (error) {
            std::cerr << error.message() << "\n";
        } else {
            std::cout << result;
        }
    }
}
```

- Here is code that shows some ways to handle errors
- The first way to “handle” an error is to do nothing, just let the program terminate
- The method most people are familiar with is to throw an exception

# Error Handling

```
int divide(int a, int b) { return a / b; }
int divide_try(int a, int b) {
    if (b == 0) throw std::domain_error("Denominator is zero");
    return a / b;
}
std::error_code divide_errc(int a, int b, int& out) {
    if (b == 0) return std::make_error_code(std::errc::invalid_argument);
    out = a / b;
    return {};
}
int main() {
    // No error handling
    std::cout << divide(4, 2) << "\n";
    // std::cout << divide(1, 0); // Program terminated with signal: SIGFPE
    // Exceptions
    try {
        std::cout << divide_try(1, 0);
    } catch (std::exception const& e) {
        std::cerr << e.what() << "\n";
    }
    // Error codes
    {
        int result;
        auto const error = divide_errc(1, 0, result);
        if (error) {
            std::cerr << error.message() << "\n";
        } else {
            std::cout << result;
        }
    }
}
```

- Here is code that shows some ways to handle errors
- The first way to “handle” an error is to do nothing, just let the program terminate
- The method most people are familiar with is to throw an exception
  - To make sure the program doesn’t terminate, the code that might throw an exception needs to be wrapped in a try catch block

# Error Handling

```
int divide(int a, int b) { return a / b; }
int divide_try(int a, int b) {
    if (b == 0) throw std::domain_error("Denominator is zero");
    return a / b;
}
std::error_code divide_errc(int a, int b, int& out) {
    if (b == 0) return std::make_error_code(std::errc::invalid_argument);
    out = a / b;
    return {};
}
int main() {
    // No error handling
    std::cout << divide(4, 2) << "\n";
    // std::cout << divide(1, 0); // Program terminated with signal: SIGFPE
    // Exceptions
    try {
        std::cout << divide_try(1, 0);
    } catch (std::exception const& e) {
        std::cerr << e.what() << "\n";
    }
}
```

```
// Error codes
{
    int result;
    auto const error = divide_errc(1, 0, result);
    if (error) {
        std::cerr << error.message() << "\n";
    } else {
        std::cout << result;
    }
}
```

- Here is code that shows some ways to handle errors
- The first way to “handle” an error is to do nothing, just let the program terminate
- The method most people are familiar with is to throw an exception
  - To make sure the program doesn’t terminate, the code that might throw an exception needs to be wrapped in a try catch block
- Error codes are a concept where the function returns an error code and sets the result via an out parameter

# Error Handling

```
std::tuple<std::error_code, int> divide_product(int a, int b) {
    if (b == 0) {
        return std::make_tuple(
            std::make_error_code(std::errc::invalid_argument), 0);
    }
    auto const result = a / b;
    return std::make_tuple(std::error_code{}, result);
}

std::optional<int> divide_maybe(int a, int b) {
    if (b == 0) return {};
    auto const result = a / b;
    return result;
}

int main() {
    {
        auto const [error, result] = divide_product(1, 0);
        if (error) {
            std::cerr << error.message() << "\n";
        } else {
            std::cout << result;
        }
        // Note that this is possible and the error can just be ignored
        // auto const [_, result] = divide_product(1, 0);
    }
    {
        auto const result = divide_maybe(1, 0);
        if (!result.has_value()) {
            std::cerr << "No result" << "\n";
        } else {
            std::cout << result.value();
        }
    }
}
```

- More intricate error handling is also possible using `std::tuple` and `std::optional`

# Error Handling

```
std::tuple<std::error_code, int> divide_product(int a, int b) {
    if (b == 0) {
        return std::make_tuple(
            std::make_error_code(std::errc::invalid_argument), 0);
    }
    auto const result = a / b;
    return std::make_tuple(std::error_code{}, result);
}

std::optional<int> divide_maybe(int a, int b) {
    if (b == 0) return {};
    auto const result = a / b;
    return result;
}

int main() {
{
    auto const [error, result] = divide_product(1, 0);
    if (error) {
        std::cerr << error.message() << "\n";
    } else {
        std::cout << result;
    }
    // Note that this is possible and the error can just be ignored
    // auto const [_, result] = divide_product(1, 0);
}
{
    auto const result = divide_maybe(1, 0);
    if (!result.has_value()) {
        std::cerr << "No result" << "\n";
    } else {
        std::cout << result.value();
    }
}
}
```

- More intricate error handling is also possible using `std::tuple` and `std::optional`
- With `std::tuple`, both an error code and result can be returned

# Error Handling

```
std::tuple<std::error_code, int> divide_product(int a, int b) {
    if (b == 0) {
        return std::make_tuple(
            std::make_error_code(std::errc::invalid_argument), 0);
    }
    auto const result = a / b;
    return std::make_tuple(std::error_code{}, result);
}

std::optional<int> divide_maybe(int a, int b) {
    if (b == 0) return {};
    auto const result = a / b;
    return result;
}

int main() {
    {
        auto const [error, result] = divide_product(1, 0);
        if (error) {
            std::cerr << error.message() << "\n";
        } else {
            std::cout << result;
        }
        // Note that this is possible and the error can just be ignored
        // auto const [_, result] = divide_product(1, 0);
    }
    {
        auto const result = divide_maybe(1, 0);
        if (!result.has_value()) {
            std::cerr << "No result" << "\n";
        } else {
            std::cout << result.value();
        }
    }
}
```

- More intricate error handling is also possible using `std::tuple` and `std::optional`
- With `std::tuple`, both an error code and result can be returned
- With `std::optional`, the result either contains a value or is empty



# Error Handling

```
std::tuple<std::error_code, int> divide_product(int a, int b) {
    if (b == 0) {
        return std::make_tuple(
            std::make_error_code(std::errc::invalid_argument), 0);
    }
    auto const result = a / b;
    return std::make_tuple(std::error_code{}, result);
}

std::optional<int> divide_maybe(int a, int b) {
    if (b == 0) return {};
    auto const result = a / b;
    return result;
}

int main() {
    {
        auto const [error, result] = divide_product(1, 0);
        if (error) {
            std::cerr << error.message() << "\n";
        } else {
            std::cout << result;
        }
        // Note that this is possible and the error can just be ignored
        // auto const [_, result] = divide_product(1, 0);
    }
    {
        auto const result = divide_maybe(1, 0);
        if (!result.has_value()) {
            std::cerr << "No result" << "\n";
        } else {
            std::cout << result.value();
        }
    }
}
```

- More intricate error handling is also possible using `std::tuple` and `std::optional`
- With `std::tuple`, both an error code and result can be returned
- With `std::optional`, the result either contains a value or is empty
  - Is there a way to either return a value or an error code, and tailor future operations depending on the return?

# Monadic Error Handling

```
std::expected<int, std::error_code> divide(int a, int b) {
    if (b == 0) {
        return std::make_unexpected(
            std::make_error_code(std::errc::invalid_argument));
    }
    auto const result = a / b;
    return result;
}

std::expected<void, std::error_code> print_value(int const&
value) {
    std::cout << value;
    return {};
}

void print_error(std::error_code const& error) {
    std::cerr << error.message() << "\n";
}

int main() {
    // Conditional handling
    auto const result = divide(1, 0);
    if (!result.has_value()) {
        std::cerr << result.error().message() << "\n";
    } else {
        std::cout << result.value();
    }
    // Monadic functions
    divide(1, 0).and_then(print_value).or_else(print_error);
    return 0;
}
```

- Yes!

# Monadic Error Handling

```
std::expected<int, std::error_code> divide(int a, int b) {
    if (b == 0) {
        return std::make_unexpected(
            std::make_error_code(std::errc::invalid_argument));
    }
    auto const result = a / b;
    return result;
}

std::expected<void, std::error_code> print_value(int const&
value) {
    std::cout << value;
    return {};
}

void print_error(std::error_code const& error) {
    std::cerr << error.message() << "\n";
}

int main() {
    // Conditional handling
    auto const result = divide(1, 0);
    if (!result.has_value()) {
        std::cerr << result.error().message() << "\n";
    } else {
        std::cout << result.value();
    }
    // Monadic functions
    divide(1, 0).and_then(print_value).or_else(print_error);
    return 0;
}
```

- Yes!
- Monadic error handling is the functional programming concept of returning a type that can either contain an expected value or an unexpected value and composing operations depending on that value

# Monadic Error Handling

