



Hochschule  
Bonn-Rhein-Sieg  
University of Applied Sciences



R&D Project

# Qualitative Representation for Perception and Control of Mobile Platforms

*Mihir Patil*

Submitted to Hochschule Bonn-Rhein-Sieg,  
Department of Computer Science  
in partial fulfilment of the requirements for the degree  
of Master of Science in Autonomous Systems

Supervised by

Nico Huebel  
Santosh Thoduka  
Paul Ploger

January 2019



I, the undersigned below, declare that this work has not previously been submitted to this or any other university and that it is, unless otherwise stated, entirely my own work.

---

Date

---

Mihir Patil



# Abstract

Your abstract



# Acknowledgements

Thanks to ....





# Contents

<b>1</b>	<b>Introduction</b>	<b>1</b>
1.1	Motivation . . . . .	3
1.1.1	... . . . .	3
1.1.2	... . . . .	3
1.2	Challenges and Difficulties . . . . .	3
1.2.1	... . . . .	3
1.2.2	... . . . .	5
1.2.3	... . . . .	5
1.3	Problem Statement . . . . .	5
1.3.1	... . . . .	5
1.3.2	... . . . .	7
1.3.3	... . . . .	7
<b>2</b>	<b>State of the Art</b>	<b>9</b>
2.1	Forms of qualitative spatial representations . . . . .	10
2.1.1	Topological Representations . . . . .	10
2.1.2	Directional Representations . . . . .	10
2.1.3	Distance Representations . . . . .	11
2.1.4	Moving object Representations . . . . .	12
2.1.5	Conclusion: . . . . .	15
2.2	Analyzing qualitative calculi for navigation . . . . .	15
2.2.1	Qualitative Trajectory calculus . . . . .	15
2.2.2	Qualitative Rectilinear Projection calculus . . . . .	20
2.2.3	Qualitative Distance calculus . . . . .	23
2.3	Implementations of qualitative calculi for navigation . . . . .	23
2.3.1	Implementations . . . . .	24

2.4	....	24
2.5	Limitations of previous work	24
<b>3</b>	<b>Methodology</b>	<b>25</b>
3.1	Setup	25
3.2	Experimental Design	25
<b>4</b>	<b>Solution</b>	<b>27</b>
4.1	Proposed algorithm	27
4.2	Implementation details	27
<b>5</b>	<b>Evaluation</b>	<b>29</b>
<b>6</b>	<b>Results</b>	<b>31</b>
6.1	Use case 1	31
6.2	Use case 2	31
6.3	Use case 3	31
<b>7</b>	<b>Conclusions</b>	<b>33</b>
7.1	Contributions	33
7.2	Lessons learned	33
7.3	Future work	33
<b>Appendix A Design Details</b>		<b>35</b>
<b>Appendix B Parameters</b>		<b>37</b>
<b>References</b>		<b>39</b>

## List of Figures

2.1	The eight jointly exhaustive and pairwise disjoint relations of region connection calculus (RCC8). The arrows show which relation is the next relation a configuration would transit to, assuming the continuous movements or deformations $[?]$ , $[?]$ , $[?]$ . . . . .	10
2.2	The point based and projection based direction representations $[?]$	11
2.3	An representation of the combination of cone-shaped direction and absolute distance: very close(vc), close(cl), commensurate(cm), far(fr) and very far(vf), [4]. . . . .	12
2.4	Basic relations of basic Qualitative Trajectory Calculus (QTCB) in a conceptual neighborhood diagram. The solid dots represent the stationary objects and the open dots represent the moving objects $[?]$ , $[?]$ . . . . .	13
2.5	A graphical representation of the $QTC_C$ calculus for a relation between two moving objects 'k' and 'l', where $t_1$ and $t_2$ are the two distinctive time instances and RL refers to the reference line and the double crosses( $RL \perp 1$ , $RL \perp 2$ ) for the two objects [20] . . . .	18
2.6	Relative position of $O_i$ w.r.t the left-right dichotomy of $O_j$ for crossed projections [14]. . . . .	21
2.7	Some of the spatial configurations of the intersection point with respect to the front-back dichotomy of two objects for crossed projections $(CO_i^{FB})(CO_j^{FB})$ , [14]. . . . .	22
2.8	The point based and projection based direction representations $[?]$	22



## List of Tables

2.1	Key features of the more representative models(calculi) of qualitative representations of spatial or temporal domains in the existing literature [14]. . . . .	14
-----	--	----



# Introduction

Perception and control are two essential components of any successful robot navigation system. While perception deals with the spatial representations of the environment as perceived by the robot, control derives the required parameters necessary for navigation based on the perceived data. Traditionally such a task of navigation is achieved using quantitative approaches involving precise numerical information. Though useful such precise representations may not always be a prerequisite [?] [?].

Consider the case of a robot tasked with driving along a corridor towards the end without colliding with the walls. In such a scenario where precise perception and control are deemed surplus to requirements, the robot can be controlled using qualitative inputs in the context of an approximate map (spatial representations) [?]. The significant benefit of using a qualitative representation is that we no longer try to follow a pre-planned, precise trajectory. Therefore eliminating the need to constantly issue control commands. This implies that a qualitative approach would be more efficient [3] (in terms of CPU usage [?], battery usage etc.).

Furthermore, humans often communicate basic navigation tasks to each other using approximate spatial relationships to observable landmarks [?] [3], without requiring a precise map (for example, walk past the computers and take a left at the elevator) [?]. Hence by using qualitative representations we would be emulating

---

a similar communication pattern which in turn facilitates a better human robot interaction [? ].

- Qualitative representations(calculi) are useful in cases such as dynamic environments [? ], where precise metric maps or precise trajectories often/may fail due to the constant and often unprecedented changes to the environment [? ].
- Qualitative calculi can be used to make simple and intuitive inferences that can be used to achieve robust control(navigation) [7] [? ] of a mobile platform.



- Most robot navigation tasks are composed of two basic steps, namely precise perception to localize the mobile robot on a given map and the control the platform along the precisely generated trajectory. While this approach works successfully in a number of cases it is not necessarily efficient [?] especially in terms of the continuous monitoring of the path by issuing a prolix of control commands.
- High level robot programming should be carried out without having to refer to numeric data. Ideally, a robot programmer should describe the task to the robot in terms that they would use to describe it when doing it themselves (“task-level” programming). People do not naturally think of physical actions in terms of joint angles or numeric co-ordinates, so high level robot programming should be done in non-numeric terms [?].
- Qualitative calculi exhibit a step forward in the direction of generalizing 2-D space [?] for use in various robotic tasks such as navigation [?] [7] and control.

