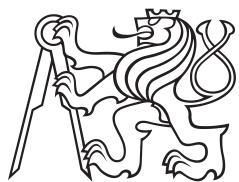


Bachelor Thesis



Czech
Technical
University
in Prague

F3

Faculty of Electrical Engineering
Department of Cybernetics

Autonomous road crossing with a mobile robot

Jan Vlk

Supervisor: Mgr. Martin Pecka, Ph.D.
Field of study: Cybernetics and Robotics
June 2023

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II. Bachelor's thesis details

Bachelor's thesis title in English:

Autonomous Road Crossing with a Mobile Robot

Bachelor's thesis title in Czech:

Autonomní p řezd silnice mobilním robotem

Guidelines:

The goal of the thesis is design, implementation and experimental verification of an algorithm for safe crossing of roads with public traffic with a mid-sized mobile robot. The student should review existing approaches to the problem and assess their suitability for use on target robotic platforms. Also, a method for evaluating performance of road-crossing algorithms should be proposed and applied. In the implementation, sensor data from color cameras, 3D lidars and public cartographic data can be used to improve performance of the algorithm. The algorithm should also expect an input with poses and velocities of detected vehicles, although the detection itself is not a part of this thesis. Other contextual inputs can be given, like maximal or expected velocity of incoming vehicles, road type, number of lanes on the road or presence of a pedestrian crossing with or without traffic lights. Given this context and vehicle velocity data, the algorithm should be able to safely assess the situation and decide whether it is safe to cross the road in a given moment or not. In the safe case, a control algorithm should be developed that will perform the actual road crossing (with continuous checking of safety of the maneuver).

Experimental verification of the work should be done both in simulation and in a controlled real-world experiment. In the real-world experiment, the robot will not enter a real public driving road, but an experimental setup in a non-public area will be set up (in cooperation with thesis supervisor) to demonstrate behavior of the algorithm even in case of incoming traffic (which will be driven by faculty staff). Results of these experiments should be evaluated according to the proposed performance metric.

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III. Assignment receipt

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Acknowledgements

I would like to express my sincere gratitude to everyone who supported me throughout the completion of this bachelor's thesis. My most profound appreciation goes to my advisor, Martin Pecka, for his invaluable guidance, feedback and support throughout the research and development process.

I am also grateful to my family and friends for their unwavering support and motivation. Their love and encouragement kept me motivated to finish this thesis and achieve this milestone.

Finally, I want to acknowledge the faculty staff who generously shared their time for this research in its experimental phase. Their willingness to participate enabled me to conduct this study and make meaningful contributions to the field.

Thank you all for your support and encouragement!

Declaration

I declare that the presented work was developed independently and that I have listed all sources of information used within it in accordance with the methodical instructions for observing the ethical principles in the preparation of university theses.

Prague, April 7, 2023

Prohlašuji, že jsem předloženou práci vypracoval samostatně a že jsem uvedl veškeré použité informační zdroje v souladu s Metodickým pokynem o dodržování etických principů při přípravě vysokoškolských závěrečných prací.

Praha, 7. dubna 2023

Abstract

In this thesis, our task was to design, implement and evaluate an algorithm for the safe crossing of public roads with a middle-size mobile robot.

The first part of this task is to conclude whether it is safe to cross the road in the robot's current location. If it is, the second part of the task is developing a control algorithm to perform the movement needed to cross the road. Continuous monitoring of the traffic situation is necessary for the safety of the maneuver. We are also to provide evaluation metrics for determining the functionality and optimality of developed algorithms. The verification and evaluation of the developed algorithm will be conducted in simulation and a controlled real-world experiment.

Keywords: Autonomous robot operation, behavior trees, collision avoidance, collision detection, finite-state machines, road crossing, ROS

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Abstrakt

V této práci je naším úkolem navrhnout, implementovat a vyhodnotit algoritmus pro bezpečný přejezd silnic s mobilním robotem střední velikosti.

První část úkolu je zjistit, zda je bezpečné přejít silnici v místě, kde se robot právě nachází. Pokud ano, druhá část úkolu je navrhnout algoritmus pro řízení pohybu potřebného k přejetí silnice. Pro bezpečnost manévrů je nutné provádět kontinuální monitorování dopravní situace.

V neposlední řadě je třeba navrhnout metriku pro vyhodnocení funkčnosti a optimálnosti vyvinutých algoritmů. Verifikaci a vyhodnocení vyvinutého algoritmu provedeme v simulaci a v kontrolovaném experimentu v reálném světě.

Klíčová slova: Autonomní operace robota, detekce kolizí, konečné stavové automaty, přejíždění silnic, ROS, rozhodovací stromy, vyhýbání se kolizím

Překlad názvu: Autonomní přejezd silnice mobilním robotem

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Introduction

In today's world, mobile robots are increasingly being utilized in a variety of applications. In many of these applications, the robots must cross roads to achieve their goals, making it essential to design an algorithm that enables the robot to cross the road safely.

The algorithm should be able to determine whether the current place is suitable for crossing. The algorithm will accept contextual inputs such as vehicle velocity data, road type, number of lanes, and the presence of a pedestrian crossing with or without traffic lights. These data will be used to assess the current situation and determine whether it is safe to cross the road. If it is, it should facilitate the crossing itself. If the location is not suitable, the algorithm should provide a reason and suggest a more appropriate location nearby. The algorithm must also be designed to operate on different robots with various sensor configurations and on different road types without any limitations.

This thesis aims to provide a theoretical background to the problem and explore possible solutions. We will also present the hardware and software used for real-world and simulation experiments. We will discuss our chosen approach and its functionality and present the algorithms we developed and implemented. Finally, we will explain the results of our experiments and discuss their significance.

Our work also depends on the output of other projects, such as vehicle detection and localization or path planning. We cannot rely on these projects to be completed or entirely functional. Therefore, we need a way to simulate and test our algorithm without them.

In simulation experiments, we will inject data directly into our algorithm. For real-world experiments, we will use the outcomes of the respective projects. However, we can inject data directly into our algorithm, provided the projects are not finished or functional. mework, a collection of tools, libraries and conventions for robot software development.

Used abbreviations

- **AI** – Artificial Intelligence
- **API** – Application Programming Interface
- **BT** – Behavior Tree
- **CRAS** – Center for Robotics and Autonomous Systems
- **ENU** – East-North-Up
- **FSM** – Finite State Machine
- **GPS** – Global Positioning System
- **GUI** – Graphical User Interface
- **HFMS** – Hierarchical Finite State Machine
- **LiDAR** – Laser imaging Detection and Ranging
- **NED** – North-East-Down
- **NPC** – Non-Player Character
- **OSM** – Open Street Map
- **REP** – ROS Enhancement Proposals
- **RL** – Reinforcement Learning
- **ROS** – Robot Operating System
- **TPI** – Terrain Profile Index
- **UTM** – Universal Transverse Mercator
- **WGS84** – World Geodetic System 1984
- **ZABAGED** – Základní báze geografických dat (Basic database of geographic data)

Chapter 1

Theoretical background

1.1 Behavior trees

A behavior tree (BT) is a way to structure algorithms – the switching between individual tasks in an autonomous agent. It was created to express behavior patterns for NPCs (non-playable characters) in computer games. Since then, it has found many more applications, and nowadays, it is also widely used in robotics and AI applications.

