

# Hazard Analysis for Decentralized Charging Management of Electric Vehicles

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**Abstract:** This paper deals with the hazard analysis in the design of an application for decentralized EVs charging management at all stages of the process, including identification of charging points, selection of the optimum charging station, charging and successful transactions between user and provider, by applying the non-deterministic System-Theoretic Process Analysis (STPA). The aim is to explore the possibilities offered by the proposed systemic model of hazard analysis in a complex system and examine the effectiveness of the implementation in the development of an application, ensuring the safe operation and interactions between the various subsystems and processes in charging management. The identification of accident scenarios and corresponding safety constraints guides safety analysts in the design phase of the application, to prevent losses and costly interventions during actual operation phase.

## 1 INTRODUCTION

### 1.1 Background

Electromobility in a broad sense is becoming an important solution to avoid atmospheric pollution due to significant emissions from the transport sector. The proliferation of electric vehicles requires the corresponding development of charging points for the refuelling of vehicles through their connection to a smart grid, from which electricity will be transferred. To this direction, the development of new technologies as Blockchain, as well as technologies for integrating EVs into a vehicle-to-grid smart energy network, contributes to the possibility of secure and decentralized transactions. More efficient use of existing installed charging points and a dynamic energy trading scheme will play a vital role, both in consolidating electric vehicles, and in upgrading the quality of the services they offer. Therefore, a question that arises to EV users is what the best choice for the intermediate charging of their vehicle is. A proposed solution is the design and development of an application that would help the user to make the best decision regarding the intermediate vehicle charging between offers provided by several charging points, based on a set of predefined criteria set by the user. The idea is the development of a web application to provide a

communication channel between the user and the energy providers, facilitating the configuration of the digital energy market while introducing a new autonomous trading approach for the optimal choice of charging.

The purpose of this paper is to apply a systemic model of hazard analysis in the design of the proposed application, for the recognition and management of losses in all stages of the charging process. The System Theoretic Process Analysis (STPA) method is chosen, which surpasses the traditional hazard analysis techniques, because it recognizes interactions of individual subsystems and is compatible with the characteristics arising from complex systems. The analysis concludes with a list of loss scenarios, based on which possible safety vulnerabilities of the application can be identified.

### 1.2 Hazard Analysis and Accident Prevention

Accidents that occur are the result of technical failures, human error or organizational problems and result in losses, including loss of human life or injury, property damage, environmental pollution, mission failure, financial damage, etc. (Hollnagel, 2004).

The range of the developed accident models is proportional to the variety of accidents recorded, as well as the risk analysis methods derived from the

assumptions of each modelling. The challenge for the analyst is to choose the most appropriate accident model and risk analysis method for a specific case, as each of them offers advantages over the others. The choice is based on understanding the Accident Causation (or Accident Causality), which can be immediate or systemic, a condition necessary for the successful prevention of the accidents and avoidance of the risks related to them.

There are several available research methods in the bibliography, each one being distinguished by its own features and tools and applied in different fields. A typical model classification, considering also their evolution in time, results into three major groups, namely Linear or Sequential Models, Epidemiological Models and Systemic Models (Hollnagel & Goteman, 2014); (Wienen et al. 2017).

Sequential or simple linear models assume that accidents are the culmination of a series of events or circumstances that interact sequentially with each other in a linear manner, and therefore accidents can be avoided by eliminating one of the causes in the linear sequence.

Epidemiological accidents models are based on the study of epidemiological diseases and consider accidents as a combination of "latent" and "active" failures within a system, by analogy with the spread of a disease (Qureshi, 2008).