```
std::expected<int, std::error_code> divide(int a, int b) {  
    if (b == 0) {  
        return std::make_unexpected(  
            std::make_error_code(std::errc::invalid_argument));  
    }  
    auto const result = a / b;  
    return result;  
}  
  
std::expected<void, std::error_code> print_value(int const&  
value) {  
    std::cout << value;  
    return {};  
}  
  
void print_error(std::error_code const& error) {  
    std::cerr << error.message() << "\n";  
}  
  
int main() {  
    // Conditional handling  
    auto const result = divide(1, 0);  
    if (!result.has_value()) {  
        std::cerr << result.error().message() << "\n";  
    } else {  
        std::cout << result.value();  
    }  
    // Monadic functions  
    divide(1, 0).and_then(print_value).or_else(print_error);  
    return 0;  
}
```

- Yes!
- Monadic error handling is the functional programming concept of returning a type that can either contain an expected value or an unexpected value and composing operations depending on that value
- `divide` returns a monadic type, which either contains an `int` or an `error_code`

# Monadic Error Handling

```
std::expected<int, std::error_code> divide(int a, int b) {
    if (b == 0) {
        return std::make_unexpected(
            std::make_error_code(std::errc::invalid_argument));
    }
    auto const result = a / b;
    return result;
}

std::expected<void, std::error_code> print_value(int const&
value) {
    std::cout << value;
    return {};
}

void print_error(std::error_code const& error) {
    std::cerr << error.message() << "\n";
}

int main() {
    // Conditional handling
    auto const result = divide(1, 0);
    if (!result.has_value()) {
        std::cerr << result.error().message() << "\n";
    } else {
        std::cout << result.value();
    }
    // Monadic functions
    divide(1, 0).and_then(print_value).or_else(print_error);
    return 0;
}
```

- Yes!
- Monadic error handling is the functional programming concept of returning a type that can either contain an expected value or an unexpected value and composing operations depending on that value
- `divide` returns a monadic type, which either contains an `int` or an `error_code`
- If the `divide` return contains an `int`, `and_then` takes the expected value and passes it to `print_value`

# Monadic Error Handling

```
std::expected<int, std::error_code> divide(int a, int b) {
    if (b == 0) {
        return std::make_unexpected(
            std::make_error_code(std::errc::invalid_argument));
    }
    auto const result = a / b;
    return result;
}

std::expected<void, std::error_code> print_value(int const&
value) {
    std::cout << value;
    return {};
}

void print_error(std::error_code const& error) {
    std::cerr << error.message() << "\n";
}

int main() {
    // Conditional handling
    auto const result = divide(1, 0);
    if (!result.has_value()) {
        std::cerr << result.error().message() << "\n";
    } else {
        std::cout << result.value();
    }
    // Monadic functions
    divide(1, 0).and_then(print_value).or_else(print_error);
    return 0;
}
```

- Yes!
- Monadic error handling is the functional programming concept of returning a type that can either contain an expected value or an unexpected value and composing operations depending on that value
- `divide` returns a monadic type, which either contains an `int` or an `error_code`
- If the `divide` return contains an `int`, `and_then` takes the expected value and passes it to `print_value`
- If the `divide` return contains an `error_code`, `or_else` takes the unexpected value and passes it to `print_error`

# Monadic Error Handling

```
std::expected<int, std::error_code> divide(int a, int b) {
    if (b == 0) {
        return std::make_unexpected(
            std::make_error_code(std::errc::invalid_argument));
    }
    auto const result = a / b;
    return result;
}

std::expected<void, std::error_code> print_value(int const&
value) {
    std::cout << value;
    return {};
}

void print_error(std::error_code const& error) {
    std::cerr << error.message() << "\n";
}

int main() {
    // Conditional handling
    auto const result = divide(1, 0);
    if (!result.has_value()) {
        std::cerr << result.error().message() << "\n";
    } else {
        std::cout << result.value();
    }
    // Monadic functions
    divide(1, 0).and_then(print_value).or_else(print_error);
    return 0;
}
```

- Yes!
- Monadic error handling is the functional programming concept of returning a type that can either contain an expected value or an unexpected value and composing operations depending on that value
- `divide` returns a monadic type, which either contains an `int` or an `error_code`
- If the `divide` return contains an `int`, `and_then` takes the expected value and passes it to `print_value`
- If the `divide` return contains an `error_code`, `or_else` takes the unexpected value and passes it to `print_error`
- This method of chaining operations is fundamental to functional programming

# How does functional programming help?

- Functional programming lends itself to the minimization of mutable state



# How does functional programming help?

- Functional programming lends itself to the minimization of mutable state
- Testing is easier with pure functions because only the return value of the function needs to be evaluated

# How does functional programming help?

- Functional programming lends itself to the minimization of mutable state
- Testing is easier with pure functions because only the return value of the function needs to be evaluated
- Different functions can be passed as arguments to higher order functions, lending itself to modularity

# How does functional programming help?

- Functional programming lends itself to the minimization of mutable state
- Testing is easier with pure functions because only the return value of the function needs to be evaluated
- Different functions can be passed as arguments to higher order functions, lending itself to modularity
- Monadic error handling simplifies error checking

# How does functional programming help?

- Functional programming lends itself to the minimization of mutable state
- Testing is easier with pure functions because only the return value of the function needs to be evaluated
- Different functions can be passed as arguments to higher order functions, lending itself to modularity
- Monadic error handling simplifies error checking
- Let's try and refactor PathGenerator

# How does functional programming help?

- Functional programming lends itself to the minimization of mutable state
- Testing is easier with pure functions because only the return value of the function needs to be evaluated
- Different functions can be passed as arguments to higher order functions, lending itself to modularity
- Monadic error handling simplifies error checking
- Let's try and refactor PathGenerator
  - **Claim: that the refactored PathGenerator has 100% coverage**

# Refactoring using Functional Programming Principles

# Refactoring PathGenerator

```
class PathGenerator : public rclcpp::Node {
public:
    explicit PathGenerator(rclcpp::NodeOptions const&
                           options = rclcpp::NodeOptions{})
        : Node("path_generator", options);

private:
    void set_map_service(
        const std::shared_ptr<example_srvs::srv::SetMap::Request> request,
        std::shared_ptr<example_srvs::srv::SetMap::Response> response);

    void generate_path_service(
        const std::shared_ptr<example_srvs::srv::GetPath::Request> request,
        std::shared_ptr<example_srvs::srv::GetPath::Response> response);

    bool set_costmap(const std_msgs::msg::UInt8MultiArray& costmap);

    Path generate_global_path(Position const& start, Position const& goal);

    /* Additional private members*/
};
```

- How the current PathGenerator looks

# Refactoring PathGenerator

```
class PathGenerator : public rclcpp::Node {
public:
    explicit PathGenerator(rclcpp::NodeOptions const&
                          options = rclcpp::NodeOptions{})
        : Node("path_generator", options);

private:
    void set_map_service(
        const std::shared_ptr<example_srvs::srv::SetMap::Request> request,
        std::shared_ptr<example_srvs::srv::SetMap::Response> response);

    void generate_path_service(
        const std::shared_ptr<example_srvs::srv::GetPath::Request> request,
        std::shared_ptr<example_srvs::srv::GetPath::Response> response);

    bool set_costmap(const std_msgs::msg::UInt8MultiArray& costmap);

    Path generate_global_path(Position const& start, Position const& goal);

    /* Additional private members*/
};
```

- A `rclcpp::Node` object can be constructed in main and services can be assigned
- No need to have a `PathGenerator` object that inherits from `rclcpp::Node`



# Refactoring PathGenerator

```
class PathGenerator : public rclcpp::Node {
public:
    explicit PathGenerator(rclcpp::NodeOptions const&
                          options = rclcpp::NodeOptions{})
        : Node("path_generator", options);

private:
    void set_map_service(
        const std::shared_ptr<example_srvs::srv::SetMap::Request> request,
        std::shared_ptr<example_srvs::srv::SetMap::Response> response);

    void generate_path_service(
        const std::shared_ptr<example_srvs::srv::GetPath::Request> request,
        std::shared_ptr<example_srvs::srv::GetPath::Response> response);

    bool set_costmap(const std_msgs::msg::UInt8MultiArray& costmap);

    Path generate_global_path(Position const& start, Position const& goal);

    /* Additional private members*/
};
```

- A `rclcpp::Node` object can be constructed in main and services can be assigned
- No need to have a `PathGenerator` object that inherits from `rclcpp::Node`
- The `create_service` method accepts class methods, free functions, and lambdas as the callback function
- The private functions of `PathGenerator` can be turned into free functions and lambda functions

# Refactoring PathGenerator

