CS

COC251

B419265

An automatic control system For a house using an Al planner

by

Oliver Marshall

Supervisor: Dr Qinggang Meng

Department of Computer Science Loughborough University

May/June 2018

Abstract

In this document I describe and implement the core of a home automation system which uses a Hierarchical Task Network planner to plan actions that the automation system should take. The core accepts as input a set of user defined 'domain extension' files as well as a 'problem' file that are combined together to form a more complete understanding of the context of the problem. Allowing third parties to define the domain extensions enables the easy extension of the home automation system to work with new devices.

This document starts by introducing the problem to be explored in the rest of the document, this is followed by a literature review investigating the current approaches to home automation and automated planning. It then details the design, implementation and testing of the core of a home automation system. Finally it concludes by discussing the achievements of the system as well as additions to the system to improve the design.

${\bf Acknowledgments}$
I would like to acknowledge the help and encouragement offered by me project supervisor, Dr Qinggang Meng. His help pushed me to create a better solution that I could have otherwise.

Contents

1	Introduction 4
1 2	Literature Review 5 2.1 Internet of Things 5 2.2 Home Automation 5 2.3 Automated Planning 5 2.4 Classical planning 5 2.5 Domain specific 5 2.6 Domain independent 6 2.7 Domain configurable 6 2.8 Comparison 6
	2.9 Conclusion
3	Design 7 3.1 Devices 7 3.1.1 Devices Support My System 7 3.1.2 My System 'Scans' For Devices 7 3.1.3 Third Parties Add Support For Devices 8 3.2 Rules 8 3.3 Identifying of Groups of Users 9 3.3.1 The End Users 9 3.3.2 The Managers 9 3.3.3 The Developers 9 3.4 Core Design 9 3.5 Plan Execution 10 3.6 Flaws 11
4	Implementation 13 4.1 Selecting an External Planner 13 4.2 Parsing and Encoding 13 4.2.1 Parser 13 4.2.2 Pre-compiler 14 4.2.3 Encoder 14 4.3 Wrapping JSHOP2 14 4.3.1 Calling JSHOP2 14 4.3.2 Recompiling the Problem File 14 4.3.3 Parsing JSHOP2's Output 15
5	System Testing 16 5.1 Parser - 320 assertions 16 5.2 Pre-compiler - 147 assertions 16 5.3 Encoder - 37 assertions 16 5.4 End to End test 16
6	Conclusion 18

Appen	dix A Tools Used	19
A.1	JSHOP2	19
A.2	Clojure	19
A.3	Leiningen	19
A.4	Clojure Spec	19
A.5	Clojure Shell	19
Appen	dix B Conceptual Model for Planning	20
B.1	Conceptual Model for Planning	20
B.2	State-Transition Systems	20
B.3	Planners	21
B.4	Controllers	22
B.5	Assumptions in Classical Planning	22
Appen	dix C Simple Home Example	24
C.1	Problem File - p.prob	24
C.2	User Defined rules - user-rules.dext	24
	Time Middleware - time.dext	
C.4	Device Driver - light1.dext	25

List of Figures

3.1	The flow of data structures through the core of the design	10
4.1	An example of a simple domain and problem being solved using the core and external planner	15
5.1	An example run of a simple example (a) with the hour set to 12 and (b) with the hour set to 5	17
B.1	Simple Conceptual Models for (a) Offline Planning, (b) Online Planning, and (c) Planning with a Separate Scheduler	21
B.2	A State-Transition System for a Simple Domain Involving a Crane and a Robot for Transporting Containers	22

Introduction

In 2010 it was estimated that nearly 12.5 billion devices were connected to the internet, and it was predicted that by 2020 that number could increase to 50 billion devices (Evans 2011). As the number of internet enabled devices grows it becomes increasingly likely that these devices will end up in the average home. This increase in the number of devices and number of interactions a user will likely have with these devices produces two main problems: how to effectively manage the devices; and how to allow multiple devices to interact. These problems can be solved by introducing 'control software' which allows the user to configure how they want the devices in the system to interact with each other as well as to solve problems and follow any rules they give it.

The most commonly used of such software is software provided by the manufacturer, that way the user has some guarantee that the software will work with the devices they own. An issue with this is that the manufacturer has different goals to the user which can lead to problems such as old devices ceasing to work on newer software, and devices from other manufacturers not working with the software at all. Another issue with most device control software is that it is difficult or impossible to extend to add new or custom devices with unique behaviors that can interact with the rest of the system fully.

A solution to this problem could be to have a core system that can be extended by software written by third parties. This could allow users to develop their own solutions to devices not working in their system and share their solutions with other users.

In this document I will show my research into the extent to which current control software supports extension and investigate the current approaches to automated planning and how this can help with enabling the extension of home automation software. I will then design and implement a solution that can demonstrate how effectiveness automated planning is as a solution to this problem.

Literature Review

2.1 Internet of Things

"The Internet of things is the network of physical devices, vehicles, home appliances and other items embedded with electronics, software, sensors, actuators, and network connectivity which enables these objects to connect and exchange data (Contributors 2018)". This year it is estimated that there are over 20 billion IoT devices connected to the internet (Statista 2015) with predictions that there will be up to 50 billion devices in 2020 (Evans 2011). With this increasing number of devices inevitably a large portion of these devices end up in home environments. For these devices to produce a useful output there needs to be some intelligence managing and controlling them. This could be the user manually controlling the devices, the devices communicating with and controlling the other devices in the network or via a central intelligent controller. The latter is what I will be focusing on.

2.2 Home Automation

In the review of home automation systems done by Lobaccaro et al. (2016), it can be observed that most of the systems reviewed are either closed source systems or do not support a large range of devices. Extensibility is an important feature of home automation as users won't always want to be locked into using a specific set of devices when they choose a controller for their home automation system. An avenue that hasn't been considered is using automated planning to control the devices, by using a domain-independent or domain configurable device new actions could be added by the devices as they enter the system, or the controller could detect new devices and add actions accordingly.

2.3 Automated Planning

The Handbook of Knowledge Representation defines automated planning as "the deliberation process that chooses and organizes actions by anticipating their expected effects" (Cimatti et al. 2008).

