After having detected its goals, an autonomous intelligent agent must continue to process them. The study aims to conduct further research on other aspects of Goal Formulation namely: Goal Feasibility Assessment, Goal Prioritizing, Goal Evaluation and Goal Modification.

### REFERENCES


perceived or inferred facts about the current and future world (data-driven and anticipated data-driven) and when the agent ensures that its desires about the world are reflected in its beliefs (goal-driven).

6 EXPERIMENTAL DOMAIN: Household Robot

To test the applicability of goal detection concepts elaborated in this work, a simulated household robot that is capable of detecting its own goals was developed and implemented in PROLOG, using a serial machine. The household robot is situated in a room and interacts or manipulates objects in the room to successfully accomplish its desires. These objects include the door, window, curtain, lights, light switch, air conditioner, exhaust fan, battery recharger, phone, and doorbell.

The household robot is essentially motivated to preserve itself, keep the room comfortable and protected, and attend to other needs such as opening the door and answering the phone. The robot is battery powered and consumes energy (battery) as it performs its tasks. From time to time, or as the situation necessitates, it recharges its power supply. The robot is also motivated to achieve as many goals as possible, maximize the value of goals achieved, accomplish its tasks in an efficient manner by economizing in its use of resources, and obey its master.

To update its beliefs, the robot has the capability to communicate and interact with its master. It has also an internal reasoner to infer new beliefs. It is also equipped with several sensors to perceive the external environment (e.g. temperature sensor, sound sensor, visual sensor, etc.). The sensors (except the visual sensor) transmit a value whenever they sense a change of condition. The visual sensor sends perceived data as it recognizes objects found in the external environment.

Figure 5 summarizes some partial results generated by the simulated goal detection program. Given an initial set of perceived data (current and anticipated) and a prescribed goal by the master, the robot was able to generate a set of goals. Program test run results show (see Figure 5) that a goal (intention) can be activated by several mechanisms and can be invoked by a number of motives. For example the intention of closing the window is detected by both current data-driven and anticipated driven goal detection mechanisms for the purpose of providing comfort and protection to the room respectively. It can also be observed that conflicting goals may arise (e.g. the goals of opening and closing the window are activated) out of a given situational context. The robot cannot perceive all important data at an instant. However, it must be guided (by its motives) on the type of information it has to gather. The results indicate that goals related to gathering of presently unknown information are also triggered (e.g. observation of status of lights, etc.).

The output (desireIntention database) generated by Goal Detection contains all the goals that were treated as relevant, given the facts of the environment at a particular instance. Such output will provide the working input for the next phase of goal formulation which is determining the priority for each of the detected goals.

7 FUTURE WORK

Goal Detection is only one of the five processes involved in Goal Formulation.
to achieve a goal.

During goal detection, the agent continuously updates its beliefs about the environment and then reasons with these beliefs together with its motives, desires and intentions in order to determine the appropriate goals. Figure 4 illustrates a Goal Detection architecture for a generic autonomous intelligent agent. The agent maintains two separate sets of beliefs, the *current world* and *anticipated world* databases. It acquires and updates its current beliefs by perceiving the external environment (through sensors), communicating with an external agent, and internal reasoning (inference). Newly perceived and inferred values are subsequently stored in the agent’s current beliefs (current world) database. The agent acquires and updates its future beliefs through communication and internal reasoning. All communicated and inferred data about the future state of the world are received and then stored in the agent’s database of future beliefs (anticipated world).

![Figure 4 Goal Detection Architecture for an Autonomous Intelligent Agent](image)

Aside from sensing and recording facts about the world, the agent also keeps a database of desires (and motives) and intentions that define its role or describe its purposive nature. By reasoning about the causal effects of its beliefs to its motives, desires and intentions, the agent decides which goals are appropriate to trigger. Such reasoning is undertaken by the agent through four concurrent and parallel mechanisms: current data-driven, goal-driven, communicated or prescribed and anticipated data-driven. The agent maintains a database of all its detected desires together with their corresponding intentions (desireIntention database).