```
class PathGenerator : public rclcpp::Node {
public:
    explicit PathGenerator(rclcpp::NodeOptions const&
                          options = rclcpp::NodeOptions{})
        : Node("path_generator", options);

private:
    void set_map_service(
        const std::shared_ptr<example_srvs::srv::SetMap::Request> request,
        std::shared_ptr<example_srvs::srv::SetMap::Response> response);

    void generate_path_service(
        const std::shared_ptr<example_srvs::srv::GetPath::Request> request,
        std::shared_ptr<example_srvs::srv::GetPath::Response> response);

    bool set_costmap(const std_msgs::msg::UInt8MultiArray& costmap);

    Path generate_global_path(Position const& start, Position const& goal);

    /* Additional private members*/
};
```

- A `rclcpp::Node` object can be constructed in main and services can be assigned
- No need to have a `PathGenerator` object that inherits from `rclcpp::Node`
- The `create_service` method accepts class methods, free functions, and lambdas as the callback function
- The private functions of `PathGenerator` can be turned into free functions and lambda functions
- Let's refactor the callback function for the generate path service

# Refactoring PathGenerator

```
void generate_path_service(  
const std::shared_ptr<example_srvs::srv::GetPath::Request> request,  
    std::shared_ptr<example_srvs::srv::GetPath::Response> response) {  
    if (map_.get_data().size() == 0) {  
        RCLCPP_ERROR_STREAM(this->get_logger(), "MAP IS EMPTY!!");  
        response->code.code = example_srvs::msg::GetPathCodes::EMPTY_OCCUPANCY_MAP;  
        response->path = std_msgs::msg::UInt8MultiArray();  
        return;  
    }  
    /* More error pre-checks */  
  
    auto const start = Position{request->start.data[0], request->start.data[1]};  
    auto const goal = Position{request->goal.data[0], request->goal.data[1]};  
  
    // Generate the path  
    auto const path = generate_global_path(start, goal);  
  
    // Start populating the response message  
    auto response_path = std_msgs::msg::UInt8MultiArray();  
  
    /* Code about populating the message here */  
  
    response->code.code = !path.empty() ? example_srvs::msg::GetPathCodes::SUCCESS :  
example_srvs::msg::GetPathCodes::NO_VALID_PATH;  
    response->path = response_path;  
}
```

# Refactoring PathGenerator

```
void generate_path_service(  
const std::shared_ptr<example_srvs::srv::GetPath::Request> request,  
    std::shared_ptr<example_srvs::srv::GetPath::Response> response) {  
    if (map_.get_data().size() == 0) {  
        RCLCPP_ERROR_STREAM(this->get_logger(), "MAP IS EMPTY!!");  
        response->code.code = example_srvs::msg::GetPathCodes::EMPTY_OCCUPANCY_MAP;  
        response->path = std_msgs::UInt8MultiArray();  
        return;  
    }  
    /* More error pre-checks */  
  
    auto const start = Position{request->start.data[0], request->start.data[1]};  
    auto const goal = Position{request->goal.data[0], request->goal.data[1]};  
  
    // Generate the path  
    auto const path = generate_global_path(start, goal);  
  
    // Start populating the response message  
    auto response_path = std_msgs::UInt8MultiArray();  
  
    /* Code about populating the message here */  
  
    response->code.code = !path.empty() ? example_srvs::msg::GetPathCodes::SUCCESS :  
example_srvs::msg::GetPathCodes::NO_VALID_PATH;  
    response->path = response_path;  
}
```

- generate\_path\_service is:
  - printing errors

# Refactoring PathGenerator

```
void generate_path_service(  
const std::shared_ptr<example_srvs::srv::GetPath::Request> request,  
    std::shared_ptr<example_srvs::srv::GetPath::Response> response) {  
    if (map_.get_data().size() == 0) {  
        RCLCPP_ERROR_STREAM(this->get_logger(), "MAP IS EMPTY!!");  
        response->code.code = example_srvs::msg::GetPathCodes::EMPTY_OCCUPANCY_MAP;  
        response->path = std_msgs::msg::UInt8MultiArray();  
        return;  
    }  
    /* More error pre-checks */  
  
    auto const start = Position{request->start.data[0], request->start.data[1]};  
    auto const goal = Position{request->goal.data[0], request->goal.data[1]};  
  
    // Generate the path  
    auto const path = generate_global_path(start, goal);  
  
    // Start populating the response message  
    auto response_path = std_msgs::msg::UInt8MultiArray();  
  
    /* Code about populating the message here */  
  
    response->code.code = !path.empty() ? example_srvs::msg::GetPathCodes::SUCCESS :  
example_srvs::msg::GetPathCodes::NO_VALID_PATH;  
    response->path = response_path;  
}
```

- generate\_path\_service is:
  - printing errors
  - generating the path

# Refactoring PathGenerator

```
void generate_path_service(  
const std::shared_ptr<example_srvs::srv::GetPath::Request> request,  
  std::shared_ptr<example_srvs::srv::GetPath::Response> response) {  
    if (map_.get_data().size() == 0) {  
        RCLCPP_ERROR_STREAM(this->get_logger(), "MAP IS EMPTY!!");  
        response->code.code = example_srvs::msg::GetPathCodes::EMPTY_OCCUPANCY_MAP;  
        response->path = std_msgs::msg::UInt8MultiArray();  
        return;  
    }  
    /* More error pre-checks */  
  
    auto const start = Position{request->start.data[0], request->start.data[1]};  
    auto const goal = Position{request->goal.data[0], request->goal.data[1]};  
  
    // Generate the path  
    auto const path = generate_global_path(start, goal);  
  
    // Start populating the response message  
    auto response_path = std_msgs::msg::UInt8MultiArray();  
  
    /* Code about populating the message here */  
  
    response->code.code = !path.empty() ? example_srvs::msg::GetPathCodes::SUCCESS :  
example_srvs::msg::GetPathCodes::NO_VALID_PATH;  
    response->path = response_path;  
}
```

- generate\_path\_service is:
  - printing errors
  - generating the path
  - setting an out parameter

# Refactoring PathGenerator

```
void generate_path_service(  
const std::shared_ptr<example_srvs::srv::GetPath::Request> request,  
    std::shared_ptr<example_srvs::srv::GetPath::Response> response) {  
    if (map_.get_data().size() == 0) {  
        RCLCPP_ERROR_STREAM(this->get_logger(), "MAP IS EMPTY!!");  
        response->code.code = example_srvs::msg::GetPathCodes::EMPTY_OCCUPANCY_MAP;  
        response->path = std_msgs::msg::UInt8MultiArray();  
        return;  
    }  
    /* More error pre-checks */  
  
    auto const start = Position{request->start.data[0], request->start.data[1]};  
    auto const goal = Position{request->goal.data[0], request->goal.data[1]};  
  
    // Generate the path  
    auto const path = generate_global_path(start, goal);  
  
    // Start populating the response message  
    auto response_path = std_msgs::msg::UInt8MultiArray();  
  
    /* Code about populating the message here */  
  
    response->code.code = !path.empty() ? example_srvs::msg::GetPathCodes::SUCCESS :  
example_srvs::msg::GetPathCodes::NO_VALID_PATH;  
    response->path = response_path;  
}
```

- generate\_path\_service is:
  - printing errors
  - generating the path
  - setting an out parameter
- Let's isolate the error printing functionality to another function
  - The error printing function needs to be passed an error type

# Refactoring PathGenerator

```
void generate_path_service(  
const std::shared_ptr<example_srvs::srv::GetPath::Request> request,  
    std::shared_ptr<example_srvs::srv::GetPath::Response> response) {  
    if (map_.get_data().size() == 0) {  
        RCLCPP_ERROR_STREAM(this->get_logger(), "MAP IS EMPTY!!");  
        response->code.code = example_srvs::msg::GetPathCodes::EMPTY_OCCUPANCY_MAP;  
        response->path = std_msgs::msg::UInt8MultiArray();  
        return;  
    }  
    /* More error pre-checks */  
  
    auto const start = Position{request->start.data[0], request->start.data[1]};  
    auto const goal = Position{request->goal.data[0], request->goal.data[1]};  
  
    // Generate the path  
    auto const path = generate_global_path(start, goal);  
  
    // Start populating the response message  
    auto response_path = std_msgs::msg::UInt8MultiArray();  
  
    /* Code about populating the message here */  
  
    response->code.code = !path.empty() ? example_srvs::msg::GetPathCodes::SUCCESS :  
example_srvs::msg::GetPathCodes::NO_VALID_PATH;  
    response->path = response_path;  
}
```

- generate\_path\_service is:
  - printing errors
  - generating the path
  - setting an out parameter
- Let's isolate the error printing functionality to another function
  - The error printing function needs to be passed an error type
- The object held by the shared pointer can be assigned by another function



# Refactoring PathGenerator