2.4 Classical planning

Classical planning is an active area of research concerning planning, but the key point of this area is that it constrains the planners by making a series of assumptions that limit the types of problems that can be solved by the planners. These assumptions mainly concern things that usually affect real-world systems such as implicit time taken or sequential plans. Because of this, most problems that are likely to be faced when using planning in the real-world are unable to be solved by a purely classical planner. And as classical planning is the main focus for much of the research done in planning these assumptions have effects on other planners developed outside of classical planning.

2.5 Domain specific

This area of planning relies on encoding domain information into the planner itself, allowing the planner to make efficient plans to solve problems in this domain. The downside of this type of planner is that it

is locked into the domain of problems it attempts to solve, and cannot be used in other domains without major work being done on it.

2.6 Domain independent

This is the type of planner that has been the focus of the most research as classical planning comes under this topic. This style of planning focuses on making the planning algorithm able to solve problems from different domains, they do this by having the actions available be part of the input to the planner. By doing this they are more flexible than domain-specific planners as they can solve problems for many different domains instead of just one, but because the domain-specific planner can encode information about the domain, domain independent planners tend to have worse performance.

2.7 Domain configurable

A middle ground between domain-specific and independent planners is domain configurable planners, these can solve a wide range of problems well and quickly as shown in the International Planning Competition in 2000 and 2002, and they do this without having to program a new core. They do this by allowing domain information to be encoded in the problem definition allowing the planners to decrease the search space and thus decrease search time and enabling them to produce better plans. There are two main types of configurable planning: hierarchical task network (HTN) planner, which plans by decomposing tasks into subtasks continually until only primitive tasks remain; and control-rule planners which define a set of rules for invalid states allowing the planner to backtrack until a new valid path is found. Benefits of these planners include: having a mobile core like domain-independent planners which reduces the amount of work needing to be done to introduce a new problem to the planner; by having knowledge about the domain, the planner can produce better plans faster.

2.8 Comparison

Nau (2007) compares these different types of planners using three different comparisons: upfront effort, performance and coverage. In his comparison he found that configurable planners performed well compared to the other planners, having lower upfront costs than domain-specific planners but higher than domain independent, but by they also performed better than domain-independent planners although worse than domain-specific planners although he did note that "a sufficiently capable domain-configurable planner should have nearly the same level of performance because it should be possible to encode the same domain-specific problem-solving techniques into the domain description". In the author's research into the International Planning Competition, he found that domain configurable planners end up having better coverage than the other types, the author contributes this "partly to efficiency and partly to expressive power". From this comparison, configurable planners seem to be the best choice, especially if you are going to be solving different problems like in home automation.

2.9 Conclusion

The area of home automation is already large and will be growing every year, because of this it is important that the control systems we develop are easily extensible and smart enough to solve the increasing demands of the system's users. Domain configurable planning seems to be a good way of solving this configurability problem as it can solve problems from many different domains while still remaining performant. Planning's applicability to this domain has not been explored before, this might present some problems, but these should have been explored when applying planning to other domains, so they should be easy to overcome. Something I have not seen any research on is the effectiveness of extending a domain via plugins provided by multiple parties, this is something I plan to base a large part of my project on.

Design

Home automation software brings together two things: devices, and user defined rules. They do this to provide a service to control and manage the devices according to the user defined rules.

3.1 Devices

Devices can be either a physical product for example a smart light or another piece of software for example an email client. Both physical and software devices need to have some way to be controlled by the home automation software, for this it is obviously necessary that either: the devices themselves send a message to the home automation software to tell it their capabilities; the automation software 'scans' for devices somehow; or a third party system sends a message instead that does the same.

3.1.1 Devices Support My System

One advantage of this type of design is that my system can be 'device agnostic' which means that if a manufacturer decides to add a new feature to a device or come out with an entirely new type of device, then my system does not have to be updated. This helps to keep the maintenance cost of my system down as I would not need to be continually updating my software as new devices come out. As well as allowing for device manufacturers to update their products to add new features without having to worry that my system will support it.

Another advantage to this design is that it also allows the manufacturers to be in control of what actions can be performed and how which can allow them to tune the device to work better with my system and so provide a better product. This has a disadvantage tied to it though as it gives manufacturers control over the types of actions that can be performed, because of this there may be types of actions that the manufacturer did not consider that the user's system then wouldn't be able to perform. Manufacturers could also choose to not support features that they know the next version of the device will be able to perform to help convince users to buy the newest product instead of updating the old one.

A disadvantage of this design is that it limits the devices that can connect with my system to only those that support my system, manufacturers that want to push their own home automation systems would simply not support my system and older devices would not be supported as manufacturers would rather users bought newer products instead of spending money to update the older versions.

Another disadvantage of this design is that devices would have to be continually supported by the manufacturer, which is a cost for them that they would rather avoid. This is mitigated by the fact that the manufacturers would already have to be supporting the product, but this does add another cost of support staff training and maintenance costs.

3.1.2 My System 'Scans' For Devices

This type of design has the advantage that devices manufacturers would not have to support or even know about my software for my software to support their devices. This lowers the costs for manufacturers but increases the development and support costs for my software greatly.

This design would have high development costs due to the large number of devices that would need to be supported and that most devices would require reverse engineering which is both costly and time consuming. Reverse engineering has the added detriment that the manufacturer could change how the devices works internally which could make my system either stop working completely or falsely assume that the devices is working fine.

The system would require frequent updates as new devices come out, this could mean that users have to update their automation software even though the devices they are using haven't change or been update.

3.1.3 Third Parties Add Support For Devices

This type of design is similar to the devices themselves supporting my system and allows my system to be 'device agnostic'. By instead allowing third parties to add support for new devices as well as update devices more devices can have support added quickly by community members via 'plugins' to my control system. This also helps reduces the support cost of my software as the developer of the plugin would provides support and updates to the plugin themselves.

As development of plugins would be a community effort lots of effort would have to be put into standards and conventions for plugin development, if this was not done then it would be easy for plugins to become incompatible with each other as they could use slightly different terminology to refer to the same thing, for example the 'afternoon' could be referred to as 'lunchtime' in other plugins which would confuse users and other plugin developers.