BTs, as the name suggests, are tree-like structures where each node represents an action, a condition, a control, or a decorator node. Action and control nodes are leaves of the tree structure. Control nodes are used to control and modify the flow of the tree. Examples of these nodes are `sequence`, `fallback`, or `repeat`. Decorator nodes are used to modify the return values, thus modifying the behavior of its children. Examples of these nodes are `force-success`, `force-failure`, or `inverter`.

The execution of a BT commences at the root node and then progressively traverses the tree structure in a depth-first fashion polling its nodes. The nodes' polling, more frequently called the ticking, is periodically repeated. Each node, once ticked, begins its execution process, and once finished, it returns a status. This status can be either `SUCCESS`, `FAILURE`, or `RUNNING`. The action and control nodes are responsible for determining and returning these states. The control nodes alter the tree's flow and tick handling based on its children's return states. Decorator nodes modify the return states of their children. The return status of some nodes is shown in table 1.1.

Node type	SUCCESS	FAILURE	RUNNING
Action	Successful completion	Unable to complete	During completion
Condition	Condition is true	Condition is false	N/A
Sequence	All children succeed	One child fails	One child running
Fallback	One child succeeds	All children fail	One child running
Parallel	N children succeed	$< N$ children succeed	All children running
Repeat	Child succeeds	Child fails x times	Child running

Table 1.1: Return states of some nodes.

A more thorough explanation of the behavior trees can be found in the first chapter in [1].

1.1.1 Commonly used nodes

Here we will present the most commonly used nodes and their functionality.

Sequence – Control node that polls its children one at a time in a pre-defined order. If one of the children were to return FAILURE, the polling of other children is stopped, and the **sequence** node returns FAILURE. The same happens if one of the children returns RUNNING. If all children return SUCCESS the **sequence** node returns SUCCESS.

Fallback – Also known as **Selector** is a control node that polls its children one at a time in a predefined order. If one of the children were to return SUCCESS, the polling of other children is stopped, and the **fallback** node returns SUCCESS. The same happens if one of the children returns RUNNING. If all children return FAILURE the **fallback** node returns FAILURE.

Parallel – Control node that allows multiple actions to run concurrently. It returns SUCCESS if N or more children return SUCCESS and FAILURE if less than N children return SUCCESS. If all children return RUNNING the **parallel** node returns RUNNING.

Repeat – Control node that polls its child a specified number of times or until the child returns SUCCESS, whichever comes first. If the child returns RUNNING, the **repeat** node returns RUNNING. If the child does not return SUCCESS before the number of repetition is reached the **repeat** node returns FAILURE.

Inverter – Decorator node that inverts the return state of its child. If the child returns SUCCESS, the **inverter** node returns FAILURE and vice versa. If the child returns RUNNING the **inverter** node returns RUNNING.

Force-success – Decorator node that returns SUCCESS regardless of the return state of its child.

Force-failure – Decorator node that returns FAILURE regardless of the return state of its child.

1.1.2 Graphical representation of BTs

We will represent the BTs in this work in the following way. Action nodes will be rectangular with the name of the action written inside. Control nodes will be elliptical with the name of the condition written inside. Control and decorator nodes will be rectangular with a corresponding symbol inside. The symbols are shown in a table 1.2.

If the BT has a sub-tree in its structure, we will represent it as a diamond shape node with the sub-tree name written inside.

Node type	Description	Symbol
Root	The root of the tree	Root
Sequence	Ticks its children if the return is SUCCESS	\rightarrow
SequenceStar	Ticks its children if the return is SUCCESS	\rightarrow^*
Fallback	Ticks its children if the return is FAILURE	?
Parallel	Allows multiple actions to run concurrently	\Rightarrow
Repeat	Repeats the child node (x) times	$\circ(x)$
ForceSuccess	Allways returns SUCCESS	✓
ForceFailure	Allways returns FAILURE	✗
Inverter	Inverts the return value of its child	≠

Table 1.2: Symbols used for control and decorator nodes in BTs.

1.1.3 BT example

We will present a simple example demonstrating the BTs structure and design principles.

The example BT is shown in figure 1.1. This BT was created in the algorithm design's beginning phase, and its modified version will be presented later as it is used in the final implementation. The goal of this sub-tree was to position the robot so that it would cross the road as fast as possible, meaning we wanted the robot to stand perpendicular to the road.

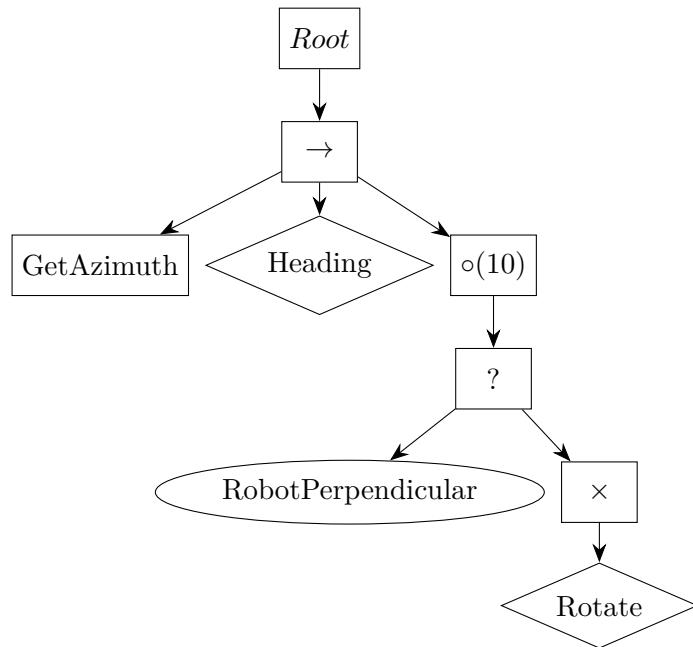


Figure 1.1: BT example.

We start in the root node and continue straight to the sequence node.

From there, we go to the action node GetAzimuth, which gives us the current heading of the robot. If the execution of the GetAzimuth node is successful, we continue to the Heading sub-tree node. This sub-tree aims to calculate the heading the robot needs to achieve in order to be perpendicular. If all nodes inside the sub-tree are successful, we continue to the `repeat` node. This node will repeat its children ten times (or less if success is achieved sooner). The first child we will tick is a `fallback` node, with its first child being a condition node RobotPerpendicular. The condition node return value states whether or not the robot is already perpendicular to the road, we mean to cross. If we are not yet perpendicular, we continue. The next node we tick is a `force-failure` node with a sub-tree node as its child. The sub-tree is responsible for rotating the robot to the desired heading.