Traditional Hazard Analysis Methods work well for losses caused by failures in simple systems but are limited in their capability to explain accident causation in the more complex systems. Specifically, they cannot handle with component interaction accidents, systemic factors (affecting all components and barriers), software and software requirements errors, system design errors and indirect or non-linear interactions and complexity. The application of Systems Theory concepts and the development of systemic models was proposed as a solution (Hollnagel, 2010). The new generation of accident modelling thinking has come to recognize that accident models must be non-linear and that accidents can be thought of as coming from combinations of interacting variables that occur in real time. Only through understanding of the combination and interaction between these multiple factors, accidents can actually be understood and prevented. Thus, new approaches to accident modelling have adopted a systemic approach that takes into account the performance of the system as a whole. According to these models an accident occurs when several causal factors (human, technical and environmental) coincidentally appear at a specific time and place (Hollnagel, 2004).

## 2 STAMP ACCIDENT MODEL AND STPA HAZARD ANALYSIS MODEL

### 2.1 STAMP Accident Model

Systems-Theoretic Accident Model and Processes (STAMP) is a relatively new systemic accident model. The STAMP model (Leveson, 2004) gives emphasis to the safety constraints and considers an accident in a complex system not just as the case of failure of some individual components of the system but rather the result of either an external factor or a malfunction within the system which has not been effectively addressed by the control system (Thomas, 2011). The model differentiates from the traditional approaches in considering an accident as a sequence of events and as the result of insufficient control and ineffective application of constraints on the design, development, and operation phase of the system (Ouyang et al., 2010). Safety is viewed as a control problem rather than a component reliability problem. A hierarchical safety control structure is used in STAMP to represent the system and control loops in it (a typical control loop is presented in Figure 1), showing how constraints are enforced. Instead of addressing accidents as the results of an event-chain, they are considered to result from a lack of constraints on behaviour at each level of a socio-technical system. The design of the initial system needs to impose appropriate behavioural constraints to ensure safe operation (Leveson & Thomas, 2018).

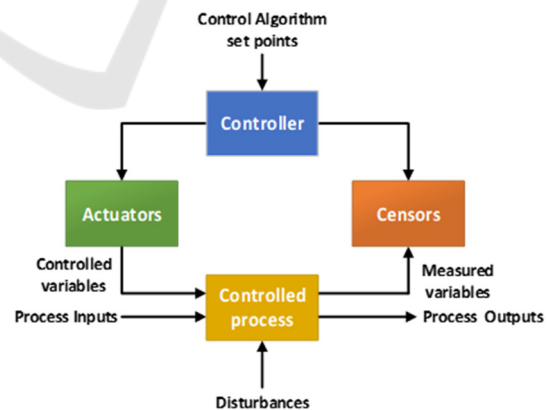


Figure 1: Typical Control Loop.

### 2.2 STPA Hazard Analysis Model

STPA is based on system control theory and not on reliability theory established in most existing risk analysis techniques. The basic principles of STPA are

the following: (Leveson, 2013); (Friedberg et al., 2017); (Horne, 2017):

- The best way to detect accident chances in complex systems is to omit causal factors that are not stochastic or for which no information is available. Probabilistic analysis results may not accurately reflect the actual risks and can be riskily misleading.
- Unlike traditional risk analysis techniques, STPA is stronger in identifying risk causes and hazardous scenarios, especially those related to system design and human behaviour.
- STPA, supporting hierarchical safety control structures, can be used for both technical design and organizational planning.
- STPA can be applied to any emergent system property in the system engineering and product lifecycle, apart from safety.
- Because STPA is a top-down approach, system safety engineering can be used early in the system development process to create high-level security requirements and constraints.

Also, STPA analysis can be integrated into the entire system engineering process resulting in a significant decrease in the cost of engineering for safety (Karatzas et al., 2020).

The objectives of this paper are by using the main principles of this relatively new systemic model in the proposed EV charging management application to:

- Provide guidance to analysts and detect accident scenarios that cover the entire accident process and not just individual components
- Provide the necessary information to guide the design process, rather than requiring design configurations before risk analysis begins. STPA results can then be used to guide architecture, preliminary and detailed design, make decisions in the implementation phase and improve control structure.