An advantageous example of a convention that could emerges would be 'middleware' which is when similar devices are grouped together under the same group of actions. For example there are many manufacturers of smart lights, if a user has more that one in their home automation system then it could cause confusion about what 'actions' to use to control which type smart of smart light. Middleware could group these different types of smart lights under a set of actions that would work with all of them which provides a consistent interface for the user to interact with.

By allowing anyone to develop these plugins it would be easy for users to add support for their own DIY projects. Many of these DIY projects would be unique or specific to their circumstances so if either of the other designs were chosen then it would be either costly if difficult to support them. Another advantage to allowing anyone to develop plugins is that they might be able to come up with ideas for devices of actions for existing devices that manufacturers and other users would not have thought of before.

The disadvantage of allowing third parties to develop plugins is that they don't always have the time or money to support the plugins that they write, this can lead to plugins being abandoned by the original developer. This doesn't have to be a large issue though because as long as the device doesn't change too much after the plugin is abandoned the plugin could still work with the device. It is also possible for other developers interested in the device working in their own homes could start supporting the old plugin.

An disadvantage to allowing anyone to develop plugins is that the quality of the plugin isn't guaranteed, so the plugin could be written by someone who doesn't know the conventions or the plugin could have bugs that could interfere with other plugins or even stop the automation process entirely. This could be fixed by having a repository of plugins that have been verified to work well with the device and other plugins.

3.2 Rules

User defined rules are an important part of a home automation system as without them the system wouldn't do anything. Rule systems on other home automation systems tend to have a simple system for defining rules that allows users to define a condition whether an action or group of actions takes place or not. A smarter system would allow the user to combine these conditions to allow more freedom and flexibility. This is the essence of how the automated planning method Hierarchical Task Network (HTN) works. A list, called the task list, of 'methods' and 'operators' is provided to the planner which then decomposes the methods into either methods or operators until only operators remain, at this point a 'plan' is formed and can be executed. When these methods are decomposed preconditions are checked to select which methods or operators to decompose the parent method into, this allows for a more flexible way of defining rules.

There are many other types of planners but an HTN planner was selected for this project because, as specified in section 2.7, it is a domain configurable planner. This allows the rules for the planner (also know as the domain) to be specified separately to the planner which is useful for this project because the rules for each user will be different depending on their needs and what devices they have.

3.3 Identifying of Groups of Users

A key area to consider when designing software is to think about who the users of the end system will be. In the case of my project I have identified three groups of users who would interact, each group has different requirements from my system and so should be considered in the design.

3.3.1 The End Users

This group of users are the users that actually interact with the various devices and rules configured in the system. They only interact with devices controlled by the system and have no interaction with the control software at all. Because of this the responsibility for the design decisions for this type of user can passed onto the other types of users. All that needs to be done is to make sure that the other types of users produce designs that this group of users can use easily, this can be helped by producing a set of guidelines or standards to follow that will help the system run smoothly. This is only an appropriate design decision because part of the expected goals of managers and developers is for the system to work well for the end users which is aligned with my goal as the system designer.

3.3.2 The Managers

The managers are the group of users that add new devices to the system as well as configure the rules for the system to follow. Users in this group are not expected to have a detailed knowledge of the system and so are only expected to interact with the system via a high level user interface, that I expect to be developed 'on top' of the system I will design. This type of user wants to be able to easily setup new devices to work with the system, to be able to setup rules for the system and it's devices to follow as well as being able to be able to tell what will effect the configured rules will have. The rules these managers create will need to interact with the devices configured in the system. How these devices can be interacted with is defined by the developers, this can have some benefits, for example as described in section 3.1.3 'middleware' can be used to abstract away unnecessary details for the managers such as the different kinds of lights that might exist in their system.

3.3.3 The Developers

The developers is the group of users I will be focusing on the most while I am designing my system as they will be interacting with the system directly, whereas the other groups of users interact with my system indirectly via user interfaces or by interacting with the devices themselves. I expect this group to consist mainly of community members who own the device they are developing the software for, the benefit for them being that their device will then be capable of working with the rest of the system, it is also possible for the manufacturers of devices themselves to put out an 'official' plugin for my system as well which would allow them to increase the amount of users that would want to buy their product. These plugins would be shared via some kind of 'repository' system, this would allow users to select which drivers they want to install in their home system. Because of this only one developer would need to write software for a particular device to allow anyone else who wishes to use that type of device with my system would be able to just by installing the plugin. This group is expected to interact with my system by writing software 'plugins', these plugins can fall into two categories: drivers and middleware. A driver is a piece of software that provides my system with a list of actions that the device can perform along with information on how the action will affect the state of the world. Drivers also provide a way for the control system to tell the device to execute the action. Middleware builds on top of drivers to provide more complex functionality by composing multiple actions together in different ways. This allows the developers to provide more consistent actions for managers to work with, as well as allowing them to add additional features to the devices by combining together actions.

3.4 Core Design

For this project I will only be focusing on the design of the 'core' of this project, because of this I will consider designing the UI for the managers out of scope, but I will consider how they will provide the rules for the system.

The core of this system will consist of an automated planner, which will be provided by an external program, along with a wrapper around the planner that collects together the inputs to the system into

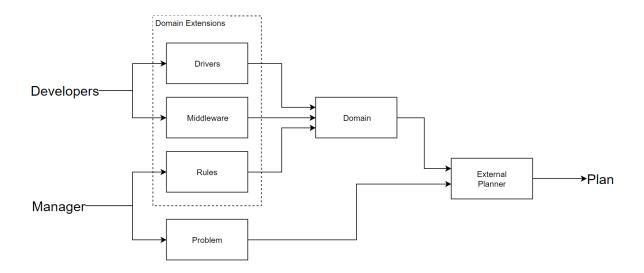


Figure 3.1: The flow of data structures through the core of the design

appropriate forms for the planner and then formats the output of the planner. An external planner was chosen because a planner is a complex system on it's own that would be a full research project.

The type of planner my design will use is a Hierarchical Task Network (HTN) planner. This type of planner as discussed in section 2.7 is a domain configurable planner meaning that the inputs provided to it to produce a plan are a 'domain' and a 'problem'. An HTN planner was chosen because this type of planner allows information about the environment to be included in the input to the planner, this is important because if this weren't the case then information about devices would have to be included in the planner itself which would mean that the plugins described in section 3.1.3 would be impossible.