■ 1.1.4 Other BT nodes

Here we will present other BT nodes. These nodes are an expansion on the common ones and are implementation specific.

SequenceStar (\rightarrow^*) – Also known as `SequenceWithMemory`, a control node that functions in the same way as `Sequence`. The only difference is that this node does not repeat children that returned `SUCCESS` until all children have. Meaning until the `SequenceStar` node returns `SUCCESS` it will tick only the children that have not succeeded yet.

■ 1.2 Finite-state machines

Finite-state machines (FSM) are a mathematical model of computation. They are used to model the behavior of a system in a finite number of pre-defined states. The system can be in only one state at a time. In each state, a computation or an action is performed. The change of a state is possible only via predetermined transitions triggered by a condition.

FSMs are a common method of describing and solving high-level sequential control problems. They are used in many fields, such as robotics, computer science, electrical engineering, etc.

FSM offers a very effective method in the implementation of complex robot behavior in comparison to monolithic programming.[2] Moreover, the learning curve for using FSM is minor; it is quite likely the reader already knows about FSMs from math or logic courses. Secondly, the integration itself is almost painless, especially when one takes the FSM into account from early stages of the design.[3]

However, the FSMs are unsuitable for large and complex systems as they tend to become unmanageable and difficult to extend and reuse. This becomes more evident for a fully reactive system, where each state must be able to transition to any other state. Such a condition imposes the FSM to become a fully connected graph ($\mathcal{O}(n^2)$). Maintaining and modifying such a graph is quite a labor-intensive and error-prone task.

FSMs are also unsuitable for systems requiring a high degree of autonomy. The FSMs are not able to learn and adapt to the changing environment. The formal definition of a FSM and several examples can be found in [3].

1.2.1 FSM example

Here we will show the FSM for the example BT (figure 1.1) from the previous section.

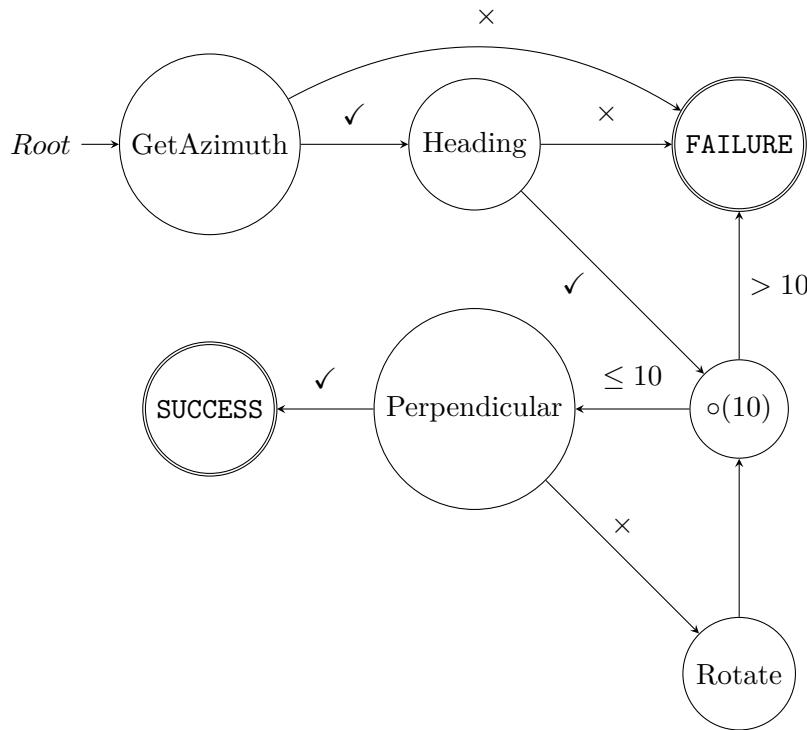


Figure 1.2: FSM for the example BT.

This is not a typical representation of a FSM. It is a one to one rewrite of the BT example. If we were to develop the algorithm using FSMs, the FSM would look different. BTs and FSMs require different mindsets and design principles and while they may be rewritten from one to the other, it usually results in a nonoptimal structure.

1.3 Hierarchical FSMs

Hierarchical state machines (HFSM), also known as statecharts, were developed to alleviate the cumbersome transition duplication required in large FSMs and add structure to aid comprehension of complex systems. It clusters states into a group (named superstate) where all the underlying internal states (substates) implicitly share the same superstate.[4]

While the HFSM solves the problem of transition duplication, it does not

solve the complexity problem. The HFSM is still a fully connected graph unsuitable for large and complex systems.

1.4 Comparison and chosen approach

There are several design approaches we can use to solve the task of crossing a street. We will briefly present them and state few advantages and disadvantages for each one. We will mainly use the informations and insights from [1].

Monolithic approach

We can use a monolithic approach, where we write a single program that will handle all the tasks.

This approach is the most straightforward and easiest to implement but is not very flexible. It would be complicated to modify or extend the abilities of our program to the point where we would be forced to rewrite it in its entirety. This approach also generates a design that is not easily readable, and it would be almost impossible to find and correct bugs and glitches.

For all those reasons, the monolithic approach is unsuitable for anything other than elementary systems, and we will not use it for our solution.

FSM approach

The second approach is to use an FSM. More specifically, HFSM as it is an improvement over FSM and addresses a few of the FSM issues.

The advantages of HFSMs are that the structure is intuitive and generally easy to understand. Being common in many parts of computer sciences and used for quite some time, they are also quite easy to implement. FSMs also offers good flexibility and maintainability for many problems.

The main disadvantage of HFSMs is that the flexibility is limited to certain areas of use and systems with limited scale. It is impossible to easily add new states or transitions in complex systems.

Scalability of FSMs is also a problem. With rising demands on agent AI complexity, game programmers found that the FSMs that they used scaled poorly and were difficult to extend, adapt and reuse.[5]

The FSM's poor scalability means that this approach is also unsuitable for our solution.

BT approach

The third approach is to design the algorithm in the form of a BT.

The advantages of this approach are its modularity, reusability, reactivity, readability, and scalability. Modularity is closely linked with reusability. The design principles of BTs allow us to decompose the algorithm into sub-trees which may be implemented and tested separately. This allows us to tackle large complex systems with relative ease. The BTs are reactive in the sense that they can react quickly and effectively to the changing environment. Even though they require a different design approach than FSMs, they provide a coherent and compact structure that is easy to understand and maintain.