```
void generate_path_service(  
const std::shared_ptr<example_srvs::srv::GetPath::Request> request,  
    std::shared_ptr<example_srvs::srv::GetPath::Response> response) {  
    if (map_.get_data().size() == 0) {  
        RCLCPP_ERROR_STREAM(this->get_logger(), "MAP IS EMPTY!!");  
        response->code.code = example_srvs::msg::GetPathCodes::EMPTY_OCCUPANCY_MAP;  
        response->path = std_msgs::msg::UInt8MultiArray();  
        return;  
    }  
    /* More error pre-checks */  
  
    auto const start = Position{request->start.data[0], request->start.data[1]};  
    auto const goal = Position{request->goal.data[0], request->goal.data[1]};  
  
    // Generate the path  
    auto const path = generate_global_path(start, goal);  
  
    // Start populating the response message  
    auto response_path = std_msgs::msg::UInt8MultiArray();  
  
    /* Code about populating the message here */  
  
    response->code.code = !path.empty() ? example_srvs::msg::GetPathCodes::SUCCESS :  
example_srvs::msg::GetPathCodes::NO_VALID_PATH;  
    response->path = response_path;  
}
```

- generate\_path\_service is:
  - printing errors
  - generating the path
  - setting an out parameter
- Let's isolate the error printing functionality to another function
  - The error printing function needs to be passed an error type
- The object held by the shared pointer can be assigned by another function
- The generate\_global\_path function and associated pre-checks can be extracted to another function

# Refactoring PathGenerator

```
std::expected<example_srvs::srv::GetPath::Response, error> generate_path(  
    std::shared_ptr<example_srvs::srv::GetPath::Request> const request,  
    Map<unsigned char> const& occupancy_map, PathingGenerator path_generator) {  
    if (occupancy_map.get_data().size() == 0) {  
        return std::unexpected(error::EMPTY_OCCUPANCY_MAP);  
    }  
    /* More error pre-checks */  
  
    auto const start = Position{request->start.data[0], request->start.data[1]};  
    auto const goal = Position{request->goal.data[0], request->goal.data[1]};  
  
    // Generate the path using the path generator function that was input  
    auto const path = path_generator(start, goal, occupancy_map);  
    if (!path.has_value()) {  
        return std::unexpected(error::NO_VALID_PATH);  
    }  
  
    auto response = example_srvs::srv::GetPath::Response{};  
    /* More implementation code */  
    return response;  
}
```

- Here is the refactored core functionality of the generate path callback

# Refactoring PathGenerator

```
std::expected<example_srvs::srv::GetPath::Response, error> generate_path(  
    std::shared_ptr<example_srvs::srv::GetPath::Request> const request,  
    Map<unsigned char> const& occupancy_map, PathingGenerator path_generator) {  
    if (occupancy_map.get_data().size() == 0) {  
        return std::unexpected(error::EMPTY_OCCUPANCY_MAP);  
    }  
    /* More error pre-checks */  
  
    auto const start = Position{request->start.data[0], request->start.data[1]};  
    auto const goal = Position{request->goal.data[0], request->goal.data[1]};  
  
    // Generate the path using the path generator function that was input  
    auto const path = path_generator(start, goal, occupancy_map);  
    if (!path.has_value()) {  
        return std::unexpected(error::NO_VALID_PATH);  
    }  
  
    auto response = example_srvs::srv::GetPath::Response{};  
    /* More implementation code */  
    return response;  
}
```

- Here is the refactored core functionality of the generate path callback
- This function returns a type which can be used for **monadic error handling**

# Refactoring PathGenerator

```
std::expected<example_srvs::srv::GetPath::Response, error> generate_path(  
    std::shared_ptr<example_srvs::srv::GetPath::Request> const request,  
    Map<unsigned char> const& occupancy_map, PathingGenerator path_generator) {  
    if (occupancy_map.get_data().size() == 0) {  
        return std::unexpected(error::EMPTY_OCCUPANCY_MAP);  
    }  
    /* More error pre-checks */  
  
    auto const start = Position{request->start.data[0], request->start.data[1]};  
    auto const goal = Position{request->goal.data[0], request->goal.data[1]};  
  
    // Generate the path using the path generator function that was input  
    auto const path = path_generator(start, goal, occupancy_map);  
    if (!path.has_value()) {  
        return std::unexpected(error::NO_VALID_PATH);  
    }  
  
    auto response = example_srvs::srv::GetPath::Response{};  
    /* More implementation code */  
    return response;  
}
```

- Here is the refactored core functionality of the generate path callback
- This function returns a type which can be used for **monadic error handling**
- If there is an error, the function can handle the error in a compile time checkable way

# Refactoring PathGenerator

```
using PathingGenerator = std::function<std::optional<Path>(
    Position const&, Position const&, Map<unsigned char> const&>>;
```

```
std::expected<example_srvs::srv::GetPath::Response, error> generate_path(
    std::shared_ptr<example_srvs::srv::GetPath::Request> const request,
    Map<unsigned char> const& occupancy_map, PathingGenerator path_generator) {
    if (occupancy_map.get_data().size() == 0) {
        return std::unexpected(error::EMPTY_OCCUPANCY_MAP);
    }
    /* More error pre-checks */

    auto const start = Position{request->start.data[0], request->start.data[1]};
    auto const goal = Position{request->goal.data[0], request->goal.data[1]};

    // Generate the path using the path generator function that was input
    auto const path = path_generator(start, goal, occupancy_map);
    if (!path.has_value()) {
        return std::unexpected(error::NO_VALID_PATH);
    }

    auto response = example_srvs::srv::GetPath::Response{};
    /* More implementation code */
    return response;
}
```

- Here is the refactored core functionality of the generate path callback
- This function returns a type which can be used for **monadic error handling**
- If there is an error, the function can handle the error in a compile time checkable way
- The function that generates the path can now be passed in, making this function a **higher order function**

# Refactoring PathGenerator

```
using PathingGenerator = std::function<std::optional<Path>(
    Position const&, Position const&, Map<unsigned char> const&>>;

std::expected<example_srvs::srv::GetPath::Response, error> generate_path(
    std::shared_ptr<example_srvs::srv::GetPath::Request> const request,
    Map<unsigned char> const& occupancy_map, PathingGenerator path_generator) {
    if (occupancy_map.get_data().size() == 0) {
        return std::unexpected(error::EMPTY_OCCUPANCY_MAP);
    }
    /* More error pre-checks */

    auto const start = Position{request->start.data[0], request->start.data[1]};
    auto const goal = Position{request->goal.data[0], request->goal.data[1]};

    // Generate the path using the path generator function that was input
    auto const path = path_generator(start, goal, occupancy_map);
    if (!path.has_value()) {
        return std::unexpected(error::NO_VALID_PATH);
    }

    auto response = example_srvs::srv::GetPath::Response{};
    /* More implementation code */
    return response;
}
```

- Here is the refactored core functionality of the generate path callback
- This function returns a type which can be used for **monadic error handling**
- If there is an error, the function can handle the error in a compile time checkable way
- The function that generates the path can now be passed in, making this function a **higher order function**
- This function is deterministic and has no side effects, so it is a **pure function**

# Refactoring PathGenerator

```
using PathingGenerator = std::function<std::optional<Path>(
    Position const&, Position const&, Map<unsigned char> const&>>;

std::expected<example_srvs::srv::GetPath::Response, error> generate_path(
    std::shared_ptr<example_srvs::srv::GetPath::Request> const request,
    Map<unsigned char> const& occupancy_map, PathingGenerator path_generator) {
    if (occupancy_map.get_data().size() == 0) {
        return std::unexpected(error::EMPTY_OCCUPANCY_MAP);
    }
    /* More error pre-checks */

    auto const start = Position{request->start.data[0], request->start.data[1]};
    auto const goal = Position{request->goal.data[0], request->goal.data[1]};

    // Generate the path using the path generator function that was input
    auto const path = path_generator(start, goal, occupancy_map);
    if (!path.has_value()) {
        return std::unexpected(error::NO_VALID_PATH);
    }

    auto response = example_srvs::srv::GetPath::Response{};
    /* More implementation code */
    return response;
}
```

- Here is the refactored core functionality of the generate path callback
- This function returns a type which can be used for **monadic error handling**
- If there is an error, the function can handle the error in a compile time checkable way
- The function that generates the path can now be passed in, making this function a **higher order function**
- This function is deterministic and has no side effects, so it is a **pure function**
- Let's test this function

# Testing the Refactored PathGenerator