### 3 METHODS AND MATERIALS

#### 3.1 Architectural Design of the System

A prerequisite for the hazard analysis of the system, is the understanding of its operation and the interactions between its subsystems, so that to identify inadequate controls within it. Therefore, it is necessary to present the basic architecture and the processes of the electric vehicles within the context of the charging management application. The

proposed application through the use of a mobile phone will provide interaction between the EV driver and Charging Stations (CSs). It will act as a communication channel between the driver, the vehicle control unit (VCU) and the Charging Point Control Unit (CPCU), handling the entire charging process. The proposed web application consists of four consecutive phases. In the **Identification phase**, an electric vehicle interacts with the application and submits a request for charging including information about the region R within it moves, the time horizon T in which plans to charge, and the desired amount of energy e. In the **Bidding phase**, charging stations within region R, sends one or more offers to a Distributed Ledger, responding to the user request. CSs belonging to the R region that are able to respond to the EV user request make one or more bids B. Subsequently, during the **Selection phase**, the optimum station is selected through a series of parameters, such as the price of energy, the costs of travel, the distance between the electric vehicle and the charging station, as well as other variables entered as preferences by the EV user. Finally, during the **Charging Phase**, the electric vehicle communicates directly and approaches the selected station for charging and finalizing the transaction.

The objective function, which will suggest the optimal solution among the charging points alternatives, will be composed of the following parameters: • The cost of energy supply • The cost of moving the electric vehicle from current location at the time of request to each potential charging station, taking into account distance travelled and traffic conditions using GPS data. • The specifications of the vehicles (battery capacity, maximum required charging energy, connection and disconnection times of electric vehicle). • The status of charging stations (availability, charging status, billing status).

#### 3.2 STPA Implementation

STPA is a process consisting of four phases with interconnected activities, thus can be considered as a repetitive process constantly updated with feedback from the evolving system design. The individual phases are briefly presented below.

**Define Purpose of the Analysis:** The definition of the purpose of the analysis is the first step in any risk analysis method. The types of losses that the analysis intends to prevent, the hazards that emerge, and the system boundaries are defined.

**Model the Control Structure:** In the second phase analysts generate the Control Structure which is a schematic representation of the system. A control

structure depicts the system as a set of feedback control loops, including the functional relationships of subsystems and the interactions with each other. The control structure usually starts at a very abstract level and is constantly being developed in depth to incorporate more details about the system.

**Identify Unsafe Control Actions:** In the third phase, the Control Actions (CAs) evolving from the control structure study, are analysed and examined to determine the conditions under which they could lead to losses. Thus, Unsafe Control Actions (UCAs) are identified and recorded, which in turn are used to establish a list of functional requirements and constraints for the system.

**Identify Loss Scenarios:** In the final phase, STPA identifies the reasons that unsafe control actions may occur, and loss scenarios are generated to explain:

- Whether incorrect feedback, inadequate requirements, design errors, component failures and other factors could cause unsafe control actions and ultimately lead to losses.
- How safety control actions can be provided but not followed or performed correctly, resulting in losses.

Once loss scenarios are identified, they can be used to create additional Safety Requirements, leading to updated design proposals, if STPA is used during the design phase (Leveson & Thomas, 2018).

In the present study, the SafetyHAT modelling tool, developed by the US National Transportation Systems Center (Volpe, 2014) is applied for modelling and mapping the different components as defined in the STPA methodology. SafetyHAT is selected due to its simplicity and maturity in relation with other software tools that support STPA analysis e.g., A-STPA (Krauss et al., 2015) and XSTAMPP (Abdulkhaleq et al. 2015).