## 1.1 Motivation

### 1.1.1 ...

### 1.1.2 ...

## 1.2 Challenges and Difficulties

### 1.2.1 ...

Sed feugiat. Cum sociis natoque penatibus et magnis dis parturient montes, nascetur ridiculus mus. Ut pellentesque augue sed urna. Vestibulum diam eros, fringilla et, consectetur eu, nonummy id, sapien. Nullam at lectus. In sagittis ultrices mauris. Curabitur malesuada erat sit amet massa. Fusce blandit. Aliquam erat volutpat. Aliquam euismod. Aenean vel lectus. Nunc imperdiet justo nec dolor.

Etiam euismod. Fusce facilisis lacinia dui. Suspendisse potenti. In mi erat, cursus id, nonummy sed, ullamcorper eget, sapien. Praesent pretium, magna in eleifend egestas, pede pede pretium lorem, quis consetetur tortor sapien facilisis magna. Mauris quis magna varius nulla scelerisque imperdiet. Aliquam non quam. Aliquam porttitor quam a lacus. Praesent vel arcu ut tortor cursus volutpat. In vitae pede quis diam bibendum placerat. Fusce elementum convallis neque. Sed dolor orci, scelerisque ac, dapibus nec, ultricies ut, mi. Duis nec dui quis leo sagittis commodo.

Aliquam lectus. Vivamus leo. Quisque ornare tellus ullamcorper nulla. Mauris porttitor pharetra tortor. Sed fringilla justo sed mauris. Mauris tellus. Sed non leo. Nullam elementum, magna in cursus sodales, augue est scelerisque sapien, venenatis congue nulla arcu et pede. Ut suscipit enim vel sapien. Donec congue. Maecenas urna mi, suscipit in, placerat ut, vestibulum ut, massa. Fusce ultrices nulla et nisl.

Etiam ac leo a risus tristique nonummy. Donec dignissim tincidunt nulla. Vestibulum rhoncus molestie odio. Sed lobortis, justo et pretium lobortis, mauris turpis condimentum augue, nec ultricies nibh arcu pretium enim. Nunc purus neque, placerat id, imperdiet sed, pellentesque nec, nisl. Vestibulum imperdiet neque non sem accumsan laoreet. In hac habitasse platea dictumst. Etiam condimentum facilisis libero. Suspendisse in elit quis nisl aliquam dapibus. Pellentesque auctor sapien. Sed egestas sapien nec lectus. Pellentesque vel dui vel neque bibendum viverra. Aliquam porttitor nisl nec pede. Proin mattis libero vel turpis. Donec rutrum mauris et libero. Proin euismod porta felis. Nam lobortis, metus quis elementum commodo, nunc lectus elementum mauris, eget vulputate ligula tellus eu neque. Vivamus eu dolor.

Nulla in ipsum. Praesent eros nulla, congue vitae, euismod ut, commodo a, wisi. Pellentesque habitant morbi tristique senectus et netus et malesuada fames ac turpis egestas. Aenean nonummy magna non leo. Sed felis erat, ullamcorper in, dictum non, ultricies ut, lectus. Proin vel arcu a odio lobortis euismod. Vestibulum ante ipsum primis in faucibus orci luctus et ultrices posuere cubilia Curae; Proin ut est. Aliquam odio. Pellentesque massa turpis, cursus eu, euismod nec, tempor congue, nulla. Duis viverra gravida mauris. Cras tincidunt. Curabitur eros ligula, varius ut, pulvinar in, cursus faucibus, augue.

## 1.2.2 ...

## 1.2.3 ...

# 1.3 Problem Statement

## 1.3.1 ...

Etiam pede massa, dapibus vitae, rhoncus in, placerat posuere, odio. Vestibulum luctus commodo lacus. Morbi lacus dui, tempor sed, euismod eget, condimentum at, tortor. Phasellus aliquet odio ac lacus tempor faucibus. Praesent sed sem. Praesent iaculis. Cras rhoncus tellus sed justo ullamcorper sagittis. Donec quis orci. Sed ut tortor quis tellus euismod tincidunt. Suspendisse congue nisl eu elit. Aliquam tortor diam, tempus id, tristique eget, sodales vel, nulla. Praesent tellus mi, condimentum sed, viverra at, consectetur quis, lectus. In auctor vehicula orci. Sed pede sapien, euismod in, suscipit in, pharetra placerat, metus. Vivamus commodo dui non odio. Donec et felis.

Etiam suscipit aliquam arcu. Aliquam sit amet est ac purus bibendum congue. Sed in eros. Morbi non orci. Pellentesque mattis lacinia elit. Fusce molestie velit in ligula. Nullam et orci vitae nibh vulputate auctor. Aliquam eget purus. Nulla auctor wisi sed ipsum. Morbi porttitor tellus ac enim. Fusce ornare. Proin ipsum enim, tincidunt in, ornare venenatis, molestie a, augue. Donec vel pede in lacus sagittis porta. Sed hendrerit ipsum quis nisl. Suspendisse quis massa ac nibh pretium cursus. Sed sodales. Nam eu neque quis pede dignissim ornare. Maecenas eu purus ac urna tincidunt congue.

Donec et nisl id sapien blandit mattis. Aenean dictum odio sit amet risus. Morbi purus. Nulla a est sit amet purus venenatis iaculis. Vivamus viverra purus vel magna. Donec in justo sed odio malesuada dapibus. Nunc ultrices aliquam nunc. Vivamus facilisis pellentesque velit. Nulla nunc velit, vulputate dapibus, vulputate id, mattis ac, justo. Nam mattis elit dapibus purus. Quisque enim risus, congue non, elementum ut, mattis quis, sem. Quisque elit.

Maecenas non massa. Vestibulum pharetra nulla at lorem. Duis quis quam

id lacus dapibus interdum. Nulla lorem. Donec ut ante quis dolor bibendum condimentum. Etiam egestas tortor vitae lacus. Praesent cursus. Mauris bibendum pede at elit. Morbi et felis a lectus interdum facilisis. Sed suscipit gravida turpis. Nulla at lectus. Vestibulum ante ipsum primis in faucibus orci luctus et ultrices posuere cubilia Curae; Praesent nonummy luctus nibh. Proin turpis nunc, congue eu, egestas ut, fringilla at, tellus. In hac habitasse platea dictumst.

