Janusz Górski (Ed.)

Computer Safety, Reliability, and Security

25th International Conference, SAFECOMP 2006 Gdansk, Poland, September 2006 Proceedings



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25th International Conference, SAFECOMP 2006 Gdansk, Poland, September 27-29, 2006 Proceedings



Volume Editor

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Library of Congress Control Number: 2006932795

CR Subject Classification (1998): D.1-4, E.4, C.3, F.3, K.6.5

LNCS Sublibrary: SL 2 – Programming and Software Engineering

ISSN

0302-9743

ISBN-10

3-540-45762-3 Springer Berlin Heidelberg New York

ISBN-13

978-3-540-45762-6 Springer Berlin Heidelberg New York

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Typesetting: Camera-ready by author, data conversion by Scientific Publishing Services, Chennai, India Printed on acid-free paper SPIN: 11875567 06/3142 5 4 3 2 1 0

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Preface

Welcome to SAFECOMP 2006, the 25th International Conference on Computer Safety, Security and Reliability, held in Gdansk, Poland. Since it was established in 1979 by the European Workshop on Industrial Computer Systems, Technical Committee 7 on Safety, Reliability and Security (EWICS TC7), SAFECOMP has continuously contributed to the progress in high integrity applications of information technologies. The conference focuses on the state of the art, experience and new trends in the areas of safety, security and reliability of critical IT systems and applications and serves as a platform for knowledge and technology transfer for researchers, industry (suppliers, operators, users), regulators and certifiers of such systems. SAFECOMP provides ample opportunity to exchange insights and experiences on emerging methods, approaches and practical solutions to safety, security and reliability problems across the borders of different application domains and technologies.

The SAFECOMP 2006 program reflected in this book included 32 papers selected from 101 submissions of full texts. The submissions came from authors representing 26 different countries from Europe, Asia, and North and South America. The 32 accepted papers were prepared by experts representing 14 different countries. The above data confirm the broad and increasing interest in SAFECOMP and the topics addressed.

The program was supplemented by three keynote presentations by outstanding invited experts (not included in this book). The keynotes focused on interdisciplinary aspects of dependability of computer systems, practical aspects of application of safety standards and new challenges of information security research and development.

Preparation of the SAFECOMP 2006 program was a long and intensive process. Its success is the result of the hard work, involvement and support of the International Program Committee, the external reviewers, the keynote speakers, and most of all, the authors who submitted numerous excellent contributions. Selecting from them was by no means an easy task and in many cases some very good papers could not be accepted because of the program constraints.

I would like to thank all those who contributed to the preparation of the SAFECOMP 2006 program for their competence, dedication and sustainable support. I would also like to thank my colleagues from the Information Assurance Group of the Department of Software Engineering of Gdansk University of Technology for their organizational support. Special thanks are due to the National Organizing Committee, for its involvement in the preparation of the conference.

The next conference, SAFECOMP 2007, will take place in Nuremberg, Germany, and in the name of the organizers I am extending to you the invitation to

VI Preface

contribute to and attend this important event in the field of Computer Safety, Reliability and Security.

July 2006 Janusz Górski

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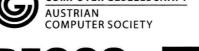
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Table of Contents

Systems of Systems	
System of Systems Hazard Analysis Using Simulation and Machine Learning	1
Through the Description of Attacks: A Multidimensional View Igor Nai Fovino, Marcelo Masera	15
On Certain Behavior of Scale-Free Networks Under Malicious Attacks	29
Security and Survivability Analysis	
Verifying a Chipcard-Based Biometric Identification Protocol in VSE Lassaad Cheikhrouhou, Georg Rock, Werner Stephan, Matthias Schwan, Gunter Lassmann	42
Exploring Resilience Towards Risks in eOperations in the Oil and Gas Industry	57
Computer System Survivability Modelling by Using Stochastic Activity Network	71
Nuclear Safety and Application of Standards	
Software Safety Lifecycles and the Methods of a Programmable Electronic Safety System for a Nuclear Power Plant	85
Regulatory Software Configuration Management System Design I-Hsin Chou, Chin-Feng Fan	99

Gaining Confidence in the Software Development Process Using Expert Systems Mario Brito, John May	113
Formal Approaches	
Retrenchment, and the Generation of Fault Trees for Static, Dynamic and Cyclic Systems	127
Stepwise Development of Secure Systems Thomas Santen	142
Component-Based Hazard Analysis: Optimal Designs, Product Lines, and Online-Reconfiguration	156
Networks Dependability	
New VoIP Traffic Security Scheme with Digital Watermarking	170
Towards Filtering and Alerting Rule Rewriting on Single-Component Policies	182
Using Group Overlapping to Protect Server from Attack in Grid Computing Byungryong Kim	195
Coping with Change and Mobility	
The Role of Situation Awareness in Assuring Safety of Autonomous Vehicles	205
Demonstration of Safety in Healthcare Organisations	219
Healthcare System Architecture, Economic Value, and Policy Models in Large-Scale Wireless Sensor Networks	233