The ability to specify domain information externally to the planner has another benefit in that this information can be provided in multiple parts and then combined together into a single 'domain' to be input into the planner. This is what my system will do, developers will provide drivers and middleware in the form of 'domain extensions' that give information on how actions affect the state of the world, and managers will provide a set of rules for the system to follow in the form of a domain extension and a problem. These domain extensions and the problem will then be used as inputs to my system which will combine together the extension to form a complete domain description for the system and a problem description that can be used as the input to the external planner. This process is shown in figure 3.1.

As mentioned in the previously, managers will provide rules via domain extensions. This is because these rules are descriptions of how the manager want's the domain to work as oppose to a description of a problem. The managers also supply a problem to be solved, this is in the form of a list of tasks to take, these will usually be the 'rules' specified by the manager in the earlier step. The problem also includes information about the current state of the system, this would have to be provided by the developers when writing their plugins as an 'initial state' of the device.

Once the domain and problem have been collected by my system and transformed into a form that the external planner can process, my system will execute the external planner to work out a plan. The planner must be able to output whether a plan has been found or not as well as being able to output the lowest cost plan that has been found.

3.5 Plan Execution

Once the core has found a plan it is ready to be executed. The external planner can provide facilities to plan for multiple tasks to be run at the same time to reduce the amount of time taken for a plan to complete. The plan generated would be passed out to the home automation system to be executed in the order given, but this step is omitted as I am only designing the core.

After the plan is executed the core starts another round of planning, in my simple design my core does not receive feedback on the execution of the plan because this would greatly increase the complexity of the design. I will go into greater detail as to why this is in section 3.6, but for this specific case I

would have to introduce a new type of devices called a 'sensor' which would give information about the state of the world to the system. The largest issue of adding these sensors is the form in which they provide information the system would have to be standardized with the devices which provides a large amount to additional complexity to the conventions that would have to be designed for them.

3.6 Flaws

In his work Nau (2007) describes a conceptual model for a planner (I have included this in appendix B). As part of his description of domain-independent planning he also describes a set of assumption that restrict the domains that classical planners can work on (I have included these assumptions in appendix B.5), these assumptions can also be seen as restrictions on classical planners that don't allow them to work on problems in the real world without heavy amounts of abstraction between the problem and the planner. Although the HTN is not a classical planner all of these same restrictions apply to the design that I have laid out.

Restriction R0 (Finite Σ). HTN planners are not designed around a system of states in the same way that classical planners are, but there does exist a function that can transform HTN's internal representation of state to be the same as that of a classical planner. What this restriction means for HTN planners is that there can exist states that the planner cannot express, so therefore there can exist plans that it is impossible for the planner to account for. This does not limit the planner too much as the domain tends to have encoded in it enough information to produce states which are useful to it.

Restriction R1 (Fully Observable \sum). Because my design does not incorporate the use of 'sensors' it has no knowledge of events this means that the planner's state-transition function will be incomplete meaning that it cannot react to external stimulus or unexpected consequences of actions. My design also assumes that developers are able to accurately predict all the consequences of the actions the devices can take. The consequence of this restriction is that the system will be inaccurate, although it is impossible to say how inaccurate and what effect the inaccuracy would have on a real example would be without testing the system.

Restriction R2 (Deterministic Σ). My system assumes this to be the case in many places: it does not account for errors in tasks and assumes they will always produces the same effect on the state of the system; or it does not account for the possibility of devices having a random factor in them which can be useful in some cases, for example a system to output a random fact of the day. This is a restriction that it is hard to overcome as the system due to the nature of the restriction.

Restriction R3 (Static Σ). My system currently does not support events due to the fact that it does not support sensors and that devices have no way of communicating the execution status of the actions have been performed. This has drastic effects on the usefulness of the planner as this means that it cannot react to external stimulus, this means that the users can have no input to the system. This restriction would be solved by adding support for sensors in my system, but this has been deemed out of scope.

Restriction R4 (Attainment Goals). This kind of restriction means that it is impossible to restrict the system to no visit certain states in the plan. This means that if the system was required to adhere to safety restriction it would be impossible to do so with the current design. This could be remedied by building in safety restrictions, but because I would not be the one building the plugins to the system it would be impossible to enforce as developers could fairly easily get around any restrictions.

Restriction R5 (Sequential Plans). The consequence of this restriction is that certain types of plans will be inefficient or too slow to be useful for the user. This can be easily remedied by changing the external planner to one that allows asynchronous planning.

Restriction R6 (Implicit Time). This restriction is no easy to fix because as Nau (2007) states 'This assumption is embedded in the state-transition model, which does not represent time explicitly'. This can be partially fixed by introducing a cost parameter to actions and events in the planner, this would allow the system to avoid actions that cost a lot either in time or resources.

Restriction R7 (Off-line Planning). This restriction can mean that plans get outdated while they are still being created. In the environment of a home automation system, the speed of events and actions is expected to be relatively slow compared to how quickly the planner can create new plans because of this, this restriction should not effect the system too much.

The aim of this project is not to address these restrictions, so most of these are deemed to be out of scope in the design, but for a next version of this design these would need to be considered as they have great effects on the design.

Implementation

4.1 Selecting an External Planner

As discussed in my design I will be creating a wrapper around an existing external planner to collect together domain extensions and a problem to use as input to the planner. SHOP2 (Simple Hierarchical Ordered Planner) is a domain-independent automated planner, and the JSHOP2 (see appendix A.1) implementation has great documentation (see reference Ilghami (2006)) as well as being free and open source is the perfect external planner for my needs. Because it is a domain-independent planner it accepts inputs of the domain and problem which describe the problem to solve as well as the context (or domain) in which it should be solved. JSHOP2 expects these input to be expressed in it's own planning domain definition language, this is useful because I can modify the syntax of this language to allow for domain extensions while still keeping the expressive power of the language. Using JSHOP2's domain language also has the benefit of making it easier to transform from my modified version to the version that JSHOP2 can process with few errors.