The main disadvantage of BTs is that they are not very common in the industry and are not as well known as FSMs. For this reason, the tools and libraries are not as numerous or mature as those available for FSMs. As mentioned earlier, they are different from FSMs and, as such, require a different approach to designing an optimal solution.

Chosen approach

The approach we have chosen to use in this thesis is the BT approach. We have chosen it for many reasons. Mainly for its scalability, readability, and maintainability of large complex systems are excellent. The BTs are also very flexible and can be easily extended and modified. The BT approach was also suggested by the supervisor.

1.5 Mathematical apparatus

This thesis will use chapters from linear algebra, calculus, geometry, and probability theory.

The used theory will be shown and briefly explained in sections where it is needed. We will not provide precise definitions or state used theorems as it is outside the scope of this work. However, a book, a paper, or an online document with the corresponding information will be provided should the reader require a more thorough explanation.

1.6 Maps

We will use the maps from the OpenStreetMap (OSM) project¹. The maps will be used to determine the surroundings of the robot and whether the current position is suitable for crossing.

OSM is a project that creates and distributes free geographic data. The data is created by the community of users and is available for anyone to use.[6] The map data are expressed either by a node, a way, or a relation. Node is a singular point in map, it could be a landmark, a corner of building or a spot on the road. Way is an object created from multiple nodes. It can be either closed or open. Closed ways may represent a park, building or a some other type of area. Open ways commonly represent roads, rivers, or other linear features. Relation is a collection of nodes, ways, or other relations. It is used to describe more complex objects, such as a bus line, a building complex etc.

¹<https://www.openstreetmap.org>

Chapter 2

Used hardware and software

2.1 Software

All work in this thesis is aimed to work with Robot Operating System (ROS) [7]. We will use ROS1 in version Noetic Ninjemys¹.

Programming languages

The majority of implementation work will be done in a C++ programming language. The version of C++ standard used is C++14, as it is the default for ROS1.

The C++ language was chosen for its speed and efficiency. It was also chosen for some of the libraries we need to use for our project.

The second programming language we will use is Python in version 3.8. Python was chosen for its simplicity and ease of use, as well as for using our previous work in OSM data processing.

BT library

There are a few possibilities regarding the BT library we can use for our solution. As BTs are not very commonly used, the choice is more limited than if we use FSM. Another limiting factor we have is support or direct integration with ROS.

We still have a few options, and we can even choose a programming language in which to implement the BT nodes. The two programming languages with the most library options are C++ and Python. This copies the ROS mentality, where these two languages are natively supported. Some possibilities are discussed here [8].

We have decided to use a C++ behaviortree-cpp-v3 library². The choice was made for multiple reasons. This library was written with deployment in ROS in mind. It is regularly updated and maintained, making it the safe choice for us. It also comes with a documentation that will be helpful during the implementation process. There are two version of the documentation [9] and [10]. We will mainly use the newer one (the second mentioned), but we will

¹<http://wiki.ros.org/noetic>

²<https://github.com/BehaviorTree/BehaviorTree.CPP>

cross reference it with the older one.

Another benefit of this implementation is that it comes with a GUI application for creating BTs called Groot³. This application creates an .xml file with the BT structure we can import into our code later.

Libraries for OSM and work with geographical data

There are a lot of libraries to choose from when it comes to working with OSM data. These libraries are created for different programming languages and have different features.

Even though the majority of our work was written in C++, we were building on top of previous work of assigning costs to road segments in OSM data. This work was done during the 2022 summer as a part of the RobInGas project here at the CTU under the Center for Robotics and Autonomous Systems (CRAS⁴) group.

The work was done in Python, and the library used was the overpy library⁵. This library is used to access the OSM Overpass API and download the map data. The Overpass API (formerly known as OSM Server Side Scripting) is a read-only API that serves up custom-selected parts of the OSM map data. The difference between the main API is that the Overpass API is optimized for small to large consumers (up to roughly 10 million elements). Many services and applications use it as a database backend.[11]

Other libraries used for work with the OSM data were shapely[12], numpy[13] and geodesy⁶. These libraries were used to classify and assign costs to individual road segments in the downloaded OSM data.

In our work, we also need to convert the coordinates of the robot from the GPS coordinate system to the UTM coordinate system. The conversion is done using the GeographicLib library[14].

2.2 Hardware for real-world experiments

2.2.1 Robots

This section will present the robots we will use in real-world experiments. We will use two robotic platforms: Husky and Spot.

Husky

Husky is a medium all-terrain robot developed by Clearpath Robotics. It is a four-wheeled robot with a payload capacity of 75 kg. The weight of this robot without the payload is 50 kg, and its maximal speed is 1 [m/s]. This robot is mainly used outside of urban areas. The photo of Husky is shown in figure 2.1a.

³<https://github.com/BehaviorTree/Groot>

⁴<https://robotics.fel.cvut.cz/cras>

⁵<https://github.com/DinoTools/python-overpy>

⁶<https://github.com/xoolive/geodesy>

More information is available at the Clearpath Robotics website⁷.

Spot

The spot is a medium all-terrain robot developed by Boston Dynamics. It is a four-legged robot with a payload capacity of 14 kg. The weight of this robot without the payload is 33 kg, and its maximal speed is 1.6 [m/s]. This robot is mainly used in urban areas. The photo of the spot is shown in figure 2.1b.

More information is available at the Boston Dynamics website⁸.



(a) : Robot Husky.

(b) : Robot Spot.

Figure 2.1: Robots used in the real-world experiments.

Photos are courtesy of CRAS at FEE CTU.

2.2.2 Sensors

The robots we use are highly dependent on the sensors we attach to them. Without them, the possibilities and options for the mission are limited. We will use some sensors directly and some indirectly. The indirect usage of sensors is due to the need to work with detected vehicles and other obstacles. This detection is not in the scope of our work but is instrumental to its success.

Magnetometer

This is a sensor we use directly. We use it to determine the heading of our robot and help it position itself perpendicular to the road it will try to cross.

Camera

Our robots are fitted with cameras pointing forward, backwards, left, right, and up. This sensor is mostly used to determine the classification of obstacles rather than detecting the obstacles themselves.

The cameras on our robots are GigE Basler ace2 PRO.

⁷<https://clearpathrobotics.com/husky-unmanned-ground-vehicle-robot/>

⁸<https://www.bostondynamics.com/sites/default/files/inline-files/spot-specifications.pdf>

LiDAR

Another sensor our robots are equipped with is LiDAR (laser imaging, detection, and ranging). This sensor detects incoming vehicles and determines their speed and position vectors. It is probably the most important sensor due to its processed data being our algorithm's main switching condition. The LiDARs used on our robots are Ouster OS0-128.

GPS

Robots also have a GPS sensor. We use this sensor for precise localization of the robots in global coordinates.

The GPS sensors we use are Emlid Reach M+.