```
TEST(GeneratePath, NoValidPath) {  
    // GIVEN a GetPath request and an occupancy map  
    auto const sample_occupancy_map = get_test_occupancy_map();  
  
    auto const request = std::make_shared<example_srvs::srv::GetPath::Request>();  
  
    request->start.data = {2, 2};  
    request->goal.data = {5, 5};  
  
    // WHEN the path is requested  
    auto const response = pathing::generate_path::generate_path(  
        request, sample_occupancy_map, pathing::generate_global_path);  
  
    // THEN there should be an error with the error::NO_VALID_PATH type  
    EXPECT_EQ(response.error(), pathing::generate_path::error::NO_VALID_PATH);  
}  
  
TEST(GeneratePath, PathGenerated) {  
    // GIVEN a GetPath request and an occupancy map  
    auto const sample_occupancy_map = get_test_occupancy_map();  
  
    auto const request = std::make_shared<example_srvs::srv::GetPath::Request>();  
  
    request->start.data = {0, 0};  
    request->goal.data = {7, 7};  
  
    // WHEN the path is requested  
    auto const response = pathing::generate_path::generate_path(  
        request, sample_occupancy_map, pathing::generate_global_path);  
  
    // THEN there should no errors  
    EXPECT_TRUE(response.has_value());  
}
```



# Testing the Refactored PathGenerator

- Testing the refactored functionality is trivial

```
TEST(GeneratePath, NoValidPath) {
    // GIVEN a GetPath request and an occupancy map
    auto const sample_occupancy_map = get_test_occupancy_map();

    auto const request = std::make_shared<example_srvs::srv::GetPath::Request>();

    request->start.data = {2, 2};
    request->goal.data = {5, 5};

    // WHEN the path is requested
    auto const response = pathing::generate_path::generate_path(
        request, sample_occupancy_map, pathing::generate_global_path);

    // THEN there should be an error with the error::NO_VALID_PATH type
    EXPECT_EQ(response.error(), pathing::generate_path::error::NO_VALID_PATH);
}

TEST(GeneratePath, PathGenerated) {
    // GIVEN a GetPath request and an occupancy map
    auto const sample_occupancy_map = get_test_occupancy_map();

    auto const request = std::make_shared<example_srvs::srv::GetPath::Request>();

    request->start.data = {0, 0};
    request->goal.data = {7, 7};

    // WHEN the path is requested
    auto const response = pathing::generate_path::generate_path(
        request, sample_occupancy_map, pathing::generate_global_path);

    // THEN there should be no errors
    EXPECT_TRUE(response.has_value());
}
```

# Testing the Refactored PathGenerator

```
TEST(GeneratePath, NoValidPath) {  
    // GIVEN a GetPath request and an occupancy map  
    auto const sample_occupancy_map = get_test_occupancy_map();  
  
    auto const request = std::make_shared<example_srvs::srv::GetPath::Request>();  
  
    request->start.data = {2, 2};  
    request->goal.data = {5, 5};  
  
    // WHEN the path is requested  
    auto const response = pathing::generate_path::generate_path(  
        request, sample_occupancy_map, pathing::generate_global_path);  
  
    // THEN there should be an error with the error::NO_VALID_PATH type  
    EXPECT_EQ(response.error(), pathing::generate_path::error::NO_VALID_PATH);  
}
```

```
TEST(GeneratePath, PathGenerated) {  
    // GIVEN a GetPath request and an occupancy map  
    auto const sample_occupancy_map = get_test_occupancy_map();  
  
    auto const request = std::make_shared<example_srvs::srv::GetPath::Request>();  
  
    request->start.data = {0, 0};  
    request->goal.data = {7, 7};  
  
    // WHEN the path is requested  
    auto const response = pathing::generate_path::generate_path(  
        request, sample_occupancy_map, pathing::generate_global_path);  
  
    // THEN there should no errors  
    EXPECT_TRUE(response.has_value());  
}
```

- Testing the refactored functionality is trivial
  - Create required parameters

# Testing the Refactored PathGenerator

```
TEST(GeneratePath, NoValidPath) {  
    // GIVEN a GetPath request and an occupancy map  
    auto const sample_occupancy_map = get_test_occupancy_map();  
  
    auto const request = std::make_shared<example_srvs::srv::GetPath::Request>();  
  
    request->start.data = {2, 2};  
    request->goal.data = {5, 5};
```

```
// WHEN the path is requested
```

```
auto const response = pathing::generate_path::generate_path(  
    request, sample_occupancy_map, pathing::generate_global_path);
```

```
// THEN there should be an error with the error::NO_VALID_PATH type
```

```
EXPECT_EQ(response.error(), pathing::generate_path::error::NO_VALID_PATH);
```

```
}
```

```
TEST(GeneratePath, PathGenerated) {  
    // GIVEN a GetPath request and an occupancy map  
    auto const sample_occupancy_map = get_test_occupancy_map();  
  
    auto const request = std::make_shared<example_srvs::srv::GetPath::Request>();  
  
    request->start.data = {0, 0};  
    request->goal.data = {7, 7};
```

```
// WHEN the path is requested
```

```
auto const response = pathing::generate_path::generate_path(  
    request, sample_occupancy_map, pathing::generate_global_path);
```

```
// THEN there should no errors
```

```
EXPECT_TRUE(response.has_value());
```

```
}
```

- Testing the refactored functionality is trivial
  - Create required parameters
  - Pass the parameters into the function under test

# Testing the Refactored PathGenerator

```
TEST(GeneratePath, NoValidPath) {  
    // GIVEN a GetPath request and an occupancy map  
    auto const sample_occupancy_map = get_test_occupancy_map();  
  
    auto const request = std::make_shared<example_srvs::srv::GetPath::Request>();  
  
    request->start.data = {2, 2};  
    request->goal.data = {5, 5};  
  
    // WHEN the path is requested  
    auto const response = pathing::generate_path::generate_path(  
        request, sample_occupancy_map, pathing::generate_global_path);  
  
    // THEN there should be an error with the error::NO_VALID_PATH type  
    EXPECT_EQ(response.error(), pathing::generate_path::error::NO_VALID_PATH);  
}
```

```
TEST(GeneratePath, PathGenerated) {  
    // GIVEN a GetPath request and an occupancy map  
    auto const sample_occupancy_map = get_test_occupancy_map();  
  
    auto const request = std::make_shared<example_srvs::srv::GetPath::Request>();  
  
    request->start.data = {0, 0};  
    request->goal.data = {7, 7};  
  
    // WHEN the path is requested  
    auto const response = pathing::generate_path::generate_path(  
        request, sample_occupancy_map, pathing::generate_global_path);  
  
    // THEN there should no errors  
    EXPECT_TRUE(response.has_value());  
}
```

- Testing the refactored functionality is trivial
  - Create required parameters
  - Pass the parameters into the function under test
  - Check the return

# Testing the Refactored PathGenerator

```
TEST(GeneratePath, NoValidPath) {  
    // GIVEN a GetPath request and an occupancy map  
    auto const sample_occupancy_map = get_test_occupancy_map();  
  
    auto const request = std::make_shared<example_srvs::srv::GetPath::Request>();  
  
    request->start.data = {2, 2};  
    request->goal.data = {5, 5};  
  
    // WHEN the path is requested  
    auto const response = pathing::generate_path::generate_path(  
        request, sample_occupancy_map, pathing::generate_global_path);  
  
    // THEN there should be an error with the error::NO_VALID_PATH type  
    EXPECT_EQ(response.error(), pathing::generate_path::error::NO_VALID_PATH);  
}
```

```
TEST(GeneratePath, PathGenerated) {  
    // GIVEN a GetPath request and an occupancy map  
    auto const sample_occupancy_map = get_test_occupancy_map();  
  
    auto const request = std::make_shared<example_srvs::srv::GetPath::Request>();  
  
    request->start.data = {0, 0};  
    request->goal.data = {7, 7};  
  
    // WHEN the path is requested  
    auto const response = pathing::generate_path::generate_path(  
        request, sample_occupancy_map, pathing::generate_global_path);  
  
    // THEN there should no errors  
    EXPECT_TRUE(response.has_value());  
}
```

- Testing the refactored functionality is trivial
  - Create required parameters
  - Pass the parameters into the function under test
  - Check the return
- All the functions that have been refactored so far can be tested this way

# Testing the Refactored PathGenerator