4.2 Parsing and Encoding

The first part of my core design is to read domain extension and a problem specifications supplied by the user. For this I needed to specify a domain and problem language, luckily JSHOP2's documentation (Ilghami 2006) includes a full definition of the data structures that make up domain language. To parse the domain language and then encode it into a form that the JSHOP2 planner would recognize I wrote three modules of code: a parser to initial parse and verify that the domain extensions and problem are of the correct form; a pre-compiler to process the representation produced by the parser into an internal representation that is easier to work with; and an encoder which takes the internal representation for the domain-extensions and parser and produces the domain language that JSHOP2 recognizes.

4.2.1 Parser

Because SHOP2's original implementation is written in lisp, JSHOP2's domain language takes heavy influence from lisp. This ends up being very useful when parsing the language because I chose to implement the JSHOP2, wrapper in a lisp family language called 'Clojure' (see appendix A.2). What this means is, to read the domain extensions and problems I can just use the 'read-string' function provided by the language. By using functions included in the language itself I can even get the added benefit of ignoring comments which is a feature present in JSHOP2's specification with no extra effort.

To parse the domain-extensions and problem I used a Clojure library called 'clojure.spec' (see appendix A.4), this library allows you to specify how a piece of data should be structured and any predicates that the should be true for the data. This ends up being very similar to how JSHOP2's documentation describes the domain language, because of this the parser is very similar to the original JSHOP2 documentation.

Differences to JSHOP2

While writing the parser for the domain language I introduced a few minor differences to the domain language to help increase readability of the language. I have detailed these below:

- The 'assign' keyword used for assignment is now 'def', this is more similar to how clojure defines variables.
- Task lists are vectors instead of list, this means that they use square brackets '[,]' instead of ordinary brackets '(,)'. This helps to differentiate them as a data structure.
- Delete lists and add lists are also vectors.
- Conjunctions now *must* begin with an 'and' keyword, unless they contain no expressions in which case they may be an empty list. This helps to distinguish between lists and conjunctions even further.
- There is no way to specify a 'domain', instead a vector of 'axioms', 'operators' and 'methods' must be specified as a domain extension. These domain extensions will later be combined to form a single domain.
- A problem does not specify what domain it will use as it is assumed that the domain will be the one created by merging the domain extensions.

4.2.2 Pre-compiler

The parser validates that the domain extensions and problem is of the correct form, but it does not produce an output that is not easy to process. Because of this a pre-compiler is needed to process the output of the parser into a form that is easy to then encode into the form that JSHOP2 can understand. The internal representation is similar in structure to how the language is defined, each form stores information related to itself and it's children, but doesn't store anything related to it's parent. The internal representation is defined using a clojure data structure called a 'record', this record is a map of keys and values with some extra properties that allow for groups of functions call 'protocols' to quickly dispatch (choose the correct function to call) on.

4.2.3 Encoder

Because the internal representation is a nested structure of records (which can be thought of as typed map or dictionaries in other languages), this allows me to write the encoder in a way so that each records 'knows' how to encode itself using a protocol and can just recursively call the encode function on each of it's children, if any, to build up it's encoded version. Because of this property it was very easy to write the encoder part of the core, as I just had to know how each type component in the domain language was expressed in JSHOP2's language and write that out as a quoted form then finally serialize the newly converted domain and problems into files for use in the external planner.

4.3 Wrapping JSHOP2

JSHOP2's planning process has 3 main stages to it: compiling the domain and problem; recompiling the problem file; and finally running the problem to find a plan. To properly 'wrap' JSHOP2 I had to be able to execute this functionality and read the results from within the core of my design.

4.3.1 Calling JSHOP2

Clojure is a language that runs on the Java Virtual Machine (JVM), this allows clojure to offer interoperability with java code. I used this 'interop' to call the function that compiles the domain and problem files inputting the files generated in the previous steps.

4.3.2 Recompiling the Problem File

JSHOP2 compiles it's domain and problem files into java source code that needs to be compiled before it can be run, this requires that the java compiler be run with the files produced by the previous step as inputs. The easiest way to do this I found was to use the clojure library 'clojure.shell' (see appendix A.5) which allows me to make calls to the command line of the operating system. Using clojure.shell I simply called the java compiler 'javac' to compile the problem file as specified in JSHOP2's documentation.

```
ake@ubuntu:~/prog/clojure/bitmaid/env$ ./scripts/run.sh
[LOG] Running jar
Create domain file
Create problem file
Compile domain
Compile problem
Recompile problem
Plan
Delete class files
Delete java files
Delete domain files
Delete problem file
Shutting down agents
Finished
Plan found!
Plan: ["(!drop kiwi)" "(!pickup banjo)"]
Cost: 2.0
[LOG] Finished!
```

Figure 4.1: An example of a simple domain and problem being solved using the core and external planner.

4.3.3 Parsing JSHOP2's Output

Once the problem file has been compiled it can simply be run using the clojure.shell library and executing the compiled java files. The planners output simply contains a line stating whether any plans were found or not, and if a plan was found then it states a task list that would solve the problem specified and a cost for the plan. These are simply parsed as strings and printed to the user.

System Testing

Because clojure is a dynamic language and a lisp it is usual to test the system while writing the functions by using the REPL. In the case of this project this was not enough because each component in the system was large and interconnected to itself. Because of this I wrote tests covering each section.

5.1 Parser - 320 assertions

This component was the section that I focused most of my time testing on. This is due to the fact that it is the only component that interfaces with input from the user, user input can be of any form so it is effective to spend more effort on places in the code that have to deal with it.

Because when I was developing the parser I had documentation that explained in detail the domain language (see Ilghami (2006)), it is was easy to test that each of the different expressions worked as it was supposed to. Also, due to the recursive nature of the language, I could test each expression individually to check that it was working properly and then trust for the tests following it that that expression would parse as expected.

5.2 Pre-compiler - 147 assertions

As I did not expect the parser to handle every case perfectly the next most important place to test was the pre-compiler. This ended up being very useful as a few errors did make it past the parser that I had not found. These errors usually ended up being me misunderstanding how the clojure.spec library worked and so I will not go into them here.

It was also useful to test that the data structures had the correct types of children attached to them and that each of the properties attached to the data structure was correctly filled.

5.3 Encoder - 37 assertions

The encoder was the last component in the core that I built, and so it the component that I spent the least time testing. What is important about testing this component though is that this is the first time that a full end-to-end test could be done. Because of this most of the tests in this section are tautologies as most expressions are not expected to change too much as they pass through the system.