2.3 Simulation environment

For the simulation environment, we will use the Gazebo simulator. This simulator has direct support for ROS. We also have models of the Husky robot we can use to determine and evaluate the behaviour of our robots.

Chapter 3

Behavior tree algorithm structure

3.1 Creating a BT structure

There are several possible approaches to creating a BT structure. We will present several of these approaches and state the used one. In this section, we used the insight from [15].

The first approach is creating the complete BT by hand. Meaning that humans must design every node and its position and function within the structure.

The second approach is creating an initial BT and letting RL algorithms improve their functionality and optimality. There are a few options for this approach.

The third possible approach is constructing the BT from previously recorded human behavior.

The last possible approach lets the RL algorithm construct the BT structure from scratch.

Chosen approach

We have chosen the first approach, meaning we will construct the whole tree structure by hand. This was done as it is the easiest approach to this task and does not require any additional steps.

Using different approaches to designing and improving the BT structure may be an interesting task for future work.

We will design the BT structure in the GUI application designed alongside our chosen BT library, Groot. The application interface is shown in figure 3.1.

3.2 Structure hierarchy

We will divide the whole tree structure into several sub-trees to help with readability, modularity, and maintainability.

The first sub-tree will help with initialization and will be responsible for determining whether the tree should be run. It is also responsible for navigating the robot to a suitable crossing place. This sub-tree will be called `Init-BT`.

3. Behavior tree algorithm structure

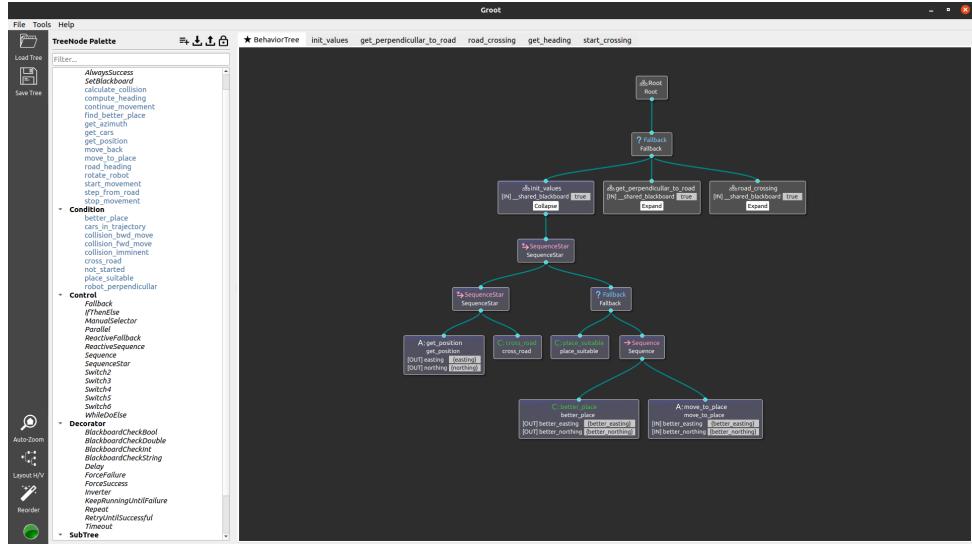


Figure 3.1: The Groot application interface.

The second sub-tree will be responsible for positioning the robot such that it is perpendicular to the road it is trying to cross. This sub-tree will be called **Perpendicular-BT**.

The third sub-tree will be responsible for the navigation of the robot during the crossing. It will check the positions and speed of incoming traffic and determine the best strategy for the crossing. This sub-tree will be called **Crossing-BT**.

There are a few more sub-trees in our structure, but those are not that important to write about here. They will be presented when they are mentioned in the main sub-trees structure. Their main task is to help with the modularity and reusability of the behavior they encode. The main BT is shown in figure 3.2.

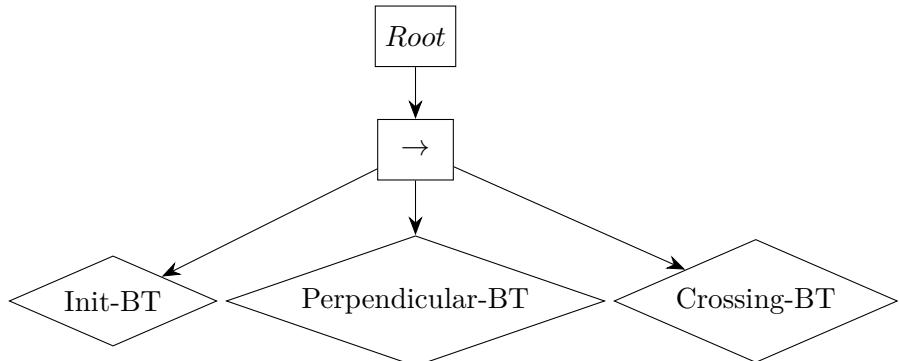


Figure 3.2: Main BT structure.

3.3 Init-BT

As mentioned earlier, this BT is responsible for determining if we should start the crossing and for navigating the robot to the optimal location. This tree will be executed only once for each crossing. We accomplish this with a `SequenceStar` node as the first node after `Root`. The `Init-BT` structure is shown in figure 3.3.

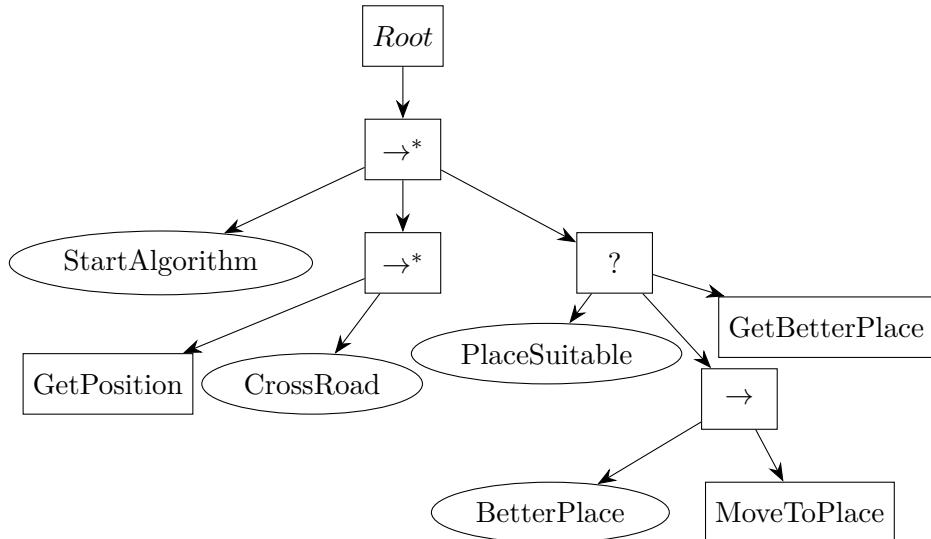


Figure 3.3: The Init-BT structure.