```
TEST(GeneratePath, NoValidPath) {  
    // GIVEN a GetPath request and an occupancy map  
    auto const sample_occupancy_map = get_test_occupancy_map();  
  
    auto const request = std::make_shared<example_srvs::srv::GetPath::Request>();  
  
    request->start.data = {2, 2};  
    request->goal.data = {5, 5};  
  
    // WHEN the path is requested  
    auto const response = pathing::generate_path::generate_path(  
        request, sample_occupancy_map, pathing::generate_global_path);  
  
    // THEN there should be an error with the error::NO_VALID_PATH type  
    EXPECT_EQ(response.error(), pathing::generate_path::error::NO_VALID_PATH);  
}
```

```
TEST(GeneratePath, PathGenerated) {  
    // GIVEN a GetPath request and an occupancy map  
    auto const sample_occupancy_map = get_test_occupancy_map();  
  
    auto const request = std::make_shared<example_srvs::srv::GetPath::Request>();  
  
    request->start.data = {0, 0};  
    request->goal.data = {7, 7};  
  
    // WHEN the path is requested  
    auto const response = pathing::generate_path::generate_path(  
        request, sample_occupancy_map, pathing::generate_global_path);  
  
    // THEN there should be no errors  
    EXPECT_TRUE(response.has_value());  
}
```

- Testing the refactored functionality is trivial
  - Create required parameters
  - Pass the parameters into the function under test
  - Check the return
- All the functions that have been refactored so far can be tested this way
- Everything can now be put together for the callback being executed by the generate path service

# Testing the Refactored PathGenerator

```
TEST(GeneratePath, NoValidPath) {  
    // GIVEN a GetPath request and an occupancy map  
    auto const sample_occupancy_map = get_test_occupancy_map();  
  
    auto const request = std::make_shared<example_srvs::srv::GetPath::Request>();  
  
    request->start.data = {2, 2};  
    request->goal.data = {5, 5};  
  
    // WHEN the path is requested  
    auto const response = pathing::generate_path::generate_path(  
        request, sample_occupancy_map, pathing::generate_global_path);  
  
    // THEN there should be an error with the error::NO_VALID_PATH type  
    EXPECT_EQ(response.error(), pathing::generate_path::error::NO_VALID_PATH);  
}  
  
TEST(GeneratePath, PathGenerated) {  
    // GIVEN a GetPath request and an occupancy map  
    auto const sample_occupancy_map = get_test_occupancy_map();  
  
    auto const request = std::make_shared<example_srvs::srv::GetPath::Request>();  
  
    request->start.data = {0, 0};  
    request->goal.data = {7, 7};  
  
    // WHEN the path is requested  
    auto const response = pathing::generate_path::generate_path(  
        request, sample_occupancy_map, pathing::generate_global_path);  
  
    // THEN there should no errors  
    EXPECT_TRUE(response.has_value());  
}
```

- Testing the refactored functionality is trivial
  - Create required parameters
  - Pass the parameters into the function under test
  - Check the return
- All the functions that have been refactored so far can be tested this way
- Everything can now be put together for the callback being executed by the generate path service
- **All of this has been done without invoking the ROS 2 API!**

# Putting it all together

```
[this](auto const request, auto response) {  
    auto const print_error = [this](std::string_view error)  
        -> std::expected<GetPath::Response, std::string> {...};  
  
    auto const return_empty_response = []([[maybe_unused]] auto const)  
        -> std::expected<GetPath::Response, std::string> {...};  
  
    auto const stringify_error = [](auto const error) {...};  
  
    *response = generate_path::generate_path(request, this->map_,  
generate_global_path)  
        .map_error(stringify_error)  
        .or_else(print_error)  
        .or_else(return_empty_response)  
        .value();  
}
```

- The generate path callback function has been replaced by a lambda function



# Putting it all together

```
[this](auto const request, auto response) {  
    auto const print_error = [this](std::string_view error)  
        -> std::expected<GetPath::Response, std::string> {...};  
  
    auto const return_empty_response = []([[maybe_unused]] auto const)  
        -> std::expected<GetPath::Response, std::string> {...};  
  
    auto const stringify_error = [](auto const error) {...};  
  
    *response = generate_path::generate_path(request, this->map_,  
generate_global_path)  
        .map_error(stringify_error)  
        .or_else(print_error)  
        .or_else(return_empty_response)  
        .value();  
}
```

- The generate path callback function has been replaced by a lambda function
- If generate\_path returns the expected value, it is directly assigned to response

# Putting it all together

```
[this](auto const request, auto response) {  
    auto const print_error = [this](std::string_view error)  
        -> std::expected<GetPath::Response, std::string> {...};  
  
    auto const return_empty_response = []([[maybe_unused]] auto const)  
        -> std::expected<GetPath::Response, std::string> {...};  
  
    auto const stringify_error = [](auto const error) {...};  
  
    *response = generate_path::generate_path(request, this->map_,  
generate_global_path)  
        .map_error(stringify_error)  
        .or_else(print_error)  
        .or_else(return_empty_response)  
        .value();  
}
```

- The generate path callback function has been replaced by a lambda function
- If generate\_path returns the expected value, it is directly assigned to response
- If generate\_path returns an error, the error is handled by chaining functions together
  - This is the result of returning a monadic type and performing monadic error handling

# Putting it all together

```
[this](auto const request, auto response) {  
    auto const print_error = [this](std::string_view error)  
        -> std::expected<GetPath::Response, std::string> {...};  
  
    auto const return_empty_response = []([[maybe_unused]] auto const)  
        -> std::expected<GetPath::Response, std::string> {...};  
  
    auto const stringify_error = [](auto const error) {...};  
  
    *response = generate_path::generate_path(request, this->map_,  
generate_global_path)  
        .map_error(stringify_error)  
        .or_else(print_error)  
        .or_else(return_empty_response)  
        .value();  
}
```

- The generate path callback function has been replaced by a lambda function
- If generate\_path returns the expected value, it is directly assigned to response
- If generate\_path returns an error, the error is handled by chaining functions together
  - This is the result of returning a monadic type and performing monadic error handling
- If needed, more functions can be added to manipulate the expected type or error type, increasing modularity

# Putting it all together

```
[this](auto const request, auto response) {  
    auto const print_error = [this](std::string_view error)  
        -> std::expected<GetPath::Response, std::string> {...};  
  
    auto const return_empty_response = []([[maybe_unused]] auto const)  
        -> std::expected<GetPath::Response, std::string> {...};  
  
    auto const stringify_error = [](auto const error) {...};  
  
    *response = generate_path::generate_path(request, this->map_,  
generate_global_path)  
        .map_error(stringify_error)  
        .or_else(print_error)  
        .or_else(return_empty_response)  
        .value();  
}
```

- The generate path callback function has been replaced by a lambda function
- If generate\_path returns the expected value, it is directly assigned to response
- If generate\_path returns an error, the error is handled by chaining functions together
  - This is the result of returning a monadic type and performing monadic error handling
- If needed, more functions can be added to manipulate the expected type or error type, increasing modularity
- How can this lambda be tested?

# DI and Functional Programming

```
template <typename ServiceType>
using ServiceCallback = std::function<void(
    std::shared_ptr<typename ServiceType::Request>const ,
    std::shared_ptr<typename ServiceType::Response>>>;

struct Manager {
    struct MiddlewareHandle {
        // Define map service callback type
        using SetMapCallback = ServiceCallback<example_srvs::srv::SetMap>;

        // Define path generation service callback type
        using GeneratePathCallback = ServiceCallback<example_srvs::srv::GetPath>;

        virtual ~MiddlewareHandle() = default;

        virtual void register_set_map_service(SetMapCallback callback) = 0;

        virtual void register_generate_path_service(GeneratePathCallback callback) = 0;

        virtual void log_error(std::string const& msg) = 0;

        virtual void log_info(std::string const& msg) = 0;
    };

    Manager(std::unique_ptr<MiddlewareHandle> mw);

private:
    std::unique_ptr<MiddlewareHandle> mw_;

    Map<unsigned char> map_;
};
```

- With Dependency Injection (DI)!

# DI and Functional Programming

```
template <typename ServiceType>
using ServiceCallback = std::function<void(
    std::shared_ptr<typename ServiceType::Request>const ,
    std::shared_ptr<typename ServiceType::Response>)>;

struct Manager {
    struct MiddlewareHandle {
        // Define map service callback type
        using SetMapCallback = ServiceCallback<example_srvs::srv::SetMap>;