The agent’s goals (desires and intentions) are either self-detected or imposed by another agent. Self-detected goals are generated when the agent reacts to newly...
knowledge base. Subsequently, the agent creates and inserts a desireIntention tuple.

4.4 Anticipated Data-driven Goal Detection

Apart from maintaining an updated set of beliefs about the current state of the environment, an agent may also acquire and maintain a set of beliefs regarding the future state of the environment. Anticipated facts about the world are obtained by the agent through communication with an external agent and internal reasoning. For example, the fact that it might rain anytime now can be inferred from the perceived fact that it is cloudy. By making use of data about the anticipated state of the world, an agent can detect goals that stimulate proaction. Proaction ensures that desired states are maintained and undesired states are prevented from occurring. Anticipated data-driven goal detection undergoes a similar process as that of data-driven goal detection. However, instead of utilizing current data, the agent uses forecasted data.

5 AGENT ARCHITECTURE

An autonomous intelligent agent can be considered as a “goal-directed computational process” [Ferg92] that has multiple concurrent tasks to accomplish. It achieves its tasks by performing four basic functions namely: perception of the dynamic conditions of the external environment, communication with an external agent, internal reasoning in order to interpret perceptions and communication, draw inferences and determine actions and action to affect conditions in the environment or
mechanism and condition/reason for detection. Once created, it is inserted at the top of the agent’s database of desireIntentions. It will be used by the agent when determining the validity and priority as well as assessing the feasibility of the detected goals.

4.2 Goal-driven (top-down) Goal Detection

Given its limited perceptual capacity, the agent cannot sense everything that is required in its domain at an instant. Neither does it know what to sense, unless guided. In the absence of facts about the world, current data-driven goal detection cannot detect other desires that are possibly more important and more urgent. A housekeeper which has a motive of keeping the house secured or protected must see to it that door is always closed. However, the goal of keeping the door closed (for security reasons), cannot be detected through current data-driven goal detection unless the housekeeper senses situations that motivate her to close the door (e.g. ringing of the door bell).

Current data-driven goal detection promotes a wait and react attitude, that is, the agent does not reason and act until a stimulus is generated by the environment. However, an intelligent agent must not at all times behave in this manner. Reaction does not always guarantee positive results (e.g. it may be too late) and some situations may have harmful consequences when not successfully reacted upon. Rather, an intelligent agent, as much as possible, should know what to do in advance to maintain the positive state of affairs or prevent any negative consequences that a particular situation may entail once it occurs unexpectedly. To realize this, an intelligent must be able to detect goals that are proactive rather than reactive in nature.

Goal-driven goal detection is a top-down approach that enumerates the goals that the agent should accomplish in a particular context. It guides the agent to focus its perceptual attention by detecting data gathering goals (e.g. observation of unknown facts about the world). It is undertaken by the agent at start-up time and during regular intervals or opportunistic situations, to check whether the desired states and beliefs about the environment are still in effect.

Figure 3 illustrates the process of goal-driven goal detection. Goal-driven goal detection is a process of examining (regularly or as the opportunity permits) whether the agent’s desires to fulfill its motives (e.g. the desire of closing the door always) are currently being met. If a desire is not present in its current set of beliefs, the particular desire is detected. Subsequently, an appropriate intention for the detected desire is chosen, after which a desireIntention tuple is created and added at the bottom of the database.

4.3 Prescribed (Communicated) Goal Detection

An agent’s goals may also be explicitly prescribed by an external agent. Through communication, an external agent instructs/requests the agent to accomplish one or more tasks. Only tasks that are realizable are pursued by the agent. The process of communicating and requesting goals can be undertaken repeatedly. Once the external agent has communicated its requested tasks (see Figure 1 for structural representation of communicated desires), the agent checks their validity and then stores them in its
providing comfort for the house), and a state that depicts time whether discrete, continuous, interval (e.g. concept of “always” or “at all times”, morning, etc.).