The flow for the algorithm is the following. First, we need to check if the algorithm should be even started – to avoid collision between two nodes trying to control the robot. This we achieve with a `StartAlgorithm` node. The next node after this one is `GetPosition` followed by a condition `CrossRoad`. They are connected in one `SequenceStar` control node. The whole point of this sub-structure is to determine the proximity of the robot to the road. If the robot is too far away from the road, the algorithm should not progress. This will help combat the possibility of trying to cross the wrong road, should it happen that two roads are close by.

The next major sub-structure is behind a `Fallback` node. The idea behind this one is to place the robot in an ideal position for crossing. This action should have been done before the mission, and the robot should have been sent to the optimal location by a path-planning node. However, if that was not performed, the `PlaceSuitable` condition node will check if the place is suitable. If not, the `BetterPlace` condition node will show if a better location was found. An action node `MoveToPlace` will steer the robot to a better location if it has been found. Lastly, the action node `GetBetterPlace` will try to find a better place. We will not perform the sub-tree again if a better place cannot be located. Instead, we will move on to the following sub-tree.

3.4 Perpendicular-BT

This sub-tree is responsible for positioning the robot for crossing in the most optimal way. We have determined that to be the one in which the robot will cross the road the fastest. As such, the position of the robot should be perpendicular to the road it is going to cross. Figure 3.4 shows the BT structure for achieving so.

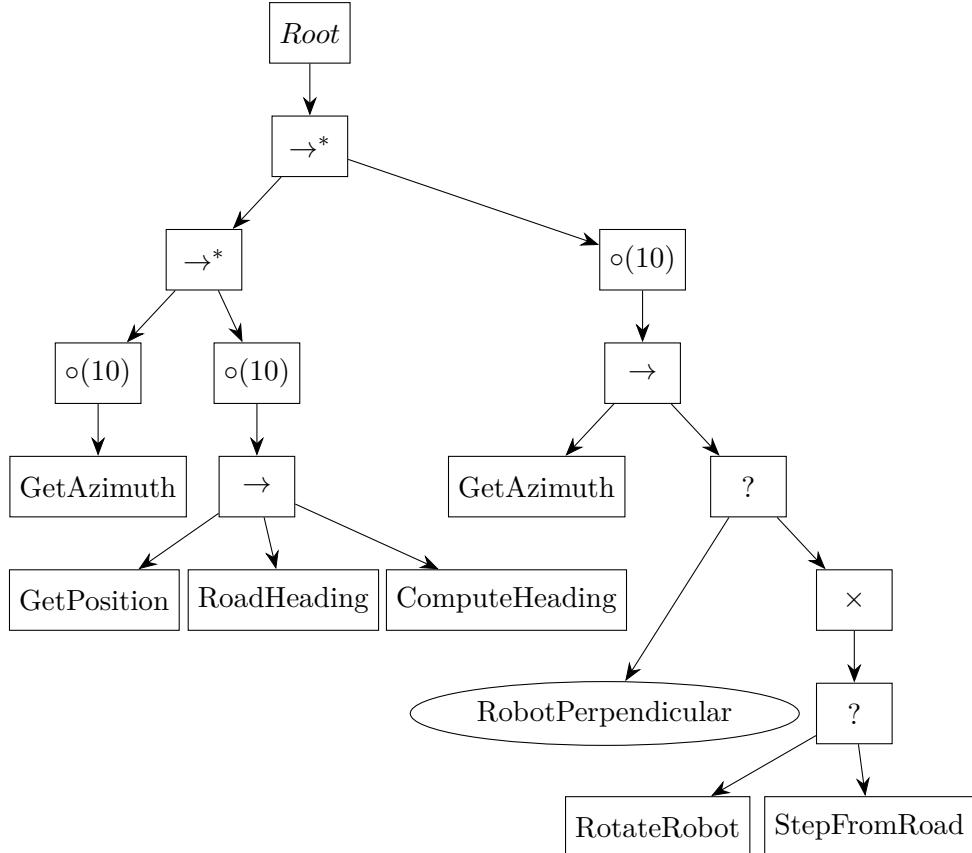


Figure 3.4: The Perpendicular-BT structure.

This tree is also only needed once in each run of the crossing algorithm therefore, we start with a **SequenceStar** node after **Root**.

The first significant sub-structures task is determining the azimuth for the robot to be perpendicular to the road. This also does not need to be repeated for a single road, so we start with a **SequenceStar** control node, next, we have a **Repeat** node. The action to be repeated is the obtaining of the robot's azimuth. The following steps are also behind a **Repeat** control node. This part of the algorithm calculates the azimuth the robot should have to be perpendicular. Firstly we need to obtain the robot's position – **GetPosition** action node. Next, we need to determine the road heading closest to the robot. For this purpose, we have the action node **RoadHeading**. Finally, we calculate the proper azimuth for the robot with the action node **ComputeHeading**. This

concludes the left branch of our Perpendicular-BT.

The right branch starts with a **Repeat** node, followed by a **Sequence** node. The idea behind this branch is to utilize the azimuth value computed in the left branch and orient the robot accordingly. Firstly we need to obtain the robot's azimuth with the **GetAzimuth** action node. While this might seem redundant, we have just got the azimuth for calculation, it is vital to update the current azimuth as the value of obtained azimuth is only valid in the first run of the second branch. After receiving the current azimuth, we follow with a **Fallback** node and its first child, a condition node **RobotPerpendicular**. This node tells us if the robot has achieved the optimal azimuth we calculated earlier. If it has not, we continue, thanks to the **Fallback** node to the last part of this sub-tree. We want this part to always return **FAILURE**. This is necessary because we check the correct position before the movement. The last part is responsible for the movement of the robot. Firstly we try to rotate the robot with **RotateRobot** action node. If the rotation was unsuccessful, we tried to move the robot away from the road with **StepFromRoad**. This is implemented as the robot rotation could have brought the robot onto the road, which is forbidden.

While we could unite the first two **Repeat** nodes, maybe even all three, we chose not to do so. The reason for not merging the nodes is to allow each algorithm part to fail independently. The number of repetitions for each node was set to 10, which we determined to be the optimal value.

Chapter 4

Nodes implementation

This chapter will provide the implementation details for individual nodes used in our BT algorithm. We will split these descriptions into BT nodes, and auxiliary functions used in the nodes.

4.1 Behavior tree nodes

Here we will present the methods used to implement the individual nodes of our BT algorithm. We will split the nodes into categories based on the sub-tree they belong to.

4.1.1 Introduction

The BT algorithm is implemented using the behaviortree-cpp-v3 library. Therefore, we will present how we create, implement and run the tree. We will also show how nodes are created, implemented, and used.