        // Define path generation service callback type
        using GeneratePathCallback = ServiceCallback<example_srvs::srv::GetPath>;

        virtual ~MiddlewareHandle() = default;

        virtual void register_set_map_service(SetMapCallback callback) = 0;

        virtual void register_generate_path_service(GeneratePathCallback callback) = 0;

        virtual void log_error(std::string const& msg) = 0;

        virtual void log_info(std::string const& msg) = 0;
    };

    Manager(std::unique_ptr<MiddlewareHandle> mw);

private:
    std::unique_ptr<MiddlewareHandle> mw_;

    Map<unsigned char> map_;
};
```

- With Dependency Injection (DI)!
  - DI is used to move or “inject” objects into another object

# DI and Functional Programming

```
template <typename ServiceType>
using ServiceCallback = std::function<void(
    std::shared_ptr<typename ServiceType::Request>const ,
    std::shared_ptr<typename ServiceType::Response>)>;

struct Manager {
    struct MiddlewareHandle {
        // Define map service callback type
        using SetMapCallback = ServiceCallback<example_srvs::srv::SetMap>;

        // Define path generation service callback type
        using GeneratePathCallback = ServiceCallback<example_srvs::srv::GetPath>;

        virtual ~MiddlewareHandle() = default;

        virtual void register_set_map_service(SetMapCallback callback) = 0;

        virtual void register_generate_path_service(GeneratePathCallback callback) = 0;

        virtual void log_error(std::string const& msg) = 0;

        virtual void log_info(std::string const& msg) = 0;
    };

    Manager(std::unique_ptr<MiddlewareHandle> mw);

private:
    std::unique_ptr<MiddlewareHandle> mw_;

    Map<unsigned char> map_;
};
```

- With Dependency Injection (DI)!
  - DI is used to move or “inject” objects into another object
- There still needs to be mutable state, to keep track of the occupancy map between service calls, thus the map\_ member variable

# DI and Functional Programming

```
template <typename ServiceType>
using ServiceCallback = std::function<void(
    std::shared_ptr<typename ServiceType::Request>const ,
    std::shared_ptr<typename ServiceType::Response>)>;

struct Manager {
    struct MiddlewareHandle {
        // Define map service callback type
        using SetMapCallback = ServiceCallback<example_srvs::srv::SetMap>;

        // Define path generation service callback type
        using GeneratePathCallback = ServiceCallback<example_srvs::srv::GetPath>;

        virtual ~MiddlewareHandle() = default;

        virtual void register_set_map_service(SetMapCallback callback) = 0;

        virtual void register_generate_path_service(GeneratePathCallback callback) = 0;

        virtual void log_error(std::string const& msg) = 0;

        virtual void log_info(std::string const& msg) = 0;
    };

    Manager(std::unique_ptr<MiddlewareHandle> mw);

private:
    std::unique_ptr<MiddlewareHandle> mw_;

    Map<unsigned char> map_;
};
```

- With Dependency Injection (DI)!
  - DI is used to move or “inject” objects into another object
- There still needs to be mutable state, to keep track of the occupancy map between service calls, thus the map\_ member variable
- For the Manager object, a MiddlewareHandle struct is defined that is the interface for the injected dependency
- This abstract interface can be used to implement each function using the ROS API



# DI and Functional Programming

```
template <typename ServiceType>
using ServiceCallback = std::function<void(
    std::shared_ptr<typename ServiceType::Request>const ,
    std::shared_ptr<typename ServiceType::Response>)>;

struct Manager {
    struct MiddlewareHandle {
        // Define map service callback type
        using SetMapCallback = ServiceCallback<example_srvs::srv::SetMap>;

        // Define path generation service callback type
        using GeneratePathCallback = ServiceCallback<example_srvs::srv::GetPath>;

        virtual ~MiddlewareHandle() = default;

        virtual void register_set_map_service(SetMapCallback callback) = 0;

        virtual void register_generate_path_service(GeneratePathCallback callback) = 0;

        virtual void log_error(std::string const& msg) = 0;

        virtual void log_info(std::string const& msg) = 0;
    };

    Manager(std::unique_ptr<MiddlewareHandle> mw);

private:
    std::unique_ptr<MiddlewareHandle> mw_;

    Map<unsigned char> map_;
};
```

- With Dependency Injection (DI)!
  - DI is used to move or “inject” objects into another object
- There still needs to be mutable state, to keep track of the occupancy map between service calls, thus the `map_` member variable
- For the Manager object, a `MiddlewareHandle` struct is defined that is the interface for the injected dependency
- This abstract interface can be used to implement each function using the ROS API
- The lambda function that is used for the generate path service can be captured via mocking and tested

# Testing with DI

```
struct PathManagerFixture : public testing::Test {
    PathManagerFixture() : mw_{std::make_unique<MockMiddlewareHandle>()} {
        // When the map callback is called, set the costmap
        ON_CALL(*mw_, register_set_map_service(testing::_))
            .WillByDefault([&](auto const& map_callback) {
                auto const map_request = make_occupancy_map();
                auto map_response = std::make_shared<SetMap::Response>();
                map_callback(map_request, map_response);
            });
        // Capture the path callback so it can be called later
        ON_CALL(*mw_, register_generate_path_service(testing::_))
            .WillByDefault(testing::SaveArg<0>(&path_callback_));
    }
    std::unique_ptr<MockMiddlewareHandle> mw_;
    pathing::Manager::MiddlewareHandle::GeneratePathCallback path_callback_;
};

TEST_F(PathManagerFixture, NoPath) {
    // GIVEN a path generator with a costmap
    auto const path_generator = pathing::Manager{std::move(mw_)};
    // WHEN the generate path service is called with an unreachable goal
    auto path_request = std::make_shared<GetPath::Request>();
    path_request->start.data = {2, 2};
    path_request->goal.data = {5, 5};
    auto path_response = std::make_shared<GetPath::Response>();
    path_callback_(path_request, path_response);
    // THEN the path generator should succeed
    EXPECT_EQ(path_response->code.code, example_srvs::msg::GetPathCodes::NO_VALID_PATH);
    auto const expected = pathing::Path{};
    // AND the path should be empty
    EXPECT_EQ(pathing::utilities::parseGeneratedPath(path_response->path), expected);
}
```

- Here is the code testing the generate path lambda function

# Testing with DI

```
struct PathManagerFixture : public testing::Test {
    PathManagerFixture() : mw_{std::make_unique<MockMiddlewareHandle>()} {
        // When the map callback is called, set the costmap
        ON_CALL(*mw_, register_set_map_service(testing::_))
            .WillByDefault([&](auto const& map_callback) {
                auto const map_request = make_occupancy_map();
                auto map_response = std::make_shared<SetMap::Response>();
                map_callback(map_request, map_response);
            });
        // Capture the path callback so it can be called later
        ON_CALL(*mw_, register_generate_path_service(testing::_))
            .WillByDefault(testing::SaveArg<0>(&path_callback_));
    }
    std::unique_ptr<MockMiddlewareHandle> mw_;
    pathing::Manager::MiddlewareHandle::GeneratePathCallback path_callback_;
};
```

```
TEST_F(PathManagerFixture, NoPath) {
    // GIVEN a path generator with a costmap
    auto const path_generator = pathing::Manager{std::move(mw_)};
    // WHEN the generate path service is called with an unreachable goal
    auto path_request = std::make_shared<GetPath::Request>();
    path_request->start.data = {2, 2};
    path_request->goal.data = {5, 5};
    auto path_response = std::make_shared<GetPath::Response>();
    path_callback_(path_request, path_response);
    // THEN the path generator should succeed
    EXPECT_EQ(path_response->code.code, example_srvs::msg::GetPathCodes::NO_VALID_PATH);
    auto const expected = pathing::Path{};
    // AND the path should be empty
    EXPECT_EQ(pathing::utilities::parseGeneratedPath(path_response->path), expected);
}
```

- Here is the code testing the generate path lambda function
- This test fixture calls the callback function for the set occupancy map service when a mock function is executed

# Testing with DI

```
struct PathManagerFixture : public testing::Test {
    PathManagerFixture() : mw_{std::make_unique<MockMiddlewareHandle>()} {
        // When the map callback is called, set the costmap
        ON_CALL(*mw_, register_set_map_service(testing::_))
            .WillByDefault([&](auto const& map_callback) {
                auto const map_request = make_occupancy_map();
                auto map_response = std::make_shared<SetMap::Response>();
                map_callback(map_request, map_response);
            });
        // Capture the path callback so it can be called later
        ON_CALL(*mw_, register_generate_path_service(testing::_))
            .WillByDefault(testing::SaveArg<0>(&path_callback_));
    }
    std::unique_ptr<MockMiddlewareHandle> mw_;
    pathing::Manager::MiddlewareHandle::GeneratePathCallback path_callback_;
};
```