## 4 STPA RESULTS

The STPA risk analysis examines the risks of the proposed web application during its design phase, regarding the losses that can result from both unsafe control actions in the individual subsystems, as well as from their connection and communication. Specifically, the reported losses may include:

- Malfunction of Individual Components:
  - Blockchain Technology: Privacy issues (e.g. disclosure of the electric vehicle location or energy need).
  - Electric Vehicle Supply Equipment (EVSE): Damaged or modified charging equipment (e.g.,

corrupted Residual Current Device (RCD), a sensitive safety device which automatically shuts off the power supply in a fault event for the protection against electric shock or fire).

- Optimization Algorithm: Errors that lead to non-optimum decisions regarding the selection of the charging station (e.g. non-convergence of the algorithm, errors in algorithm logic).
- Communication between Subsystems:
  - Interoperability: Compatibility between the software subsystems and the charging system (e.g. charging equipment incompatibility, incompatibility between charging equipment and distributed ledger technologies).
  - Data Reliability: Data collected from unrecognized source origin (e.g. unreliable user identification, unreliable timestamp of requests, unreliable estimation of energy demand, unreliable price offered by a provider).

Table 1: Values and objectives of the stakeholders.

Stakeholders	Values	Goals
EV user	Preferences Personal data protection Data reliability Transactions security Equipment integrity	Transfer from point A to point B EV Intermediate Charging Finding the best charging option
Application	Ensuring user privacy Data reliability Secure Transactions	Achieving EV - CS communication Satisfaction of users & energy providers
Charging Stations	Data reliability Secure Transactions Equipment integrity	Energy supply Energy storage Profit

Table 2: System losses.

A/A	Losses	A/A	Losses
L-1	Unable to transfer from A to B (EV)	L-6	Unreliable data
L-2	Damage or destruction of EV equipment	L-7	Unsafe transactions
L-3	Unsuccessful intermediate charging process	L-8	Unable to supply energy (CS)
L-4	Inability to satisfy users & providers	L-9	Damage or destruction of CS equipment
L-5	Loss of sensitive information	L-10	Loss of energy

### 4.1 Define Purpose of the Analysis

The first task of this step is the recognition of losses, which is accomplished through the next three steps.



Step 1: Identification of all stakeholders engaged to the system under examination, which are the Electric vehicle EV user, the Application and the charging station (CS).

Step 2: Recording values and goals of each stakeholder (Table 1).

Step 3: Induction of their values and goals in potential losses (Table 2).

The second task includes the definition and setting of the system boundaries, the recognition of system hazards at system level and their linkage to the losses (Table 3). The logic underneath is represented as:

<Hazard Specification> = <System> & <Unsafe Condition> & <Link to Losses>

The third task is the identification of safety constraints at system level and their linkage to the Hazards, as represented in the system logic sentence:

<System-Level Constraints> = <System> & <Condition to Enforce> & <Link to Hazards>.

Table 3: Hazard specification.

A/A	System – Level Hazards	Losses
H-1	The EV is not sending request	1,3
H-2	The EV enters incorrect data	1,2,6,9
H-3	The application does not receive the request	1,3,4
H-4	The application loses data	5
H-5	The application does not transfer the request	1,3,4
H-6	The CSs do not take the request	1,3,4
H-7	The CSs do not send bids	1,3,4
H-8	The CSs send incorrect data	1,3,4,6,9
H-9	The application does not receive bids	1,3,4
H-10	The application does not provide an optimal choice	3,4,6
H-11	The EV is not commit best bid	1,3,4,6,8
H-12	The CS does not receive the commitment	1,3,4,6,8
H-13	The application does not transfer the commitment & navigation plan	1,3,4,6,8
H-14	The EV does not reach the selected CS	1,3,4,6,8
H-15	The CS does not verify the commitment	1,3,4,6,7,8
H-16	The EV cannot get charged	1,3,4,8
H-17	The EV is not satisfied upon the request	2,3,4,6,7
H-18	The EV is damaged	2,4
H-19	The CS is not satisfied upon the offer	3,4,6,7,10
H-20	The CS is damaged	9,10

Table 4: Control actions and feedback.