Vivamus eu tellus sed tellus consequat suscipit. Nam orci orci, malesuada id, gravida nec, ultricies vitae, erat. Donec risus turpis, luctus sit amet, interdum quis, porta sed, ipsum. Suspendisse condimentum, tortor at egestas posuere, neque metus tempor orci, et tincidunt urna nunc a purus. Sed facilisis blandit tellus. Nunc risus sem, suscipit nec, eleifend quis, cursus quis, libero. Curabitur et dolor. Sed vitae sem. Cum sociis natoque penatibus et magnis dis parturient montes, nascetur ridiculus mus. Maecenas ante. Duis ullamcorper enim. Donec tristique enim eu leo. Nullam molestie elit eu dolor. Nullam bibendum, turpis vitae tristique gravida, quam sapien tempor lectus, quis pretium tellus purus ac quam. Nulla facilisi.

Duis aliquet dui in est. Donec eget est. Nunc lectus odio, varius at, fermentum in, accumsan non, enim. Aliquam erat volutpat. Proin sit amet nulla ut eros consectetur cursus. Phasellus dapibus aliquam justo. Nunc laoreet. Donec consequat placerat magna. Duis pretium tincidunt justo. Sed sollicitudin vestibulum quam. Nam quis ligula. Vivamus at metus. Etiam imperdiet imperdiet pede. Aenean turpis. Fusce augue velit, scelerisque sollicitudin, dictum vitae, tempor et, pede. Donec wisi sapien, feugiat in, fermentum ut, sollicitudin adipiscing, metus.

Donec vel nibh ut felis consectetur laoreet. Donec pede. Sed id quam id wisi laoreet suscipit. Nulla lectus dolor, aliquam ac, fringilla eget, mollis ut, orci. In pellentesque justo in ligula. Maecenas turpis. Donec eleifend leo at felis tincidunt consequat. Aenean turpis metus, malesuada sed, condimentum sit amet, auctor a, wisi. Pellentesque sapien elit, bibendum ac, posuere et, congue eu, felis. Vestibulum mattis libero quis metus scelerisque ultrices. Sed purus.

Donec molestie, magna ut luctus ultrices, tellus arcu nonummy velit, sit amet pulvinar elit justo et mauris. In pede. Maecenas euismod elit eu erat. Aliquam augue wisi, facilisis congue, suscipit in, adipiscing et, ante. In justo. Cras lobortis neque ac ipsum. Nunc fermentum massa at ante. Donec orci tortor, egestas sit

amet, ultrices eget, venenatis eget, mi. Maecenas vehicula leo semper est. Mauris vel metus. Aliquam erat volutpat. In rhoncus sapien ac tellus. Pellentesque ligula.

Cras dapibus, augue quis scelerisque ultricies, felis dolor placerat sem, id porta velit odio eu elit. Aenean interdum nibh sed wisi. Praesent sollicitudin vulputate dui. Praesent iaculis viverra augue. Quisque in libero. Aenean gravida lorem vitae sem ullamcorper cursus. Nunc adipiscing rutrum ante. Nunc ipsum massa, faucibus sit amet, viverra vel, elementum semper, orci. Cras eros sem, vulputate et, tincidunt id, ultrices eget, magna. Nulla varius ornare odio. Donec accumsan mauris sit amet augue. Sed ligula lacus, laoreet non, aliquam sit amet, iaculis tempor, lorem. Suspendisse eros. Nam porta, leo sed congue tempor, felis est ultrices eros, id mattis velit felis non metus. Curabitur vitae elit non mauris varius pretium. Aenean lacus sem, tincidunt ut, consequat quis, porta vitae, turpis. Nullam laoreet fermentum urna. Proin iaculis lectus.

Sed mattis, erat sit amet gravida malesuada, elit augue egestas diam, tempus scelerisque nunc nisl vitae libero. Sed consequat feugiat massa. Nunc porta, eros in eleifend varius, erat leo rutrum dui, non convallis lectus orci ut nibh. Sed lorem massa, nonummy quis, egestas id, condimentum at, nisl. Maecenas at nibh. Aliquam et augue at nunc pellentesque ullamcorper. Duis nisl nibh, laoreet suscipit, convallis ut, rutrum id, enim. Phasellus odio. Nulla nulla elit, molestie non, scelerisque at, vestibulum eu, nulla. Ut odio nisl, facilisis id, mollis et, scelerisque nec, enim. Aenean sem leo, pellentesque sit amet, scelerisque sit amet, vehicula pellentesque, sapien.

### 1.3.2 ...

### 1.3.3 ...



## State of the Art

Over the years, research into qualitative spatial representations has led to the development of various models which can be used to represent the visually observable space. From a more scientific perspective these models are known as “Qualitative calculi”, the current state of the art calculi rely on a single spatial primitive such as distance, direction, topology etc., to describe a set of relationships amongst the observable objects. In general each calculi comes with its own set of benefits and drawbacks as each one of them has been tailored to exploit different aspects of space[? ].

For the case of robot navigation, current state of the art approaches utilize qualitative calculi that can provide both spatial and temporal information such as the QTC [?] or QRPC [? ]. There exist comprehensive surveys that provide detailed information about each of the existing qualitative calculi[? ], hence this state of the art aims to provide only a concise overview of the qualitative calculi that are advantageous to our application. We shall look into the relationships afforded by each of these calculi and their classification based on the domain of their utility.

## 2.1 Forms of qualitative spatial representations

### 2.1.1 Topological Representations

$\square$   $[?]$   $[?]$  : This is the most fundamental spatial representation, wherein the observed space is divided into distinctive regions based either on distinctive points in space or on separable objects found in the space. Topological representations draw heavily from the field of “Mereology” (the theory of parthood) to describe relations between the distinctive regions. Qualitative calculi such as RCC, Interval Algebra, n-intersections etc. belong to this category. Such representations deal with the “invariant properties that are under continuous deformations of objects, including translating, rotating and scaling”, and often include only spatial information while completely disregarding temporal data.