Current data-driven goal detection is a bottom-up, reactionary process that is activated whenever new data is sensed from the environment. The agent’s purposive behavior is driven by its reactions to the data being sensed. It induces the agent to respond to situations that need immediate attention. Figure 2 shows how the process of current data-driven goal detection is undertaken. Basically, it is a continuous process that: a) compares whether its current beliefs are reflected in its desires or b) checks whether observed data in the environment represent situations that would activate a desire(s). If a current belief does not match a desire (e.g. as shown in Figure 2, the current belief of having a cold temperature does not match the desire of having suitable temperature), a corresponding desire and intention are triggered. Also, if a stimulus is present (e.g. as shown in Figure 2, the presence of rain threatens the motive of protection), a corresponding desire (preventing rain from entering) is detected and subsequently intentions are triggered (closing the door and closing the window) to realize the desire.

A desire can be realized by one or more intentions. For example as shown in Figure 2, to realize the desire of having a suitable temperature inside the house, the agent can either close the window or open and adjust the airConditioner. The agent selects the intention(s) that is applicable under present conditions.

<table>
<thead>
<tr>
<th>motive</th>
<th>desire property</th>
<th>value</th>
<th>when property value</th>
<th></th>
</tr>
</thead>
<tbody>
<tr>
<td>comfort</td>
<td>temperature</td>
<td>cool</td>
<td>window</td>
<td>close</td>
</tr>
<tr>
<td>protection</td>
<td>rainNoEntry</td>
<td>yes</td>
<td>rain</td>
<td>yes</td>
</tr>
</tbody>
</table>

<table>
<thead>
<tr>
<th>property</th>
<th>value</th>
<th>applyingCondition</th>
<th>intention property value</th>
<th></th>
</tr>
</thead>
<tbody>
<tr>
<td>temperature</td>
<td>suitable</td>
<td>temperature</td>
<td>cold</td>
<td>window</td>
</tr>
<tr>
<td>rainNoEntry</td>
<td>yes</td>
<td>window</td>
<td>close</td>
<td></td>
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<td>close</td>
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</tbody>
</table>

After an intention has been selected, a desireIntention tuple is created. A desireIntention tuple consists of arguments namely: motive, desire, intention,
also be prescribed by an external agent. For example, a housekeeper can acquire some of its goals from its employer. These types of goals are called communicated desires. They are represented as predicates with desire and intention as arguments. The example depicted in Figure 1 for communicated desires simply states that an external agent requests the agent to turn off the lights for the desire of keeping the lighting suitable.

A desire is detected when certain conditions are present in the environment (stimuli). Depending upon the underlying conditions, the agent may choose a method(s) of action that transforms a desired state into reality. Such chosen method represents the agent’s intention to achieve its detected desire. It may be represented as a predicate with desire, condition when applicable, and intention as arguments. Figure 1 presents three examples of intentions. The first one states that in order to achieve the desire of having sufficient power supply, the agent must execute an action of recharging its power supply. The next two examples of intention predicates suggest that a single desire may be realized by more than one course of action. For example, to make the temperature suitable (which is currently cold), the agent can either close the window or open and adjust the air conditioner to increase the temperature inside the house. It is important to note that closing the window or opening and adjusting the air conditioner to increase the temperature are applicable only if the current temperature is cold. Otherwise, say the temperature is currently hot, executing the said courses of actions would not satisfy the goal of keeping the temperature suitable.

4 GOAL DETECTION MECHANISMS

Given a set of beliefs about the world, motives and desires that define its mission, and intentions to carry out tasks according to its defined role, how does an autonomous agent determine the relevant goals that need to be pursued as it adapts to the changing environmental context? This work identifies four mechanisms that an autonomous intelligent adopts when detecting the appropriate goals namely: current data-driven, goal-driven, communicated (or prescribed) and anticipated data-driven.