Control Action / Feedback	Description
Request	The EV user submit request for charging.
Request Transmission	The Distributed Ledger transmits the request to the CSs.
Request Processing	CSs in the R area test whether they can satisfy it.
Bidding	CSs make one or more bids.
Bid Transmission	Bi is transferred from CS to EV.
Optimum bid Selection	The application sorts the available bids. EV user selects the optimum CS
Commitment	The EV user confirms CS booking by sending a commitment request to the application.
Commitment Transmission	The application forwards the commitment request to the selected CS.
Commitment Verification	The selected CS accepts the commitment request.
Smart Contract	A smart contract is drawn up between the user and the CS.
GPI Navigation	EV user is navigated to the selected CS.
Driving	The EV user drives to the selected CS.
Commitment Confirmation	The commitment and timestamp are confirmed upon EV arrival at the CS.
Connection Confirmation	If both the commitment and the timestamp are valid, CS allows the connection with the EV.
Energy transmission	The energy <i>e</i> is transferred from CS to EV as <i>agreed</i> in the contract.
Charging Completion	CS shuts off the energy supply.
Payment Request	CS sends a request to the EV user to submit the payment.
Payment	The EV user pays the amount agreed in the contract.
Payment Confirmation	The CS confirms that it has received payment from EV.
Release	The CS releases the EV.

For example, for the H-1, the corresponding safety constraint SC-1 is that the EV must send a request.

## 4.2 Control Structure Modelling

The control structure consists of functional Blocks connected by downward arrows representing Control Actions (CAs), as well as upward arrows symbolizing the Feedback). The gradual addition of data to the control structure makes it easier for both the reader to understand and accept the control structure of the system and the analyst himself to avoid hasty decisions and connections. Based on the above, it is understood that each system, no matter how complex or simple, does not have a unique control structure, as it depends on the level of modelling.

The modelling starts at a high level, where it includes the subsystems and the connection between them (Figure 2) and continues at lower levels, in which additional details for the design of the system are additionally incorporated.

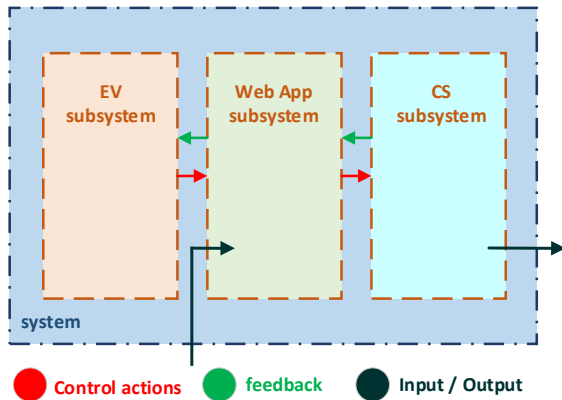


Figure 2: High level control structure with subsystems.

The control actions of the controllers and the corresponding feedback in each control loop is extracted and presented in Table 4.

### 4.3 Recognition of Unsafe Control Actions

During this task the Unsafe Control Actions (UCAs) for each control action are determined, through which subsequently the Controller Constraints are defined. There are four ways in which a Control Action (CA) can become unsafe which are represented by the following phrases (Leveson & Thomas, 2018):

- Control Action Not Provided
- Control Action Provided incorrectly
- Control Action Provided Too early / Too late / Out of order
- Control Action Stopped too soon / Applied too long)

There has been identified a non-exhaustive list of 64 unsafe control actions by following the structure:

<UCA Specification>:<Source> <Type> <Control Action><Context><Link to Hazard>

and are organized into a table by control action, (an example shown in Table 5) which contains an indicative list of CA and UCAs. Controllers constraints, consequently, arise as countermeasures to unsafe control actions.

Table 5: Unsafe Control Actions.