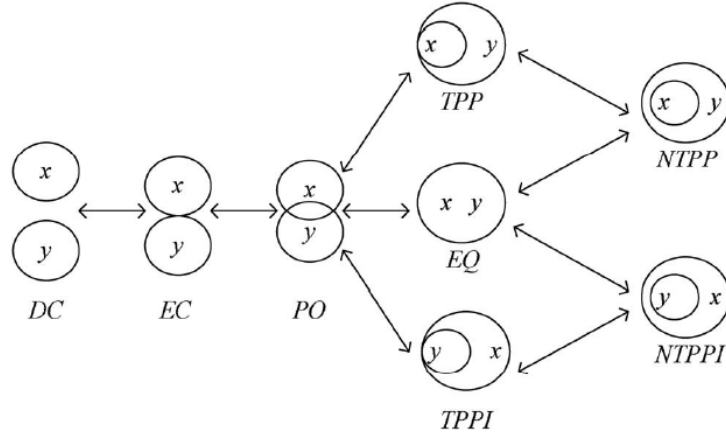


Figure 2.1: The eight jointly exhaustive and pairwise disjoint relations of region connection calculus (RCC8). The arrows show which relation is the next relation a configuration would transit to, assuming the continuous movements or deformations  $[?]$ ,  $[?]$ ,  $[?]$ .

### 2.1.2 Directional Representations

$[3]$  : The relative direction between two different objects can be represented using directional relations/representations. These representations rely on three



primary elements, a reference object, a reference frame and a target object to define a valid relation between two different objects. Directional representations are widely classified into two categories, point based and projection based with the discerning factor being the dimension of the objects involved and distinction of space using either cone shaped spatial sectors or by using vertical and horizontal lines to create smaller rectangular sectors. Furthermore, the directional calculus isn't restricted to using only cardinal directions, it also allows the use of nominal directional information such as left ,right etc to describe the directional relations. Qualitative calculi such as CDC, OPRA, CyCord etc utilize the directional representation. Being based of topological representations, directional representations also include only spatial information while disregarding temporal data.

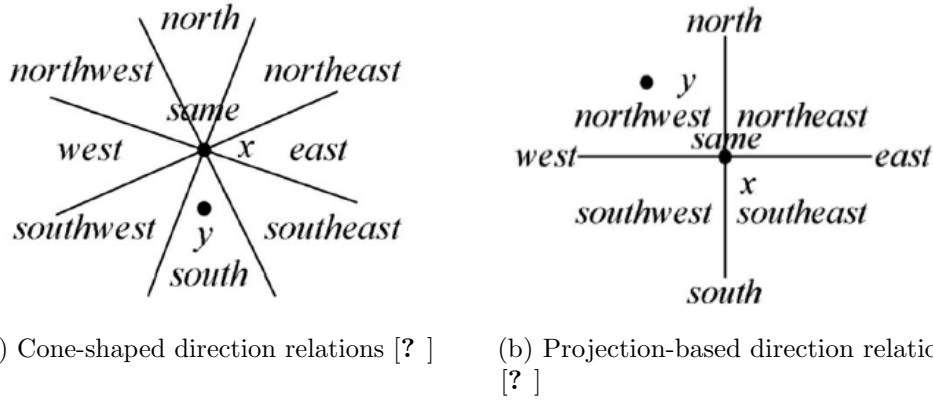


Figure 2.2: The point based and projection based direction representations [? ]

### 2.1.3 Distance Representations

[3] : The qualitative representation of spatial distance can be classified into two groups namely absolute and relative. This classification is made solely on the basis of the presence/absence of an extraneous referential object in the relation between two objects. This distinction can be clearly illustrated by the following example, 'the distance between A and B is 8 meters' or 'A is near B', this is a absolute approach as the distance is measured directly between two objects. Whereas saying that 'A is closer to B than that to C' classifies as a relative approaches as

this involves the comparison to a third object. Furthermore, it has been shown that absolute approaches can be qualitative or quantitative, but relative approaches are commonly qualitative [? ]. Qualitative calculi such as the ARGD(or Delta) and TPCC use the distance representations to describe the observable space. Distance based relations have found to be insufficient by themselves when it comes to the task of robot manipulation/navigation and hence are often used in combination with distance representations to yield a fairly suitable and complete representation of the environment [? ]. Like with the direction representations this calculi also lacks temporal data in the encoded relations and is hence unsuitable for applications involving moving objects.

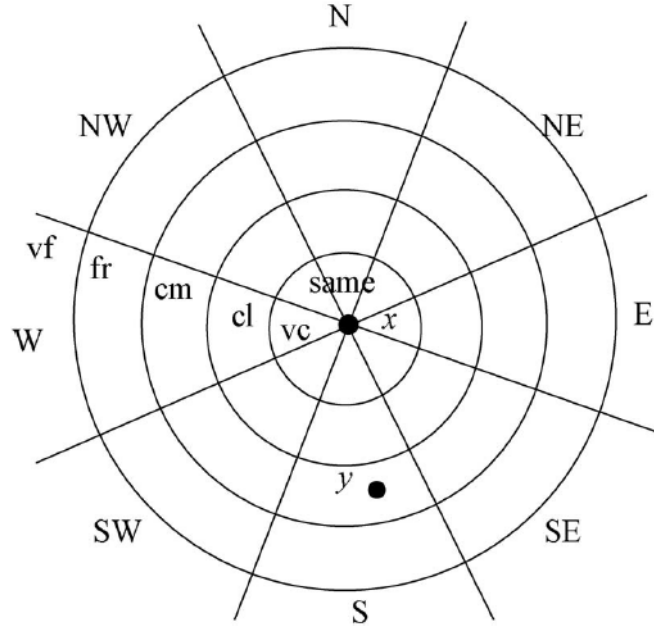


Figure 2.3: An representation of the combination of cone-shaped direction and absolute distance: very close(vc), close(cl), commensurate(cm), far(fr) and very far(vf), [4].

#### 2.1.4 Moving object Representations

[3] : Topological representations, directional representations and distance representations describe relations between stationary objects, this limitation encouraged

the development of a moving object representation which can qualitatively represent moving objects and their trajectories. These representations effectively deal with both spatial and temporal data to describe valid relations among mobile objects, while these relations include some directional information they mainly describe the relative motion between two objects and not relative direction. The relative motion between two objects is described using oriented line segments which are approximations of the trajectory of the objects in motion. QTC, QRPC are the two prominent calculi that utilize moving object representations. Moving object representations and the calculi using these representations have been proven to have solved the problem of representing moving objects but since these relations lack any distance information, they are still prone to failure and often need a complimentary distance calculi to ensure that a mobile object(robot) can successfully move around in the given environment without collisions.