4.1 Current Data-driven (bottom-up) Goal Detection

An autonomous agent is situated in a dynamic world. To keep its set of beliefs updated, the agent continuously monitors both the internal and external environments. As environmental data are sensed, the agent updates its knowledge base accordingly. Sensed and inferred data from the environment (new data or changes) create conditions that act as stimuli to activate some desires. This work has initially identified five types of situations that trigger desires namely: occurrence of a state that contradicts a desired state (e.g. the state of having insufficient power supply contradicts the desired state of having sufficient power supply), a state whose value is out of range or falls below the threshold value of the desired state (the state of having cold or hot temperature falls outside the threshold value of a desired state of having suitable temperature), a state that threatens a motive of the agent (the presence of rain threatens the motive of providing protection for the house), a state that promotes a motive of the agent (the presence of morning sunshine promotes a motive of
descriptions of states that the agent wishes to be achieved (or avoided) when performing its role. They are activated when the conditions that stimulate the agent to satisfy a motive emerge. However, some desires (if not most of them) are not capable of being directly satisfied by the agent. Intentions are the desired states that the agent must act upon in order satisfy its desires. An intention is a direct goal (desired state) that an agent can carry out through actions while a desire may just be a causal effect of an agent’s accomplished intention.

To further clarify the relationship among motive, desire and intention, an example is given. As part of its role, an agent such as a housekeeper is expected to keep the house clean and comfortable. Cleanliness and comfort are examples of a housekeeper’s motives. To keep the house comfortable, the housekeeper must see to it that the temperature, air quality, sound, etc. within the house are kept suitable. Keeping the temperature suitable is an example of a housekeeper’s desire. It is a state of the world that can be perceived, aspired for and be realized. To fulfill a desire, some actions need to be carried out. For instance, to make the temperature suitable (which is currently cold), the window must be closed or the heater needs to be opened. Closing the window or opening the heater are actions that need to be performed to achieve the desire of making the temperature suitable. Thus, the states of having the window closed or the heater opened are considered to be intentions of the housekeeper. They are achieved directly by the housekeeper through the performance of some actions.

This paper views intentions and desires as the goals of the agent. Goals are defined to be the end results that an agent would like to achieve or avoid. They are specific and measurable outcomes toward which an agent’s efforts are directed within specified time and cost constraints [Roui93]. Some goals are essential to the overall mission of the agent (e.g. closing the window to keep the temperature suitable); others are innovative (e.g. turning off the lights to economize in the use of electricity) such that their accomplishment improves the agent’s performance in fulfilling its mission (i.e., better, faster, cheaper, safer, etc.). However, the agent may also possess some goals (called meta-goals) that are not directly related to the agent’s mission, but are necessary in guiding or controlling the agent’s reasoning and behavior (e.g resolving goal conflicts).

Figure 1 shows how motives, desires and intentions can be represented. Structurally, motives and desires are represented by means of a predicate called “desire”, which consists of arguments namely: motive, desire, and the environmental stimuli that trigger the desire. Both desire and stimuli are described as states and are therefore represented as property-value pairs. In the first example of a desire predicate given in Figure 1, the motive is “self preservation”, the goal is to have “sufficient” power supply and the triggering condition is when the power supply becomes insufficient. The first two examples are essential desires that are part and parcel of the agent’s role; the third is an example of an innovative desire while the last one is an example of a meta-desire.

The previously discussed examples are self-detected goals. However, goals can
Such knowledge depicts a partial description of the total environment. It is acquired through continuous perception of the external environment, communication with an external agent and internal reasoning. Figure 1 illustrates the nature and structural representation of knowledge that is relevant to Goal Detection. To endow an agent with the capability of detecting its own goals, it must possess and continuously reason with: beliefs it has about the world, motives that drive it to change its current world into a more desirable one, desires that need to be achieved (or avoided) as part of its mission and intentions that need to be carried out to accomplish the desires and eventually affect the external world.