Control Action - CA	Not Provided	Provided incorrectly	Provided Too early / too late / Out of order	Stopped too soon / Applied too long
<b>Request</b>	[UCA -1]: The application does not secure the user's personal data [L4, L5, L6]	[UCA -5]: The user does not submit the various parameters correctly [L1, L2, L3, L8]	[UCA -8]: The user sends the request too late [L1, L4, L8]	[UCA -9]: User stopped the submission process early and the request was not sent to the application [L1, L3, L4]
<b>Bidding</b>	[UCA -15]: The CSs does not process the request [L3, L4, L8]	[UCA -17]: The CSs does not correctly estimate the available energy capacity, availability or compatibility with EV. [L1, L2, L3, L4, L8, L9, L10]	[UCA -19]: The CSs submit bids before checking available energy capacity, availability or compatibility [L1, L2, L3, L4, L8, L9, L10]	[UCA -22]: The CSs submit bids with excess delay [L3, L4]
<b>Selection</b>	[UCA -24]: The application algorithm does not send the bids hierarchical list [L1, L4]	[UCA -26]: The user does not select correctly from the bids list [L1, L3, L4]	[UCA -28]: The user selects too early without anticipating all bids from CSs [L3, L4]	[UCA -31]: User stopped the process early and no CS was selected [L3, L4]
<b>Payment</b>	[UCA -56]: User does not pay [L4, L7]	[UCA -57]: The user does not deposit the correct payment amount [L4, L7]	[UCA -59]: The user pays without completing the charge [L1, L7, L8, L10]	N/A

Table 6: Loss Scenarios.

Unsafe Control Action - UCA	Loss Scenario - LS	Loss Scenario Type
[UCA-1]: The application does not secure the user's personal data	[LS-1]: The Distributed Ledger of the application receives the EV user's personal data correctly but manages it incorrectly, disrespecting the EV user privacy	The auditor receives correct feedback / information, but misinterprets or ignores it

#### 4.4 Detection of Loss Scenarios

At fourth step the loss scenarios are defined, by answering (Leveson & Thomas, 2018):

- (a) Why do unsafe controls occur?
- (b) Why are the control actions performed improperly or not at all, leading to risks?

The process that the feedback is detected (e.g. with sensors) and control actions are performed (e.g. with actuators) is added through the reformation of the control structure (Figure 3).

Based on this structure, scenarios leading to unsafe control actions are initially identified, indicatively depicted in Table 6.

This type of script can be created starting with a UCA and working backwards to explain what might cause the controller to provide (or not provide) this control action. To create scenarios that include UCAs, the causal factors (CFs) responsible for the unsafe behaviour of the controller that triggered the UCA must be considered. In this process, CFs are the main reasons that can lead control actions to become UCAs. Following the CFs identification, and in order to provide information on how to reduce the CF-related risk associated with UCAs, the next step is to identify appropriate “safeguards” for each CF. The

safeguards are actions required to either prevent the causal scenario from occurring or reduce the impact on the scenarios perceived by the relevant CF (Karatzas et al., 2020).

#### 5 RESULTS, DISCUSSION AND CONCLUSION

The results of hazard analysis are the scenarios losses which can be used to develop additional safety requirements, define new safety constraints or improve existing ones, and guide systems redesign decisions before the actual development of the proposed application. Through STPA implementation, general observations have been made:

- The STPA steps facilitates the work of the analysts without strong experience in system design.
- The control structure scheme contributes to a better understanding of the system functional characteristics and consequently to the identification, visualization and confrontation of operational performance gaps.