Safety Analysis and Assessment	
Assessment of Hazard Identification Methods for the Automotive Domain	247
A Tool for Databus Safety Analysis Using Fault Injection	261
Towards a Unified Model-Based Safety Assessment Thomas Peikenkamp, Antonella Cavallo, Laura Valacca, Eckard Böde, Matthias Pretzer, E. Moritz Hahn	275
Poster Session	
Reliability Analysis of Resilient Packet Rings	289
Experiences with the Design of a Run-Time Check	302
Development of an Integrated, Risk-Based Platform for Information and E-Services Security	316
Using Agent-Based Modelling Approaches to Support the Development of Safety Policy for Systems of Systems	330
Verification of Automatic Train Protection Systems with RTCP-Nets	344
6th FP Integrated Project DECOS	
Checking SCADE Models for Correct Usage of Physical Units	358
Validation and Certification of Safety-Critical Embedded Systems - The DECOS Test Bench	372

XIV Table of Contents

Encapsulating Application Subsystems Using the DECOS Core OS Martin Schlager, Wolfgang Herzner, Andreas Wolf, Oliver Gründonner, Maximilian Rosenblattl, Erwin Erkinger	386
Modelling	
Modeling the Railway Control Domain Rigorously with a UML 2.0 Profile	398
Access Control Coherence of Information Systems Based on Security Constraints	412
Automatic Test Data Generation by Multi-objective Optimisation Norbert Oster, Francesca Saglietti	426
Author Index	439

System of Systems Hazard Analysis Using Simulation and Machine Learning

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Abstract. In the operation of safety-critical systems, the sequences by which failures can lead to accidents can be many and complex. This is particularly true for the emerging class of systems known as systems of systems, as they are composed of many distributed, heterogenous and autonomous components. Performing hazard analysis on such systems is challenging, in part because it is difficult to know in advance which of the many observable or measurable features of the system are important for maintaining system safety. Hence there is a need for effective techniques to find causal relationships within these systems. This paper explores the use of machine learning techniques to extract potential causal relationships from simulation models. This is illustrated with a case study of a military system of systems.

1 Introduction

Large-scale military and transport Systems of Systems (SoS) present many challenges for safety. The term 'SoS' is somewhat controversial — attempts at definitions can be found in [1] and [2]. It is easy, however, to identify uncontroversial examples, Air Traffic Control and Network Centric Warfare being the most prominent. These examples feature mobile components distributed over large areas, such as regions, counties or entire continents. Their components frequently interact with each other in an ad-hoc fashion, and have the potential to cause large-scale destruction and injury.

It follows that for SoS that are being designed and procured now, safety has a high priority. This is particularly true for SoS incorporating new kinds of autonomous component systems, such as Unmanned Aerial Vehicles (UAVs).

This paper is concerned with one aspect of the safety process for SoS, specifically hazard analysis. This is an important first step in any risk-based safety process. Unfortunately, performing hazard analysis on SoS is not easy. Quite apart from the novelty of these systems, and the commensurate lack of examples to work from, the characteristics of SoS raise serious difficulties. For example, ad hoc communications mean that information errors can propagate through the system by many, and unpredictable, routes.

The following section describes the problems faced in SoS hazard analysis, then section 3 proposes multi-agent simulation as a possible solution. An approach to performing hazard analysis, using simulation combined with machine learning, is outlined

in section 4, and the results of a case study are presented in section 5. Section 6 compares the work with existing applications of simulation in safety and section 7 discusses the issue of model fidelity.

2 The Problem of SoS Hazard Analysis

A definition of the term 'SoS hazard' was given by the authors in [3] as "Condition of an SoS configuration, physical or otherwise, that can lead to an accident." It follows that SoS hazard analysis is the process of finding those conditions that can lead to accidents.

The problems faced by safety analysts when attempting to perform hazard analysis on SoS fall into two key categories: the immediate issue of failure effect propagation, and the more pernicious category of 'System Accidents'. It has been noted by Kelly and Wilkinson, in [4], that these problems are present in conventional systems, too, but the characteristics of SoS exacerbate them.

2.1 Deriving the Effects of a Failure

In a conventional system, such as a single vehicle or a chemical plant, the system boundary is well-defined and the components within that boundary can be enumerated. When a safety analyst postulates some failure of a component, the effect of that failure can be propagated through the system to reveal whether or not the failure results in a hazard. This is not always easy, because of the complexity of possible interactions and variability of system state, hence the need for systematic analysis techniques, automated analysis tools, and system designs that minimise possible interactions. To make the task more tractable, most existing hazard analysis techniques (such as FFA and HAZOP) deal with only a single failure at a time; coincident failures are rarely considered.

In an SoS, this problem is considerably worse. The system boundary is not well defined, and the set of entities within that boundary can vary over time, either as part of normal operation (a new aircraft enters a controlled airspace region) or as part of evolutionary development (a military unit receives a new air-defence system). Conventional tactics to minimise interactions may be ineffective, because the system consists of component entities that are individually mobile. In some cases, particularly military systems, the entities may be designed (for performance purposes) to form ad-hoc groupings amongst themselves. Conventional techniques may be inadequate for determining whether or not some failure in some entity is hazardous in the context of the SoS as a whole.

2.2 System Accidents

Perrow, in [5], discusses what he calls 'normal accidents' in the context of complex systems. His 'Normal Accident Theory' holds that any complex, tightly-coupled system has the potential for catastrophic failure stemming from simultaneous minor failures. Similarly, Leveson, in [6] notes that many accidents have multiple necessary causes. In such cases it follows that an investigation of any one cause *prior to the accident* (i.e. without the benefit of hindsight) would not have shown the accident to be plausible.