An agent’s set of beliefs is made up of explicit and derived propositions. Explicit beliefs are acquired by the agent through perception and communication. Derived beliefs are inferred by the agent through reasoning. The agent’s beliefs also embody the agent’s knowledge about the current and anticipated states of the world. They can be described as a collection of property-value pairs, that is, each known property of the environment has a corresponding value associated with it. A property-value pair is also called a state. As shown in Figure 1, an example of a current belief (see currentData predicate) is the object property “window” that has a value of “close”. This simply means that the agent believes that the window is presently closed. On the other hand, anticipated beliefs are obtained through communication and internal reasoning. They are descriptions of how the world may likely look in the future. They may be represented as a predicate with property, value, and likely time that the belief may occur as arguments. An example (see anticipatedData predicate in Figure 1) is the likely occurrence of a strong wind at 1300.

Aside from possessing a set of beliefs, an agent is also regarded as a purposive system that is being behaviorally driven by a set of motives. A motive compels the agent to act in order to achieve a desired state. It may be described as a high level form of desire that is satisfied when other lower level desires that are directly related to its fulfillment are met. Associated with motives are desires. Desires are
well as different conditions for its accomplishment. Because of some contextual and computational limitations (e.g. limited resources) attributed to the agent, the unpredictability of incessantly changing environmental conditions, and the variations in the requirements of each goal, the agent’s goals are impossible to satisfy all at the same time. Thus, in the presence of constraining conditions, the agent must determine wisely which among its goals has to be invoked and pursued.

**Goal Detection** is the process of identifying the relevant goals that an agent needs to accomplish to affect the external world. It is a process of continuous reasoning about the agent’s changing beliefs about the world, motives, desires and intentions. In the past, although a number of AI researchers have addressed some issues relating to Goal Detection, it has not been accorded greater emphasis and elaboration. Wilensky and Chin’s work on Goal Detection involves the triggering of a goal by a matching situation through situation-goal pairs, that is when a particular situation has been reached or sensed, its corresponding goal is triggered. [Wile83, Wile90, Chin88] In Luria’s work on Knowledge Intensive Planning, the expressed goals (specified by the user) are straightforwardly detected by the KIP. [Luri88]

Georgeff, et al.’s Procedural Reasoning System is endowed with psychological attitudes of beliefs, desires and intentions. It is a reactive system and selects goals based on its current beliefs. [GL87] Beaudoin (whose work is influenced by Georgeff’s PRS) theorized the use of goal generactivators (management procedures and programs that execute asynchronously with the management procedures) to generate the agent’s goals. [Beau94]

Maes proposed a bottom-up mechanism for behavior selection. This mechanism chooses the appropriate behavior by responding to environmental conditions as well as making use of internal motivation. [Maes91] In the same vein, Norman and Long, and Moffat stressed the importance of motivation in the generation of appropriate behaviors or goals for the agent. Norman and Long’s work [NL94] emphasizes the role of motivation in the creation of proactive goals. In Moffat’s WILL [Moff94], focus of attention is dictated by the strength of the activation charge.

Individually, the above cited works do not provide a comprehensive and total approach to goal detection. Although each work proposes a particular means of detecting goals, it does not offer an integrated method of detecting goals. In light of the lack of a total approach to goal detection in autonomous intelligent agents, this work attempts to provide for one. It shall identify the nature and representation of knowledge required of the agent to effectively carry out goal detection, determine and develop the mechanisms that should be employed by the agent during the process of goal detection and develop an integrated architecture for goal detection. In brief, goal detection will be addressed through representation, mechanisms and architecture.