```
TEST_F(PathManagerFixture, NoPath) {
    // GIVEN a path generator with a costmap
    auto const path_generator = pathing::Manager{std::move(mw_)};
    // WHEN the generate path service is called with an unreachable goal
    auto path_request = std::make_shared<GetPath::Request>();
    path_request->start.data = {2, 2};
    path_request->goal.data = {5, 5};
    auto path_response = std::make_shared<GetPath::Response>();
    path_callback_(path_request, path_response);
    // THEN the path generator should succeed
    EXPECT_EQ(path_response->code.code, example_srvs::msg::GetPathCodes::NO_VALID_PATH);
    auto const expected = pathing::Path{};
    // AND the path should be empty
    EXPECT_EQ(pathing::utilities::parseGeneratedPath(path_response->path), expected);
}
```

- Here is the code testing the generate path lambda function
- This test fixture calls the callback function for the set occupancy map service when a mock function is executed
- This test fixture also captures the callback function for the generate path service so it can be executed later

# Testing with DI

```
struct PathManagerFixture : public testing::Test {
    PathManagerFixture() : mw_{std::make_unique<MockMiddlewareHandle>()} {
        // When the map callback is called, set the costmap
        ON_CALL(*mw_, register_set_map_service(testing::_))
            .WillByDefault([&](auto const& map_callback) {
                auto const map_request = make_occupancy_map();
                auto map_response = std::make_shared<SetMap::Response>();
                map_callback(map_request, map_response);
            });
        // Capture the path callback so it can be called later
        ON_CALL(*mw_, register_generate_path_service(testing::_))
            .WillByDefault(testing::SaveArg<0>(&path_callback_));
    }
    std::unique_ptr<MockMiddlewareHandle> mw_;
    pathing::Manager::MiddlewareHandle::GeneratePathCallback path_callback_;
};

TEST_F(PathManagerFixture, NoPath) {
    // GIVEN a path generator with a costmap
    auto const path_generator = pathing::Manager{std::move(mw_)};
    // WHEN the generate path service is called with an unreachable goal
    auto path_request = std::make_shared<GetPath::Request>();
    path_request->start.data = {2, 2};
    path_request->goal.data = {5, 5};
    auto path_response = std::make_shared<GetPath::Response>();
    path_callback_(path_request, path_response);
    // THEN the path generator should succeed
    EXPECT_EQ(path_response->code.code, example_srvs::msg::GetPathCodes::NO_VALID_PATH);
    auto const expected = pathing::Path{};
    // AND the path should be empty
    EXPECT_EQ(pathing::utilities::parseGeneratedPath(path_response->path), expected);
}
```

- Here is the code testing the generate path lambda function
- This test fixture calls the callback function for the set occupancy map service when a mock function is executed
- This test fixture also captures the callback function for the generate path service so it can be executed later
- For this test the occupancy map has already been set via the test fixture

# Testing with DI

```
struct PathManagerFixture : public testing::Test {
    PathManagerFixture() : mw_{std::make_unique<MockMiddlewareHandle>()} {
        // When the map callback is called, set the costmap
        ON_CALL(*mw_, register_set_map_service(testing::_))
            .WillByDefault([&](auto const& map_callback) {
                auto const map_request = make_occupancy_map();
                auto map_response = std::make_shared<SetMap::Response>();
                map_callback(map_request, map_response);
            });
        // Capture the path callback so it can be called later
        ON_CALL(*mw_, register_generate_path_service(testing::_))
            .WillByDefault(testing::SaveArg<0>(&path_callback_));
    }
    std::unique_ptr<MockMiddlewareHandle> mw_;
    pathing::Manager::MiddlewareHandle::GeneratePathCallback path_callback_;
};

TEST_F(PathManagerFixture, NoPath) {
    // GIVEN a path generator with a costmap
    auto const path_generator = pathing::Manager{std::move(mw_)};
    // WHEN the generate path service is called with an unreachable goal
    auto path_request = std::make_shared<GetPath::Request>();
    path_request->start.data = {2, 2};
    path_request->goal.data = {5, 5};
    auto path_response = std::make_shared<GetPath::Response>();
    path_callback_(path_request, path_response);
    // THEN the path generator should succeed
    EXPECT_EQ(path_response->code.code, example_srvs::msg::GetPathCodes::NO_VALID_PATH);
    auto const expected = pathing::Path{};
    // AND the path should be empty
    EXPECT_EQ(pathing::utilities::parseGeneratedPath(path_response->path), expected);
}
```

- Here is the code testing the generate path lambda function
- This test fixture calls the callback function for the set occupancy map service when a mock function is executed
- This test fixture also captures the callback function for the generate path service so it can be executed later
- For this test the occupancy map has already been set via the test fixture
- The generate path callback can now be tested by executing the callback function directly

# Testing with DI

```
struct PathManagerFixture : public testing::Test {
    PathManagerFixture() : mw_{std::make_unique<MockMiddlewareHandle>()} {
        // When the map callback is called, set the costmap
        ON_CALL(*mw_, register_set_map_service(testing::_))
            .WillByDefault([&](auto const& map_callback) {
                auto const map_request = make_occupancy_map();
                auto map_response = std::make_shared<SetMap::Response>();
                map_callback(map_request, map_response);
            });
        // Capture the path callback so it can be called later
        ON_CALL(*mw_, register_generate_path_service(testing::_))
            .WillByDefault(testing::SaveArg<0>(&path_callback_));
    }
    std::unique_ptr<MockMiddlewareHandle> mw_;
    pathing::Manager::MiddlewareHandle::GeneratePathCallback path_callback_;
};

TEST_F(PathManagerFixture, NoPath) {
    // GIVEN a path generator with a costmap
    auto const path_generator = pathing::Manager{std::move(mw_)};
    // WHEN the generate path service is called with an unreachable goal
    auto path_request = std::make_shared<GetPath::Request>();
    path_request->start.data = {2, 2};
    path_request->goal.data = {5, 5};
    auto path_response = std::make_shared<GetPath::Response>();
    path_callback_(path_request, path_response);
    // THEN the path generator should succeed
    EXPECT_EQ(path_response->code.code, example_srvs::msg::GetPathCodes::NO_VALID_PATH);
    auto const expected = pathing::Path{};
    // AND the path should be empty
    EXPECT_EQ(pathing::utilities::parseGeneratedPath(path_response->path), expected);
}
```

- Here is the code testing the generate path lambda function
- This test fixture calls the callback function for the set occupancy map service when a mock function is executed
- This test fixture also captures the callback function for the generate path service so it can be executed later
- For this test the occupancy map has already been set via the test fixture
- The generate path callback can now be tested by executing the callback function directly
- **There was no invocation of the middleware using DI and all code is testable without invoking the ROS 2 API!**

# Conclusion



# Conclusion

- The refactored tests are deterministic - they cannot be flaky

# Conclusion

- The refactored tests are deterministic - they cannot be flaky
- Break down code into discrete components that can be tested

# Conclusion

- The refactored tests are deterministic - they cannot be flaky
- Break down code into discrete components that can be tested
- Prioritize using pure functions - easier to test and reason about

# Conclusion

- The refactored tests are deterministic - they cannot be flaky
- Break down code into discrete components that can be tested
- Prioritize using pure functions - easier to test and reason about
- Using higher order functions increased the modularity of the code, in this case allowing for different path generating algorithms to be used

# Conclusion

- The refactored tests are deterministic - they cannot be flaky
- Break down code into discrete components that can be tested
- Prioritize using pure functions - easier to test and reason about
- Using higher order functions increased the modularity of the code, in this case allowing for different path generating algorithms to be used
- Monadic error handling led to easier error checking

# Conclusion

- The refactored tests are deterministic - they cannot be flaky
- Break down code into discrete components that can be tested
- Prioritize using pure functions - easier to test and reason about
- Using higher order functions increased the modularity of the code, in this case allowing for different path generating algorithms to be used
- Monadic error handling led to easier error checking
- Refactoring PathGenerator using DI in conjunction with the functional programming paradigm led to code that has 100% coverage

# Thanks to:

- Mariyum Gill
- Griswald Brooks
- Davide Faconti
- Kyle Kirves
- Tyler Weaver
- Chris Thrasher
- Brian Cairl
- Everyone else at PickNik

**Bilal Gill**

**Leveraging a Functional Approach for More Testable and Maintainable  
ROS 2 Code**

**Thank you!**

All code and the presentation are available at  
[https://github.com/PickNikRobotics/ros\\_testing\\_templates](https://github.com/PickNikRobotics/ros_testing_templates)