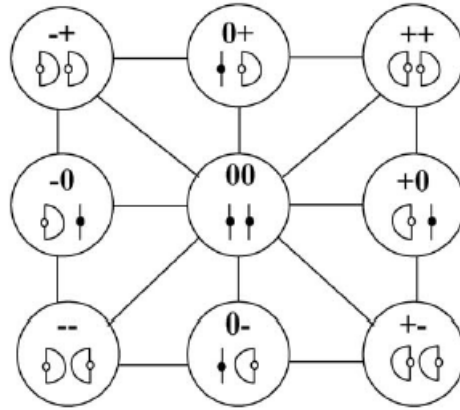


Figure 2.4: Basic relations of basic Qualitative Trajectory Calculus (QTCB) in a conceptual neighborhood diagram. The solid dots represent the stationary objects and the open dots represent the moving objects  $[?]$ ,  $[?]$ .

## 2.1. Forms of qualitative spatial representations

Domain	Model Name	Type of objects	Number and granularity of relationships	Description
Temporal	Interval Algebra [1]	Time Intervals	13 relationships, Binary relationships	It does not consider time instants.
	Extended Interval Algebra [12]	Time intervals and extreme points of the intervals	29 (13 IA(Interval algebra) + 16 extremes), binary	It extends IA(Interval Algebra) model by considering new relationships including the extremes of the interval and it introduces the notion of conceptual neighborhood.
Spatial	Region Connection Calculus [17]	Sets	8 or 5 relationships, Binary Relationships	It uses the geometric properties associated to the connection between two sets to establish relationships that are no longer linear but planar, and which are invariant to translation, rotation and scaling.
	Cardinal Reference System(CRS) [11]	Generic objects	9 (8 cardinals + 1 neutral) relations, Binary Relationships	It describes the position of any object by using a cardinal orientation as reference system and by adding also a neutral region
	FFC (Flip Flop Calculus) [15]	Points	8 (6 + 1 double + 1 triple), Ternary Relations	It is based on the possible positions of a point C with respect to a segment AB defined by other two points, A and B.
	SCC (Single Cross Calculus) [12]	Points	11 (8 + B=C+1 double + 1 triple), Ternary Relations	Describes the possible positions of a point C with respect to a segment AB and the orthogonal line to segment AB on B.
	DCC (Double Cross Calculus) [13]	Points	17 (15 regions + 1 double + 1 triple), Ternary Relations	Describes the possible positions of a point C with respect to a segment AB and two orthogonal lines to segment AB on A and B.
	Oriented point based Reasoning [16]	Oriented Points	4, Binary Relations	It is based on the relative orientation between pairs of oriented points in terms of two qualitative spatial dichotomies: the frontback and leftright.
	DRA (Dipole Relation Algebra) [8], [9]	Dipoles (or oriented segments)	24, Binary Relations	It is based on the relative position of oriented segments.
	OPRA (Oriented Point Relation Algebra) [10]	Oriented points	Depends on the granularity, Binary Relations	As DRA model, it is also based on the relative position two oriented points, but it supports different levels of granularity.
Spatio-temporal	QTC (Qualitative Trajectory Calculus) [19]	Points	81, Binary Relations	It describes the possible relations among two moving points in terms of the frontback and leftright dichotomies.
	QRPC (Qualitative Rectilinear Projection Calculus) [14]	Oriented points	Depends on the chosen granularity (up to 48), Ternary Relations	It establishes the possible relations of an object with respect to the trajectory of another object depending on the cross-point of the trajectories and the relative position among them

Table 2.1: Key features of the more representative models(calculi) of qualitative representations of spatial or temporal domains in the existing literature [14].

### 2.1.5 Conclusion:

From the above breakdown of the representations and the calculi, it is easy to summarize that distance representations and moving object representations are the most promising representations for our application in mobile robot navigation. Consequently the calculi associated with these representations will be the ones that are further scrutinized in the following section. The reasoning behind this conclusion is fairly simple moving object representations are basically spatio-temporal representations which take into account both the spatial and temporal data to create abstractions of the objects trajectory, this is crucial when dealing with mobile objects as this gives a more concrete representation of the objects in motion. In the case of distance representations although these representations deal only with spatial information, they provide explicit information on how close or far the objects under consideration are. Thus effectively capturing the possibility of a collision between the objects, this sort of information cannot be found in the direction and topological representations hence rendering them unfavorable for our application in mobile robot navigation [3], [5], [6], [7] and maybe [22].

## 2.2 Analyzing qualitative calculi for navigation

This section aims to provide a through understanding at a selective group of qualitative calculi based on the conclusions drawn from the previous section. Namely we shall look at the qualitative calculi such as the QTC, QRPC and ARGD which use moving object representations and distance representations and function in the spatio-temporal and spatial domains respectively.

### 2.2.1 Qualitative Trajectory calculus

[18], [21], [20] The QTC calculus was developed to solve the problem of inadequate representation of mobile objects in the spatio-temporal domain, which until then were represented only in the spatial domain using either the RCC or the n-intersections calculi. The major drawbacks of those calculi was their failure to deal with temporal data. Hence mobile objects were often abstracted as stationary

regions using either 'disconnected from' relation (DC) in RCC or 'disjoint' relation in the 9-intersection model, with the exception of a few limiting cases where the two objects meet, such as a collision between two mobile robots. Thus, the limiting factor of these formalisms was that all the DC relations were non-differentiable, due to the ignorance of information regarding relative motion between the two objects.

The QTC calculus constitutes of two major variants the  $QTC_B$  and the  $QTC_C$ , with the major difference between the two being the inclusion of the directional information in the relationships (between two objects) of the  $QTC_C$  calculus. Both versions of the QTC are adept at dealing with qualitative movement of objects in one, two and three dimensions. In the  $QTC_B$  calculus, as the euclidean distance between two objects is taken as the only constraining dimension. The abstraction of movement is depicted using three qualitative values:

- 0: the object is stable with respect to the other object.
- -: the object is moving towards the other object.
- +: the object is moving away from the other object.

The assigning of these qualitative values to an object's movement depends upon the relative position (constrained by distance) and relative speed of the two objects with respect to each other. This can be illustrated by the following example, consider two objects 'j' and 'k', the possible values for 'j' :

- based on relative position at a time 't' are:
  1. 0 (stable): if there is no change in the relative position with respect to 'k' (no change in relative distance ).
  2. - (moving towards): if there is a change in the relative position with respect to 'k', such that the relative distance between the objects decreases.
  3. + (moving away): if there is a change in the relative position with respect to 'k', such that the relative distance between the objects increases.
- based on relative speed at a time 't' are:

1. 0 (stable): if speed of 'j' is equal to the speed of 'k'.
2. - (moving towards): if speed of 'j' is lesser than the speed of 'k'.
3. + (moving away): if speed of 'j' is greater than the speed of 'k'.