Creating the node

To create the node, we need to create a class that inherits from one of the parent classes in the library. The parent classes depend on the type of node we want to create. If we create an action node, we inherit from the `SyncActionNode` class. If we create a condition node, we will inherit from the `ConditionNode` class.

We must define two functions for all nodes, the `tick` and `providedPorts` functions.

The `tick` function is responsible for the actual implementation of the node. It is called every time the node is executed. It is also responsible for returning the state of the node.

The `providedPorts` function defines the ports the node will use. This function must be defined even if the node does not use any ports.

Using the node

To use the node, we first have to create a tree. We create a class `Road_cross_tree` with a `BehaviorTreeFactory` object. This object is used to create the tree. We also have a `Tree` object used to store and run the tree.

To use a node, we must register it in the `BehaviorTreeFactory` object. We do this by calling the `registerNodeType` function. For this function, we need to specify the class of the node we want to register, e.g., one of the nodes we created. It also takes one `std::string` parameter, which identifies the name of the node in our BT algorithm `.xml` file.

Creating and running the tree

To create the tree, we first must have a `.xml` file with the tree structure. This file is then parsed by the `BehaviorTreeFactory` object using the `createTreeFromFile` function. The result is a `Tree` object which we can then run.

To run the tree, we call the `tickRoot` function on the `Tree` object. This function returns the state of the root node of the tree.

Blackboard

The blackboard is a shared memory between the nodes of the tree. It is used to store data that is being used by multiple nodes.

It is also the reason why we implement the `providedPorts` function. This function specifies the ports the node will use. These ports can take a constant value (specified during the creation of the tree structure) or look for a value in the blackboard.

Logging

The BT library also provides us with logging functionality. This functionality is useful for debugging and testing.

We can use different types of loggers. The most common one is the `StdCoutLogger` which logs to the standard output. We can also use the `FileLogger`, which logs to a file.

We will use the `FileLogger` to log the tree execution. This logger is useful for its integration with the `Groot` application as we can import the produced file and visualize the tree execution.

The logging will be used only for debugging and testing purposes and serves no other function in the final product.

4.1.2 Init BT

Here we will present the nodes used in the Init sub-tree. This sub-tree is used to initialize the BT algorithm. It is the first sub-tree to be executed.

This tree is going to be executed only once per road to cross. We will achieve this by using the `SequenceStar` node as the root of this sub-tree.

StartAlgorithm – Condition node

This node is responsible for determining whether the robot is in the phase of crossing the road during its mission. It is necessary to implement such a node to facilitate the transfer of control from path planning to road-crossing. In contrast, we could determine if the crossing should start based on the distance of the robot from the road. This method would fail whenever our

robot needs to walk alongside any road.

This node is a ROS service updating a variable, which is checked when the node is ticked.

This service should be used mostly by other nodes outside of the package itself, with one notable exception. The exception being the very last node of the tree to prevent the tree from looping.

GetPosition – Action node

This node is responsible for obtaining the current GPS position of the robot and converting it to the UTM coordinate system. It is implemented as a ROS topic subscriber. The topic subscribed is `fix/` where the GPS data are being published.

The obtained data are then converted to UTM using the `gps_to_utm` function defined in 4.2.3. The result is then stored as two BT blackboard variables – `easting` and `northing`.

For each of the obtained values, it also calls a ROS service `place_suitability` to determine the suitability of the crossing place.

CrossRoad – Condition node

This node tells our algorithm if we are close enough to a road to take over the robot's controls. If we are not the path-planning or other node is left in control.

We use the return values of the ROS service call issued in the GetPosition node. This service has two return values – validity and suitability. Suitability uses the road cost as well as context score to judge the place for crossing. Validity only calculates the distance of the current location to road segments from OSM.

Therefore the validity variable is the one determining the output of this node. The distance limit we proposed as sufficient is 10m from the center of the road.

PlaceSuitable – Condition node

This node states whether the stored robot's location, as blackboard variable, is suitable for crossing.

It uses the second return value from the ROS service called from the GetPosition node. As stated, this value takes into account the road cost for our location from the road-cost algorithm (4.2.1) and the context score calculated separately before the service call.

The context score is based on the contextual information that is available to us. This information may be passed from other nodes (e.g., computer vision node for detecting road parameters) or set by the operator.

At the moment, for simplicity reasons, we are only considering that the robot would cross one road during the entirety of the mission. This limitation is only present in the contextual score, as other parts are designed to be used multiple times during the duration of the mission.

4.2 Auxiliary functions

In this section, we will present the auxiliary function used in the nodes of our BT algorithm.

These will include the functions used for conversions, more complex or repetitive mathematical operations, and other functions that are not directly related to the BT algorithm.

One of the big sections will be the algorithms used for determining the classification and cost of roads in the road network.

We will split the functions into categories based on their purpose.

4.2.1 Road cost algorithm

We will use the algorithm developed during the summer of 2022 for the RobInGas project at the CTU CRAS. The algorithm was designed to determine the cost of crossing the road based on the road classification, curvature, and other factors.

We will briefly present the functionality of the algorithm. The full description with implementation details can be found in [16].

This is also the only part of our thesis written in Python instead of C++ this is due to it being part of a different project. Other reasons include the usage of libraries for Python. While we could rewrite the code to C++ it was not deemed necessary as this part is run only once at the beginning of the mission and therefore does not need to be optimized for speed.

Overview

We use multiple parameters to determine the cost of crossing. The most important ones are the geometrical properties of the road. This includes the curvature of the road, the elevation profile, and the proximity to intersections. We also use the road classification to add to the cost function.

Other parameters would be beneficiary, such as the road width, the presence of a pedestrian crossing, and the expected traffic speed.

Unfortunately, we do not have access to all of these parameters. We use the OSM data, which does not necessarily contain all those additional parameters. Therefore, we will inject this information directly into the algorithm and deal with these parameters separately.

The OSM data also do not contain the elevation profile of the road. This data is also not easily obtainable from free or open-source sources. The elevation data we use were purchased from the Land Survey Office of the Czech Republic. We use the ZABAGED¹ data. This data from the Land Survey Office are available only for the area of the Czech Republic. However, any file with elevation data with the correct formatting can be used. The used file format is as follows. A text file with the easting, northing, and altitude of one point is on one line separated by a space. The lines are separated with

¹[https://geoportal.cuzk.cz/\(S\(dcpfei0nmxcwgoe4frurwfgm\)\)/Default.aspx?lng=EN&mode=TextMeta&text=dSady_zabaged&side=zabaged&menu=24](https://geoportal.cuzk.cz/(S(dcpfei0nmxcwgoe4frurwfgm))/Default.aspx?lng=EN&mode=TextMeta&text=dSady_zabaged&side=zabaged&menu=24)

a newline character \n, each describing exactly one point.