5.4 End to End test

As a final test for the system I put together a simple example of a house with several light in it. In this example the user has setup two rules: if it's the afternoon and any of the lights are on then turn off all the lights; and if it's either the morning or the evening and any of the lights are off then turn all the lights on. This example is included in the 'example/' directory in the base of the source-code folder as well as in appendix C.

The example is made up of several files, the problem file 'p.prob' contains information about the current state of the system, i.e. there are several lights, some of them are on and some are not, and the hour of the day is 12. There are three domain files the first of note is the 'user-rules.dext' file, this file is

```
defproblem
                                                             defproblem
  [(hour 12)
                                                              [(hour 5)
                                                               (light light1) (on light1)
   (light light1) (on light1)
   (light light2)
                                                               (light light2) (off light2)
   (light light4) (off light4)
                                                               (light light4) (off light4)
   (light light6) (on light6)
                                                               (light light6) (on light6)
   (light light7) (off light7)
                                                               (light light7) (off light7)
   (light light9) (on light9)]
                                                               (light light9) (on light9)]
  [(automate-house)])
                                                              [(automate-house)])
ake@ubuntu:~/prog/clojure/bitmaid/env$ ./scripts/run.sh
                                                             ke@ubuntu:~/prog/clojure/bitmaid/env$ ./scripts/run.sh
[LOG] Running jar
                                                             [LOG] Running jar
Searching for domain extension files
                                                            Searching for domain extension files
ound domain extensions:
                                                            Found domain extensions:
light1.dext
                                                            light1.dext
time.dext
                                                             ime.dext
Found a problem file:
                                                            Found a problem file:
                                                            p.prob
p.prob
Compiling domain extensions
                                                            Compiling domain extensions
Compiling problem
                                                             Compiling problem
Generating plan
                                                            Generating plan
Create domain file
                                                            Create domain file
Compile domain
                                                             Compile domain
Compile problem
                                                             Compile problem
Recompile problem
                                                            Recompile problem
Plan
                                                            Plan
                                                            Delete class files
Delete domain files
                                                            Delete domain files
                                                            Delete problem file
Shutting down agents
                                                            Shutting down agents
inished
                                                             inished
Plan found!
                                                            Plan found!
Plan: ["(!turn-off-all)"]
                                                            Plan: ["(!turn-on-all)"]
                                                            Cost: 1.0
ake@ubuntu:~/prog/clojure/bitmaid/env$
                                                            ake@ubuntu:~/prog/clojure/bitmaid/env$
```

Figure 5.1: An example run of a simple example (a) with the hour set to 12 and (b) with the hour set to 5.

expected to be automatically generated by a user interface that the manager of the automation system would configure.

The second file to look at would be the 'time.dext' file, this extension is an example of added functionality that could be provided by middleware as it provides a series of axioms that use the 'hour' predicate to provided a more useful measure of time.

The third and final file is 'light1.dext' which is the domain extension written as a 'driver' for the lights in the house. It is expected that this file would be written by a third party and imported as part of a 'plugin' package. This file defines a series of operators which define the actions that the device as well as the plugin can perform.

The results of this test is that a plan is formed to turn off all the lights as the 'afternoon' predicate is true and some of the lights are on, if the hour is changed in the problem description file then the outcome of the test changes. This the expected outcome of the test and shows that multiple domain extensions can be combined together to perform a single task.

Conclusion

In my work I have described the design of a system that allows users to define 'domain extensions' as a way of combining disparate information about a domain. This method of combining knowledge provided the advantage of allowing multiple different third parties to write software that integrated well with the rest of the system. By allowing multiple third parties to develop software for the system the software can grow quickly as users discover devices that they wish to be integrated in the system. Because the software plugins developed by these third parties is separate to the system I have designed, the core that I have designed is not effected by the development of these plugins which means that my system remains easy to maintain no matter the number of devices integrated.

This method also has some disadvantages in that if the third parties are writing software about similar devices or concepts, then an agreement needs to be made about the terms used and their meaning in context with the system, if this is not done then it can be easy for the system to develop complex hard to fix bugs. A resistance against this could be to have an official 'repository' of plugins that have been compared to a set of standards to reduces the number of such collisions. This solution introduces extra maintenance costs as well as possibly stifling the growth of plugins that work differently to how the standards might expect.

This project has shown that this method is feasible at least in small cases, more work would need to be done to show it working in larger test cases. Work has also not been done to address the feedback required for the state of the world to change nor has work been done to address concerns of actions taking a real amount of time.

Overall I think this project has successfully implemented a core of a home automation system. I think more work should be done on the home automation surrounding my core design and there are many interesting problems still to be solved surrounding this solution.

Appendix A

Tools Used

A.1 JSHOP2

From the SHOP project homepage (University of Maryland 2006):

Our most recent planner is JSHOP2, a Java implementation of SHOP2 (which is written in Lisp). In addition to being in Java, JSHOP2 uses a new planner compilation technique to synthesize domain-dependent planners from SHOP2 domain descriptions. This way, JSHOP2 can do a variety of optimizations to speed up execution.

A.2 Clojure

From the Clojure.org homepage (Hickey 2018):

Clojure is a dynamic, general-purpose programming language, combining the approachability and interactive development of a scripting language with an efficient and robust infrastructure for multithreaded programming. Clojure is a compiled language, yet remains completely dynamic - every feature supported by Clojure is supported at runtime. Clojure provides easy access to the Java frameworks, with optional type hints and type inference, to ensure that calls to Java can avoid reflection.

Clojure is a dialect of Lisp, and shares with Lisp the code-as-data philosophy and a powerful macro system. Clojure is predominantly a functional programming language, and features a rich set of immutable, persistent data structures. When mutable state is needed, Clojure offers a software transactional memory system and reactive Agent system that ensure clean, correct, multithreaded designs.

A.3 Leiningen

Leiningen is one of the most widely used build tools for clojure. It's use is to create and manage projects written in the clojure language as well as providing tools and plugins to aid in development.

A.4 Clojure Spec

From the GitHub page (Hickey et al. 2018):

spec is a Clojure library to describe the structure of data and functions. Specs can be used to validate data, conform (destructure) data, explain invalid data, generate examples that conform to the specs, and automatically use generative testing to test functions.