Hence a valid  $QTC_B$  relation between qualitative trajectories of two objects is represented as such '-,+,-' (for object 1) and '+,-,+' (for object two). Wherein the value in the first position is the relative position of the object in consideration, the second value is the relative position of the other object and the third value is the relative speed of the current object with respect to the other object. The benefit of having a relation that includes both relative position and speed comes to light when dealing with the movement of objects in higher dimensions (2D, 3D) for instance in 2D, the value '0' (stable) may be interpreted as either the distance being stable or the speed being stable, this confusion during interpretation is avoided by using unique values for both the relative distance and speed and hence the size of the resulting relations is a set of three. Interpretation of these relations is pretty straight-forward when dealing with movements one dimension.

The  $QTC_C$  variation of the QTC calculus is often seen as an extension of the  $QTC_B$  calculus, since it uses the same qualitative values to represent the qualitative trajectories of the objects. The only difference between the two versions comes from the integration of directional information which denotes the direction of movement of the current object in relation to a line segment between the two objects. This version of the QTC calculus was inspired in part by the 'Double cross calculus' [23], hence the name. The  $QTC_C$  calculus is an improvement on the double cross calculus, as it can define qualitative trajectories and direction for single as well as multiple objects at once, whereas the double cross calculus can only deal with single objects at any given instance of time.

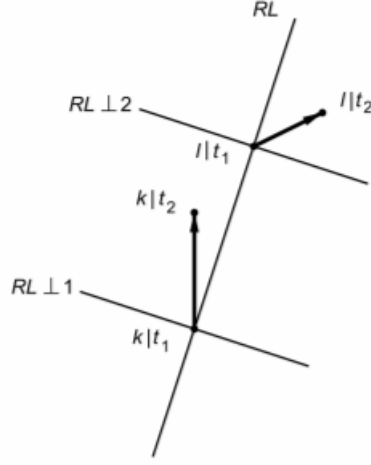


Figure 2.5: A graphical representation of the  $QTC_C$  calculus for a relation between two moving objects 'k' and 'l', where  $t_1$  and  $t_2$  are the two distinctive time instances and RL refers to the reference line and the double crosses ( $RL \perp 1$ ,  $RL \perp 2$ ) for the two objects [20] .

The relations of the  $QTC_C$  calculus, while following the same basic principles of the  $QTC_B$ , have been tweaked slightly to allow inferencing of the objects position in terms of the relative direction to the reference line. The assignment of the qualitative values to the object's movements can be illustrated using two objects 'k' and 'l', the possible values for 'l' at any given time interval are based on the following reasoning:

- based on movement relative to the respective perpendicular reference line:
  1. 0 (stable): if there is no change in the relative distance with respect to 'k' or with respect to the reference line.
  2. - (moving towards): if there is an increase in the relative distance between the objects.
  3. + (moving away): if there is an increase in the relative distance between the objects.
- based on movement relative to the directed perpendicular reference line(from 'l' to 'k'):



1. 0 (moving along the directed reference line): if the object moves along the line segment or if it was moving along the left/right and continues to do so in the given time interval.
2. - (moving to left side of the directed reference line): if the object moves from the right side of the line segment to the left side in the given time interval.
3. + (moving to right side of the directed reference line): if the object moves from the left side of the line segment to the right side in the given time interval.

Hence a valid  $QTC_C$  relation between qualitative trajectories of two objects is represented as such ‘-,+,-,0’(for object 1) and ‘+,-,-,0’(for object two). Wherein the value in the first position is the relative position of the object in consideration, the second value is the relative direction of its movement, the third value is the relative position of the other object and the fourth is it’s relative direction of movement.

**Conclusion** [18]In conclusion it is safe to say that the  $QTC_B$  calculi is more complete and robust in the sense that it can qualitatively and correctly represent all possible trajectories of the mobile object at a given instance of time, although due to it being developed to deal with mobile objects when they are in DC regions [21] it still cannot make a very robust or accurate relation regarding collision conditions, it provides a safer alternative to the  $QTC_C$  calculus as this calculus is still regarded as a work in progress [20]due to it’s inability to distinguish between the trajectories of a mobile object moving along the directed reference line and continuing to do so and a mobile object moving on either side of the directed reference line and continuing to do so. Thus this justifies the selection of  $QTC_B$  for our implementation, not only is it safer and simpler but it also allows easier integration with other complimentary calculi such as ARGD, RCC which may be used to deal with possible collision cases.

### 2.2.2 Qualitative Rectilinear Projection calculus

[14], [2] The qualitative rectilinear projection calculus(QRPC) presents a innovative approach to qualitatively representing motion patterns based on planar trajectories. In comparison to the QTC calculus, this representation has a richer description of the motion exhibited by mobile objects. The basis of this claim lies in the oriented rectilinear projection used to represent the trajectories, which allows this calculus to represent rotational motions of an mobile object, something that was not possible in the existing calculi such as the QTC. The QRPC is specifically tailored towards obstacle avoidance and geometric relationships between two objects are generated using the front-back and the left-right dichotomies. The relationships encompassed in the QRPC abstract the objects as points and use their rectilinear projections to make qualitative distinctions such as front-back and left-right, these atomic relations and their base notations are illustrated below:

#### 1. Notations:

- $P_i P_j$ : is the relative disposition between the oriented rectilinear projection of the object  $O_i$  and the oriented rectilinear projection of  $O_j$ .
- $O_i O_j^{LR}$ : The relative position of  $O_i$  with respect to the left-right dichotomy of  $O_j$ .
- $(CO_i^{FB})(CO_j^{FB})$ : The relative position of the point of intersection('C') of the oriented rectilinear projections with respect to the frontback dichotomy of both objects.
- $O_i O_j^{FB}$ : The relative position of  $O_i$  with respect to the front-back dichotomy of  $O_j$  when the trajectories are superimposed.

Note: 'i' and 'j' denote the two different objects.