**3 REPRESENTATION**

Broadly speaking, an autonomous intelligent agent can be thought of as a physical or abstract entity that has a representation of the world it inhabits. This representation embodies the agent’s knowledge about its environment (internal and
Most of the AI planning systems that have been designed and developed so far operate on the basis that a predetermined goal or set of goals already exists. That is, they start with a set of goals that have been previously identified and assigned by the user (or designer). In the end they either accomplish their goals, or when unexpected conditions that go beyond their reasoning capabilities occur, they just decide to completely give up their further pursuit of these goals and then become idle after an attempted search for a solution(s) has failed. [Carb82]

Most of the earlier AI planning systems are not capable of exhibiting “genuine” goal-directed behavior. They are not built with the capability to monitor and analyze the environment and to formulate their own goals. They lack the ability to take advantage of opportunities being presented by changing environmental conditions. They do not have the flexibility of behavior to change their focus of attention or direction when needed most. That is, when most trying circumstances occur unexpectedly (e.g. impending danger), they lack the consciousness to abandon or suspend their current job and to seek for a more pertinent goal(s) to pursue. They are also bereft of the ability to make a rational choice in the light of present circumstances. [Carb82, Geor87, Wile83] To sum it up, as Colby has suggested, most AI planning systems are of “slave-mentality”, that is, they do not have a purpose of their own (KF85 cites Colb78).

To be truly called “intelligent”, an agent must not only be capable of knowing how to achieve its given goals; preferably, it must also have the capability to formulate its own goals. It must reason and decide what goals to pursue and when to achieve them. It must be able to identify its own goals (Goal Detection), assess their feasibility (Goal Feasibility Assessment), prioritize them (Goal Prioritizing), evaluate their validity as to whether they have to be continued, terminated, suspended, or modified (Goal Evaluation/Validation), and modify them in the light of present circumstances (Goal Modification).

The development of this research work is anchored on the above cited rationale for goal formulation. This work also posits the fundamental belief that an intelligent agent’s success in pursuing its goal-directed activities largely depend on the behavior it exhibits during the formulation of goals. However, this paper shall concentrate on the Goal Detection aspect. Specifically, it endeavors to investigate vital issues concerning goals and Goal Detection. To prove the applicability of Goal Detection concepts developed in this work, test run results involving a simulated household robot detecting its own goals will be discussed at the latter part.

2 GOAL DETECTION
An autonomous intelligent agent operating in a real world domain has a role to perform (e.g. housekeeper, teacher). Associated with the agent’s role are goals whose fulfillment serves as a barometer to gauge the agent’s overall performance of its role. These goals vary in importance, urgency and potential for realization as the environmental context changes. Each goal may require a different set of resources as
ABSTRACT Today, there appears to be considerable research enthusiasm towards endowing an autonomous intelligent agent with the capability of formulating its own goals. Goal Formulation refers to the intelligent behavior that an agent exhibits when reasoning (and deciding) what goals to pursue and when to pursue them. It may be described as the integration of several processes namely: Goal Detection, Goal Assessment, Goal Prioritizing, Goal Evaluation, and Goal Modification. However, this paper concentrates only on Goal Detection. It seeks to identify the ways by which an autonomous intelligent agent can detect its goals.

Goal Detection is the process of identifying the goals that an agent needs to accomplish to affect the external world. It is a process of continuous reasoning about the agent’s changing beliefs about the world, motives, desires and intentions. This paper identifies four Goal Detection mechanisms namely: current data-driven (bottom-up), goal-driven (top-down), communicated (prescribed by an external agent), and forecasted data-driven. These mechanisms are parallel and are continuously and simultaneously executed by the agent. To prove the applicability of goal detection concepts elaborated in this work, a simulated household robot that detect its goals is presented at the end.

1 INTRODUCTION

Most of the bulk of research work in AI Planning Systems has been concentrated on planning, and its integration to the processes of execution, monitoring and control. By and large, a sizable amount of research has also been devoted to learning. Goal formulation, another important process and one which according to some AI researchers (e.g. Carb82, Geor87, Wile83) should be included in the whole problem-solving process as an activity prior to planning, has started to generate the interest of a number of researchers in the AI Planning community (e.g. Beau94, Bulo94a,