A.5 Clojure Shell

Clojure.shell is a library that allows the programmer to pass calls to the command line of the operating system. This can give them access to external programs that they would not otherwise be able to access.

Appendix B

Conceptual Model for Planning

This chapter has been included in verbatim from Nau (2007)'s work describing the current trends in automated planning. It is included to help give context to the assumptions at the end of this section which I have used as examples of restrictions to the planning model. In his work Nau (2007) describes a conceptual model for planning as the following:

B.1 Conceptual Model for Planning

A conceptual model is a simple theoretical device for describing the main elements of a problem. It may fail to address several of the practical details but still can be very useful for getting a basic understanding of the problem. In this article, I'll use a conceptual model for planning that includes three primary parts (see figure B.1a and B.1b), which are discussed in the following sections: a *state-transition system*, which is a formal model of the real-world system for which we want to create plans; a *controller*, which performs actions that change the state of the system; and a *planner*, which produces the plans or policies that drive the controller.

B.2 State-Transition Systems

Formally, a state-transition system (also called a discrete-event system) as a 4-tuple $\sum = (S, A, E, \gamma)$, where

```
S = \{s_0, s_1, s_2, ...\} is a set of states;
```

 $A = \{a_1, a_2, ...\}$ is a set of *actions*, that is, state transitions whose occurrence is controlled by the plan executor;

 $E = \{e_1, e_2, ...\}$ is a set of *events*, that is, state transitions whose occurrence is not controlled by the plan executor;

 $\gamma: S \times (A \cup E) \to 2^S$ is a state-transition function;

A state-transition system may be represented by a directed graph whose nodes are the states in S. If $s' \in \gamma(s, e)$, where $e \in A \cup E$ is an action or event, then the graph contains a *state transition* (that is, an arc) from s to s' that is labeled with the action or event e.

If a is an action and $\gamma(s,a)$ is not empty, then action a is applicable to state s: if the plan executor executes a in state s, this will take the system to some state in $\gamma(s,a)$.

If e is an event and $\gamma(s,e)$ is not empty, then e may possibly occur when the system is in state s. This event corresponds to the internal dynamics of the system, and cannot be chosen or triggered by the plan executor. Its occurrence in state s will bring the system to some state in $\gamma(s,e)$.

Given a state-transition system \sum , the purpose of planning is to find which actions to apply to which states in order to achieve some objective, when starting from some given situation. A plan is a structure that gives the appropriate actions. The objective can be specified in several different ways. The simplest specification consists of a goal state s_g or a set of goal states S_g . For example, if the objective in figure B.2 is to have the container loaded onto the robot cart, then the set of goal states is $S_g = \{s_4, s_5\}$.

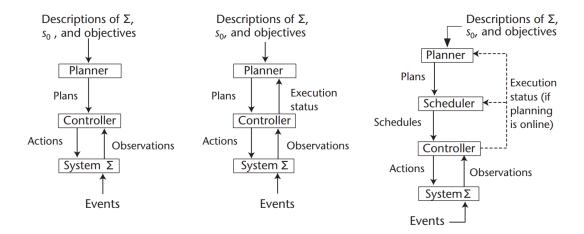


Figure B.1: Simple Conceptual Models for (a) Offline Planning, (b) Online Planning, and (c) Planning with a Separate Scheduler.

In this case, the objective is achieved by any sequence of state transitions that ends at one of the goal states. More generally, the objective might be to get the system into certain states, to keep the system away from certain other states, to optimize some utility function, or to perform some collection of tasks.

B.3 Planners

The planner's input is a *planning problem*, which includes a description of the system \sum , an initial situation and some objective. For example, in figure B.2, a planning problem P might consist of a description of \sum , the initial state s_0 , and a single goal state s_5 .

The planner's output is a plan or policy that solves the planning problem. A plan is a sequence of actions such as

<take, move1, load, move2>.

A policy is a partial function from states into actions, such as

```
\{(s_0, take), (s_1, move1), (s_3, load), (s_4, move2)\}.
```

The aforementioned plan and policy both solve the planning problem P. Either of them, if executed starting at the initial state s_0 , will take \sum through the sequence of states $\langle s1, s2, s3, s4, s5 \rangle$.

In general, the planner will produce actions that are described at an abstract level. Hence it may be impossible to perform these actions without first deciding some of the details. In many planning problems, some of these details include what resources to use and what time to do the action.

What Resources to Use. Exactly what is meant by a resource depends on how the problem is specified. For example, if \sum contained more than one robot, then one approach would be to require the robot's name as part of the action (for example, movel(robot) and movel(robot2)), and another approach would be to consider the robot to be a resource whose identity will be determined later.

What Time to Do the Action. For example, in order to load the container onto the robot, we might want to start moving the crane before the robot arrives at location1, but we cannot complete the load operation until after the robot has reached location1 and has stopped moving.

In such cases, one approach is to have a separate program called a *scheduler* that sits in between the planner and the controller (see figure B.1c), whose purpose is to determine those details. Another approach is to integrate the scheduling function directly into the planner. The latter approach can substantially increase the complexity of the planner, but on complex problems it can be much more efficient than having a separate scheduler.

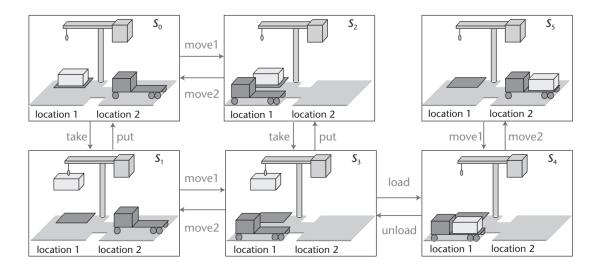


Figure B.2: A State-Transition System for a Simple Domain Involving a Crane and a Robot for Transporting Containers

B.4 Controllers

The *controller*'s input consists of plans (or schedules, if the system includes a scheduler) and observations about the current state of the system. The controller's output consists of actions to be performed in the state-transition system.

In figure B.1, notice that the controller is *online*. As it performs its actions, it receives *observations*, each observation being a collection of sensor inputs giving information about \sum 's current state. The observations can be modeled as an observation function $\eta: S \to O$ that maps S into some discrete set of possible observations. Thus, the input to the controller is the observation $o = \eta(s)$, where s is the current state.