#### 2. Qualitative (atomic)relations in each of the notations :

- The relative disposition between two oriented rectilinear projections( $P_i P_j$ ):
  - $\uparrow\uparrow$  : Parellel in same direction
  - $\uparrow\downarrow$  : Parellel in opposite direction

- $\uparrow$  : Coincident in same direction
- $\updownarrow$  : Coincident in opposite direction
- $X$  : Crossed/Intersecting rectilinear projections
- The relative position of  $O_i$  with respect to the left-right dichotomy of  $O_j$ ,  $(O_i O_j^{LR})$ :
  - ‘-’ : if  $O_i$  is on the left of  $P_j$ .
  - ‘0’ : if  $O_i$  is over  $P_j$ .
  - ‘+’ : if  $O_i$  is on the right of  $P_j$ .

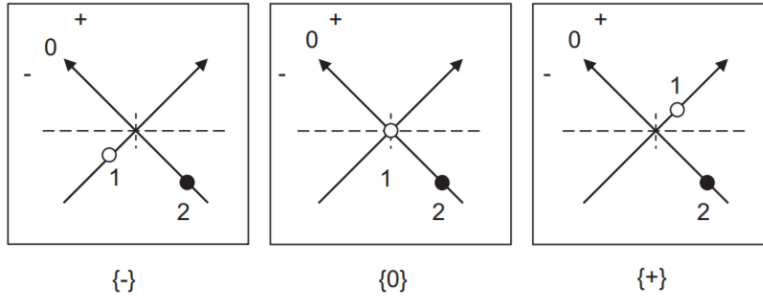


Figure 2.6: Relative position of  $O_i$  w.r.t the left-right dichotomy of  $O_j$  for crossed projections [14].

- The relative position of ‘C’ with respect to the front-back dichotomy of two objects  $(CO_i^{FB})(CO_j^{FB})$ :
  - $(+, +)$  : if ‘C’ is in front of  $O_i$  and  $O_j$ .
  - $(0, +)$  : if ‘C’ is at same position as  $O_i$  and in front of  $O_j$ .
  - $(+, -)$  : if ‘C’ is in front of  $O_i$  and behind  $O_j$ .
  - $(0, -)$  : if ‘C’ is at same position as  $O_i$  and behind  $O_j$ .
  - $(-, +)$  : if ‘C’ is behind  $O_i$  and in front of  $O_j$ .
  - $(-, 0)$  : if ‘C’ is behind  $O_i$  and in same position as  $O_j$ .
  - $(-, -)$  : if ‘C’ is behind  $O_i$  and  $O_j$ .
  - $(+, 0)$  : if ‘C’ is in front of  $O_i$  and at the same position as  $O_j$ .

In cases where the two projections do not intersect with each other ( $\uparrow\uparrow$  or  $\updownarrow$ ), this qualitative abstraction presents as conundrum

as the point of intersection ‘C’ may lie at either positive or negative infinity, hence in such cases the relation is abstracted to either  $(+, +)$  or  $(-, -)$ .

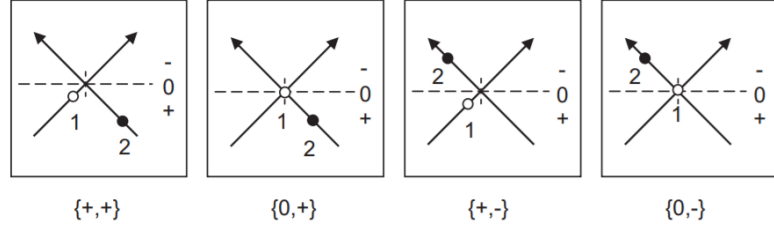
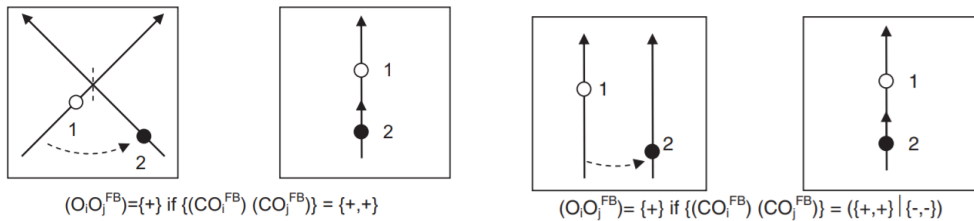


Figure 2.7: Some of the spatial configurations of the intersection point with respect to the front-back dichotomy of two objects for crossed projections  $(CO_i^{FB})(CO_j^{FB})$ , [14].

- The relative position of  $O_i$  with respect to the front-back dichotomy of  $O_j$  when the trajectories are superimposed( $O_i O_j^{FB}$ ):
  - ‘+’ : if  $O_i$  is in front of  $O_j$  after  $P_i$  is superimposed on  $P_j$ .
  - ‘0’ : if  $O_i$  is at the same position as  $O_j$  after  $P_i$  is superimposed on  $P_j$ .
  - ‘-’ : if  $O_i$  is behind  $O_j$  after  $P_i$  is superimposed on  $P_j$ .

Note: The after the rectilinear projection of  $O_i$  is rotated (such that the objects are always facing in opposing directions) along ‘C’ if it exists, before being superimposed on the rectilinear projection of  $O_j$ .



(a) The  $(O_i O_j^{FB})$  feature for crossed projections. [14]

(b) The  $(O_i O_j^{FB})$  feature for parallel projections. [14]

Figure 2.8: The point based and projection based direction representations [? ]

**Conclusion** Hence a complete valid QRPC relation comprising of the above mentioned atomic relations can be written as  $[(P_i P_j)(O_i O_j^{LR})((CO_i^{FB})(CO_j^{FB}))(O_i O_j^{FB})]$ , with the various values replacing their respective placeholders. Thus proving to be a richer representation of the movements of the mobile objects as it can effectively distinguish between front-back, left-right as well as same or opposing direction of heading. While this calculus does present a compact view of the movements of the objects, like it's predecessors it still requires a sequence of qualitative(QRPC) states(individual sets of relations) to effectively represent the movement of an object, besides a completely theoretical formulation of the calculi without the backing of suitable empirical data or implementation makes it hard to believe that this calculi would function reliably in a real time mobile robot scenario. These drawbacks dissuade us from further pursuing this calculi for our purpose of achieving qualitative perception and control in mobile robots.