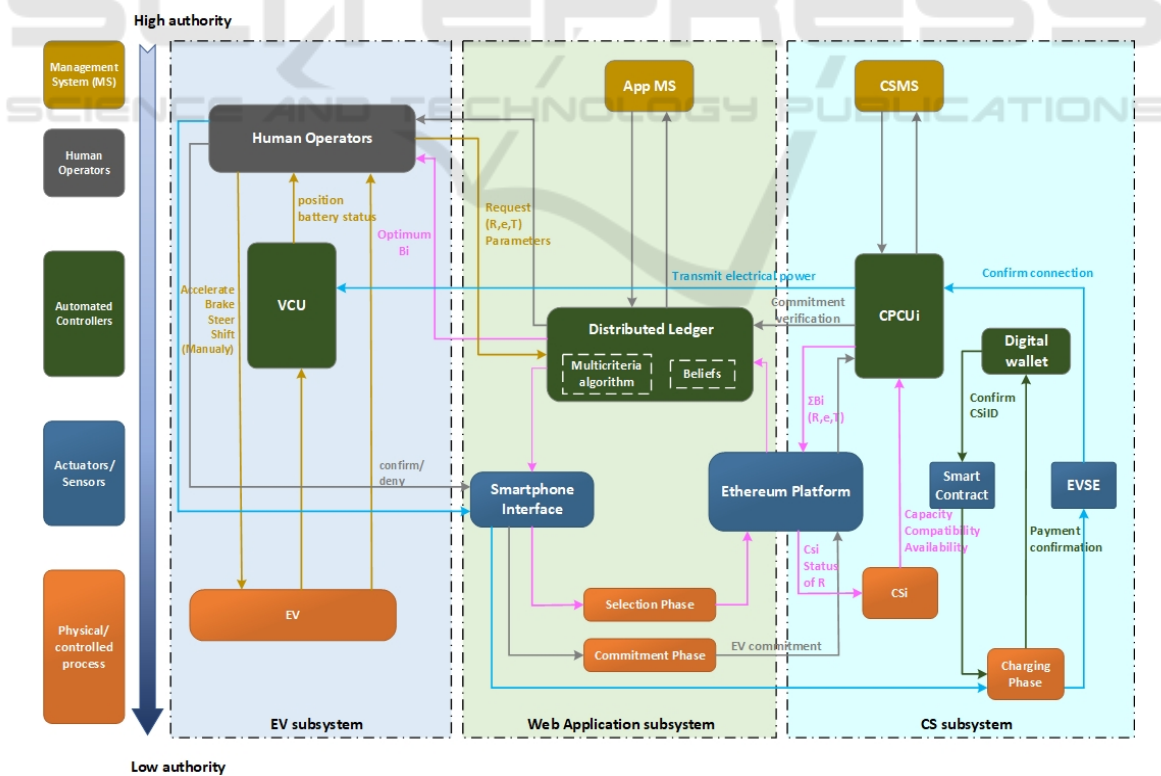


Figure 3: Control structure with actuators and sensors.

- The gradual integration of information into the control structure allows the smooth transition of the reasoning process from an abstract schematic representation to more detailed ones, avoiding hasty and possibly unfounded conclusions of analysts.
- The schematic representation of the control structure of complex systems, as well as the recording of the basic concepts for each step due to the large extent of the tables, can sometimes be challenging. This complexity issues are mitigated with the use of software tools such as SafetyHAT.

Since the STPA method focuses on defining system-level hazards, while there is no practical or reliable way to assess each of the reported UCAs or safeguards. The major advantage is that having the whole system view can help in the hazard assessment process when attempting to comprehend and evaluate the efficiency of control measures. This mechanism is useful in understanding where gaps in current operational structures may exist and in implementing targeted strategies through standard approaches of risk assessment. This point is reinforced by the fact that while there is potential for evolution in risk management frameworks that place higher stress on risk controls, such operational hazard assessment methods in providing these controls still does not exist (Karatzas et al., 2020).

The suggested method encourages analysts to begin by studying an abstract control structure, which is gradually redefined by incorporating more information, such as the input of actuators and sensors into each control loop, it is expected that with each deepening the analysis improves. The analysis conducted in this paper are basic prerequisites for the redesign of the proposed charging application, in order to correct the identified blurred points and avoid losses during its actual development.

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