If the elevation data are not provided, the algorithm will still function. It will just not take the elevation profile into account. The road cost will be determined only from the curvate and road classification.

Algorithm

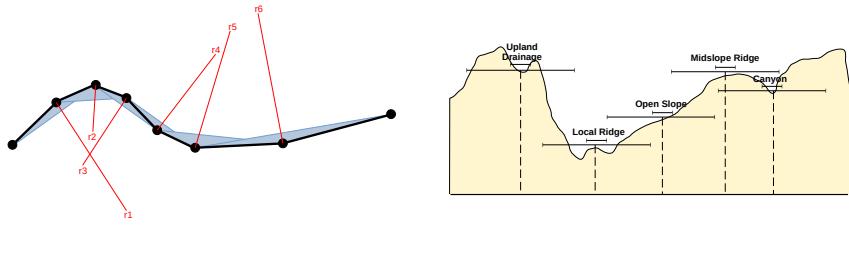
The algorithm is divided into several parts.

The first part is obtaining the road segments from downloaded OSM data. This part is also responsible for logging the road classification for each segment.

The second part is responsible for determining the curvature of the roads. This is done by calculating the radius of the circumcircle of the triangle formed by the two adjacent road segments. This approach is visualized in image 4.1a. We then sort the road segments into multiple classes based on their radius. In this part, we also detect road junctions and penalize the road segments close to the junction.

In the third part, we determine the elevation profile of the road. We then classify the individual road segments with the TPI (Terrain Profile Index) method. Some TPI classes are presented in image 4.1b.

In the last part, we combine the results from the previous parts and calculate the final cost of crossing for each segment.



(a) : Visualization of the circumcircle radii.

(b) : Representation of certain TPI classes.

Figure 4.1: Visualization of key elements in road cost algorithm.

Usage

As was stated earlier, this algorithm is executed only once at the beginning of the mission. Later we only keep the final costs, and based on them, we determine if the location where the robot is trying to cross is suitable and safe.

We rely on ROS to enable the communication between our main algorithm and the algorithm for determining the suitability of the location for crossing. We use the ROS service for this purpose.

Another part of the algorithm is to try and provide the robot with a more suitable place for crossing if the current location is unsuitable. If such a place is found and provided we will publish a cost map that will be used to change the current cost map of the path planner. This is done so that we do not

need to override the robot's controls until we begin the crossing itself.

■ 4.2.2 Mathematical functions

Difference between two angles

This function is used to determine the difference between two given angles. We assume the angles given are in radians, and both are in the interval $\langle 0; 2\pi \rangle$. This difference is calculated to be the smallest possible and to fit within the interval $\langle -\pi; \pi \rangle$. The formula we use is a modified version of the one provided here [17]. The formula is as follows

$$\Delta\varphi = ((\varphi_2 - \varphi_1 + \pi) \bmod (2\pi)) - \pi. \quad (4.1)$$

Before returning the result, we check whether the result is within the specified interval.

Converting degrees to radians

While this function is elementary in its nature, it is often used in our code. Therefore it is beneficiary to create this function.

The equation for converting degrees to radians which this function uses, is as follows

$$\varphi_{\text{RAD}} = \varphi_{\text{DEG}} \frac{\pi}{180}. \quad (4.2)$$

■ 4.2.3 Geographical functions

Here we will present the functions used for geographical calculations. These include conversions between coordinate systems, calculating azimuths, and others.

Converting GPS to UTM

While most geographical data are stored in the WGS84 coordinate system, the UTM coordinate system is more suitable for calculations. We, therefore, need to convert the GPS coordinates to UTM.

We use the GeographicLib library for this purpose. The function from this library that we use is `GeographicLib::UTMUPS::Forward`. This function takes the point's latitude and longitude and returns the point's easting and northing in the UTM coordinate system. It also returns the zone number and whether the point is in the northern or southern hemisphere.

While the input variables are passed by value, the return variables are passed to the function call by reference.

Converting NED to ENU

There are two possible orientations of an azimuth. The NED (North-East-Down) and the ENU (East-North-Up).

NED means that azimuth 0 points north, and its value increases clockwise. This orientation is mainly used in cartography and everyday life.

ENU means that azimuth 0 points east, and its value increases clockwise.

This orientation is mainly used in navigation and robotics, as it is consistent with REP-103.

In the entire project, we use the ENU orientation. However, as we rely on other ROS nodes to provide us with the azimuth, we need to be able to convert the azimuth from NED to ENU.

The conversion should be much simpler since we do not deal with coordinates but with already computed azimuths.

The image 4.2 shows the two possible orientations of the azimuth. This image also provides us with the insight we need to determine the conversion formula. We need to divide the formula into two parts.

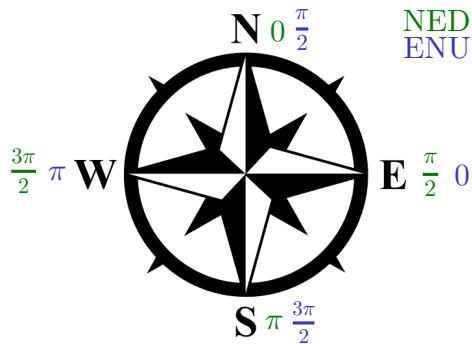


Figure 4.2: Two possible orientations of the azimuth.

The first option is when the azimuth (in NED) is between 0 and $\frac{\pi}{2}$ rad. In this case, the azimuth in ENU is computed in the following way

$$a_{\text{ENU}} = \frac{\pi}{2} - a_{\text{NED}}, \quad (4.3)$$

where a_{ENU} is the azimuth in ENU and a_{NED} is the azimuth in NED.

The second option is for all other azimuths, e.g., when the azimuth is between $\frac{\pi}{2}$ and 2π rad. In this case, the azimuth in ENU is computed in the following way

$$a_{\text{ENU}} = \frac{5\pi}{2} - a_{\text{NED}}. \quad (4.4)$$

Compute azimuth from coordinates

This function is used to compute the azimuth for an observer standing at the first point and looking at the second point.

We will use a slightly modified version of the formula provided here [18]. This calculation was created for the WGS84 coordinate system, however, we use the UTM coordinate system. Having said that, we can use the same formula, as the WGS84 to UTM projection is conformal[19].

Compute heading for robot

The use of this function is to determine the heading of the robot. It is used to get the robot perpendicular to the road.

4. Nodes implementation

The function takes the robot's heading and the road's azimuth. The road azimuth was obtained using the function stated above.

The algorithm creates two new variables, one $+\pi$ and one $-\pi$ from the road's azimuth. This is necessary as we do not know in what order are road points stored and we do not need to differentiate the side we approach the road from.

Then it computes the difference between the robot's heading and the two new azimuths. The smallest difference is then returned.

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4. Nodes implementation

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