### 2.2.3 Qualitative Distance calculus

[4]

## 2.3 Implementations of qualitative calculi for navigation

- [?] , utilizes a teach-relay approach to navigate through indoor and outdoor environments. A sparse optical flow technique is used to extract features in the teach phase and feature matching is done in the replay phase to successfully navigate a given path. The approach uses a qualitative control strategy where motion primitives are obtained by using a voting mechanism in collaboration with the observed features.
- [?] ,develops a qualitative control algorithm that is able to navigate through both indoor and outdoor environments by using a concept called funnel lane, where the feature coordinates are used to determine turning directions in the replay phase. The algorithm couples odometry information with the funnel lane approach to achieve robust navigation.

### 2.3.1 Implementations

Examples of implementation of navigation using qualitative control

- [? ] The research presented in this approach uses optical flow vectors in combination with a confidence measure to control the linear and angular speeds of the robot. Image segmentation is used to split the scene into different objects and a estimation of time of collision for each object is used as a confidence measure for the control commands.
- [? ] This approach uses a single monocular gray-scale camera to navigate. The algorithm uses a combination of visual homing and corridor ceiling lights to perform straight-line navigation in an unknown corridor. Although this approach works with both textured and untextured environments it uses a kalman filter(quantitative approach) to achieve localization.

m

## 2.4 ....

Use as many sections as you need in your related work to group content into logical groups

## 2.5 Limitations of previous work

# 3

## Methodology

How you are planning to test/compare/evaluate your research. Criteria used.

### **3.1 Setup**

### **3.2 Experimental Design**





## Solution

Your main contributions go here

### **4.1 Proposed algorithm**

### **4.2 Implementation details**



# 5

## Evaluation

Implementation and measurements.

---

# 6

## Results

### 6.1 Use case 1

Describe results and analyse them

### 6.2 Use case 2

### 6.3 Use case 3



## Conclusions

### 7.1 Contributions

### 7.2 Lessons learned

### 7.3 Future work





A

## Design Details

Your first appendix

---

# B

## Parameters

Your second chapter appendix

---

## References

- [1] James F Allen. Maintaining knowledge about temporal intervals. In *Readings in qualitative reasoning about physical systems*, pages 361–372. Elsevier, 1990.
- [2] JV Álvarez-Bravo, JC Peris-Broch, JJ Álvarez-Sánchez, and MT Escrig-Monferrer. A guide for blind people using a quantitative+ qualitative spatial representation. In *Proceedings of the first international congress on domotics, robotics and remote-assistance for all*, pages 495–505, 2006.
- [3] Juan Chen, Anthony G Cohn, Dayou Liu, Shengsheng Wang, Jihong Ouyang, and Qiangyuan Yu. A survey of qualitative spatial representations. *The Knowledge Engineering Review*, 30(1):106–136, 2015.
- [4] Eliseo Clementini, Paolino Di Felice, and Daniel Hernandez. Qualitative representation of positional information. *Artificial intelligence*, 95(2):317–356, 1997.
- [5] Anthony G Cohn. Qualitative spatial representation and reasoning techniques. In *Annual Conference on Artificial Intelligence*, pages 1–30. Springer, 1997.
- [6] Anthony G. Cohn and Shyamanta M. Hazarika. Qualitative spatial representation and reasoning: An overview. *Fundamenta informaticae*, 46(1-2):1–29, 2001.
- [7] Anthony G Cohn and Jochen Renz. Qualitative spatial representation and reasoning. *Foundations of Artificial Intelligence*, 3:551–596, 2008.
- [8] Frank Dylla and Reinhard Moratz. Empirical complexity issues of practical qualitative spatial reasoning about relative position. In *Workshop on Spatial and Temporal Reasoning at ECAI*, volume 2004, 2004.

- 
- [9] Frank Dylla and Reinhard Moratz. Exploiting qualitative spatial neighborhoods in the situation calculus. In *International Conference on Spatial Cognition*, pages 304–322. Springer, 2004.
  - [10] Frank Dylla and Jan Oliver Wallgrün. On generalizing orientation information in opra. In *Annual Conference on Artificial Intelligence*, pages 274–288. Springer, 2006.
  - [11] Andrew U Frank. Qualitative spatial reasoning about distances and directions in geographic space. *Journal of Visual Languages & Computing*, 3(4):343–371, 1992.
  - [12] Christian Freksa. Temporal reasoning based on semi-intervals. *Artificial intelligence*, 54(1):199–227, 1992.
  - [13] Christian Freksa and Kai Zimmermann. On the utilization of spatial structures for cognitively plausible and efficient reasoning. In *Systems, Man and Cybernetics, 1992., IEEE International Conference on*, pages 261–266. IEEE, 1992.
  - [14] Francisco J Glez-Cabrera, Jose Vicente Alvarez-Bravo, and Fernando DiAz. Qrpc: A new qualitative model for representing motion patterns. *Expert systems with applications*, 40(11):4547–4561, 2013.
  - [15] G É LIGOZAT. Reasoning about cardinal directions. *Journal of Visual Languages & Computing*, 9(1):23–44, 1998.
  - [16] Reinhard Moratz. Representing relative direction as a binary relation of oriented points. In *ECAI*, volume 6, pages 407–411, 2006.
  - [17] David A Randell, Zhan Cui, and Anthony G Cohn. A spatial logic based on regions and connection. *KR*, 92:165–176, 1992.
  - [18] Nico Van de Weghe. *Representing and reasoning about moving objects: A qualitative approach*. PhD thesis, Ghent University, 2004.

- [19] Nico Van de Weghe, Anthony G Cohn, Philippe De Maeyer, and Frank Witlox. Representing moving objects in computer-based expert systems: the overtake event example. *Expert Systems with Applications*, 29(4):977–983, 2005.
- [20] Nico Van de Weghe, Bart Kuijpers, Peter Bogaert, and Philippe De Maeyer. A qualitative trajectory calculus and the composition of its relations. In *International Conference on GeoSpatial Semantics*, pages 60–76. Springer, 2005.
- [21] Nico Van de Weghe, Anthony Cohn, Guy De Tre, and Philippe De Maeyer. A qualitative trajectory calculus as a basis for representing moving objects in geographical information systems. *Control and Cybernetics*, 35(1):97–119, 2006.
- [22] Lv Yan, Peng Wang, and Zonghai Chen. Qualitative representation and reasoning in cognitive maps : A survey from spatial cognition perspective. 2012.
- [23] Kai Zimmermann and Christian Freksa. Qualitative spatial reasoning using orientation, distance, and path knowledge. *Applied intelligence*, 6(1):49–58, 1996.