If η is a one-to-one function, then from each observation o we can deduce exactly what state \sum is in. In this case we say that the observations provide *complete* information. For example, in figure B.2, if there were a collection of sensors that always provided the exact locations of the robot and the container, then this sensor would provide complete informationor, at least, complete information for the level of abstraction used in the figure.

If η is not a one-to-one function, then the best we can deduce from an observation o is that \sum is in one of the states in the set $\eta_{-1}(o) \subseteq S$, and in this case we say that the observations provide incomplete information about \sum s current state. For example, in figure B.2, if we had a sensor that told us the location of the robot but not the location of the container, this sensor would provide incomplete information.

B.5 Assumptions in Classical Planning

Nau (2007) also describes a set of assumptions that classical planners make about the domain they will work on:

Assumption A0 (Finite Σ). The system Σ has a finite set of states.

Assumption A1 (Fully Observable Σ). The system Σ is fully observable, that is, one has complete knowledge about the state of Σ ; in this case the observation function η is the identity function.

Assumption A2 (Deterministic Σ). The system Σ is deterministic, that is, for every state s and event or action u, $|\gamma(s,u)| \leq 1$. If an action is applicable to a state, its application brings a deterministic

system to a single other state. Similarly for the occurrence of a possible event.

Assumption A3 (Static Σ). The system Σ is *static*, that is, the set of events E is empty. Σ has no internal dynamics; it stays in the same state until the controller applies some action.

Assumption A4 (Attainment Goals). The only kind of goal is an attainment goal, which is specified as an explicit goal state or a set of goal states S_g . The objective is to find any sequence of state transitions that ends at one of the goal states. This assumption excludes, for example, states to be avoided, constraints on state trajectories, and utility functions.

Assumption A5 (Sequential Plans). A solution plan to a planning problem is a linearly ordered finite sequence of actions.

Assumption A6 (Implicit Time). Actions and events have no duration, they are instantaneous state transitions. This assumption is embedded in the state-transition model, which does not represent time explicitly.

Assumption A7 (Off-line Planning). The planner is not concerned with any change that may occur in \sum while it is planning; it plans for the given initial and goal states regardless of the current dynamics, if any.

Appendix C

Simple Home Example

C.1 Problem File - p.prob

This problem file describes a home with several lights in it as well as the current hour of the day. The problem also specifies to run the 'automate-house' method first, this is where the user defined rules are.

```
(defproblem
  [(hour 12)
   (light light1) (on light1)
   (light light2) (off light2)
   (light light3) (on light3)
   (light light4) (off light4)
   (light light5) (off light5)
   (light light6) (on light6)
   (light light7) (off light7)
   (light light8) (off light8)
   (light light9) (on light9)]
  [(automate-house)])
```

C.2 User Defined rules - user-rules.dext

This domain extension describes the rules that the manager would have configured in the home automation system's user interface. In this case the rules are: if it is the afternoon and there are some lights on, then turn all the lights off; and if it is the morning or the evening and there are some lights off, then turn all the lights on.

```
()
[])
(:method (automate-house)
()
[(rule-1) (rule-2)])]
```

C.3 Time Middleware - time.dext

This domain extension describes a simple example of a middleware that provides three axiom predicates for describing the time of day.

C.4 Device Driver - light1.dext

This domain extension describes a simple device driver to interface with the lights configured in the system.

```
[(:operator (!turn-on ?light)
            (and (light ?light)
                  (off ?light))
            [(off ?light)]
            [(on ?light)])
 (:operator (!turn-on-all)
            [(forall [?light]
                      (and (light ?light)
                           (off ?light))
                      [(off ?light)])]
            [(forall [?light]
                      (and (light ?light)
                           (off ?light))
                      [(on ?light)])
 (:operator (!turn-off ?light)
            (and (light ?light)
                  (on ?light))
            [(on ?light)]
            [(off ?light)])
 (:operator (!turn-off-all)
            ()
```

```
[(forall [?light]
	(and (light ?light))
	(on ?light))]
	[(on ?light)]]
	[(forall [?light]
	(and (light ?light)
	(on ?light))
	[(off ?light)]])]
(:method (toggle-light-internal ?light)
	(on ?light)
	[(!turn-off ?light)]
	(off ?light)
	[(!turn-on ?light)])
(:method (toggle-light ?light)
	(light ?light)
	[(toggle-light-internal ?light)])]
```

Bibliography

Cimatti, A., Pistore, M. & Traverso, P. (2008), Chapter 22 Automated Planning - Handbook of Knowledge Representation, in 'Foundations of Artificial Intelligence', Vol. 3, pp. 841–867.

URL: http://www.sciencedirect.com/science/article/pii/S1574652607030222

Contributors, W. (2018), 'Internet of things'.

 $\mathbf{URL:}\ https://en.wikipedia.org/wiki/Internet_of_things$

Evans, D. (2011), 'The Internet of Things - How the Next Evolution of the Internet is Changing Everything', CISCO white paper (April), 1–11.

 $\label{eq:urange} \textbf{URL:} \ http://scholar.google.com/scholar?hl=en&btnG=Search&q=intitle:The+Internet+of+Things+-+How+the+Next+Evolution+of+the+Internet+is+Changing+Everything\#0$

Hickey, R. (2018), 'Clojure.org'.

URL: https://clojure.org/

Hickey, R., Miller, A. & Halloway, S. (2018), 'Clojure spec.alpha'.

URL: https://github.com/clojure/spec.alpha

Ilghami, O. (2006), 'Documentation for JSHOP2'.

Lobaccaro, G., Carlucci, S. & Lofstrom, E. (2016), 'A review of systems and technologies for smart homes and smart grids', *Energies* **9**(5), 1–33.

Nau, D. S. (2007), 'Current Trends in Automated planning', AI Magazine 28(4), 43.

Statista (2015), 'Internet of Things (IoT) connected devices installed base worldwide from 2015 to 2025 (in billions)'.

URL: https://www.statista.com/statistics/471264/iot-number-of-connected-devices-worldwide/

University of Maryland (2006), 'Description of the SHOP Project'.

URL: http://www.cs.umd.edu/projects/shop/description.html