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Robinson, Charles; Akerkar, Rajendra; Aouada, Djamila; Bagnato, Alessandra; Györffi, Miklós; Henshaw , Michael; Larsen, Peter Gorm; Luz , Carles Hernandez; Macedo, Hugo Daniel; Mackay, Adam

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Cyber-physical Systems, supported by the Next Computing Paradigm, will draw upon the continued research integration advances for the development of future large-scale safety-critical systems, involving many technology and influencer domains. Novel approaches and tools will be required to tackle the increasingly multi-dimensional challenges between the communities to benefit these future systems, especially their adaptability to new technologies.

*Coordinated by CHARLES ROBINSON, with representation of contributing communities by Rajendra Akerkar (Big Data), Djamila Aouada (Metaverse), Alessandra Bagnato (Functional Properties), Miklós Györffi (*Market Influencers*), Michael Henshaw (*Systems of Systems*), Peter Gorm Larsen (Digital Twin), Carles Hernandez Luz (Computing), Adam Mackay (AI), Hugo Daniel Macedo (Industrial Process), Claudio Pastrone (Functional Properties), Paul Pop (IoT), Peter Popov (Real-time Safety & Security), Claudio Sassanelli (Industrial Process), Marcus Völp (Digital Twin), Thorsten Weyer (Systems).* *

* For the list of contributors, see the acknowledgements

Today, there are many technology domains involved to the creation of large-scale safety-critical systems, which are used in sectors including transport, health, robotics, manufacturing and, in the longer term, will be in the home, where miniaturization will play a role. These applications have the encompassing term of cyber-physical systems (CPS), providing integrations of many contributing technologies domains. Mastery of the digital to real world boundary opens up increasingly new means of value generation by CPS, which will be greatly aided by NCP infrastructure with computing as a backbone, already encompassing great advances in connectivity (including IoT, Big Data), pattern recognition and decision making (AI). At the same time, there the integration concerns typical in the realm of CPS, including certified dependability, energy management and real-time capacities, will become pervasive for NCP and tomorrow's systems.

In this article we explain that research and engineering for future CPS needs a centre of gravity in order to draw the associated communities closer together. This will provide common goals around which technical advances can be aligned. Overviews of the domains involved are provided in this article, with examples of their relevance in the creation of CPS and to some common challenges.

Advancements of aggregating technologies are multi-dimensional challenges, representing many influencing dependencies from many contributing technology domains, especially at higher levels where the whole system product is drawn together. This means that, to make good progress, Europe will require new forms of coordination in order to orchestrate research and to capitalize on lessons learned related to the cumulative advances between the communities.

Key insights

- Large-scale safety-critical systems, encompass a common perspective of what is classed as cyber-physical systems[1]. These CPS are physically interactive (high certification obligation) and increasingly collaborative (task sharing). They involve many contributor and influencer technology domains in their creation, who each tend to make advances in isolation. *Creating the technical bridges between these domains to channel technology development is essential for these future systems.*
- The scope for bridging the technology domains is wide and they need technical interfaces around which to align. Discussions have indicated self-alignment of these groups is needed through *centres of gravity, particularly on the topic of real-time safe and secure automation*.
- *A new form of research coordination is necessary to direct cumulative integrated* developments from the stakeholder communities. CPS projects should provide technical advances on researcher supports in addition to system technologies.
- The development of CPS requires a holistic approach, guided by target products, that brings together a wide range of disciplines. These should include not only functional, system and enabling technologies, but also the fields of psychology, sociology and ethnography, among others.

- Aggregating, or system technologies, have different and much longer industrial uptake lifecycles than part specific or component technologies. Research programmes mostly treat them the same and both technology types suffer. A *dedicated team* from the research programmes *would be very beneficial for investigating and implementing new technical capacities for multi-stakeholder complex group research.*
- CPS represent a significant part of national infrastructures and where lie some of the most devious and complex research integration challenges to be solved. Infrastructure represent an important means of market capture and thus sovereignty, whilst system architecture is a determining factor of technology uptake and the green transition. National funding for infrastructure stability and adaptability, particularly investing in system thinking/interdisciplinarity will play a critical role for Europe on the world stage. This is not only in terms of economic stability and productivity but also moving to a culture that ensures also a functioning natural world for future generations.
- The rapid advancement of Artificial Intelligence (AI) technologies presents both opportunities and challenges for future CPS. AI has the potential to significantly enhance the capabilities, autonomy and adaptability of CPS. However, to maintain the necessary levels of safety, security and real-time performance, it is critical that AI is developed and applied in CPS in a robust, explainable and trustworthy manner. This will require close collaboration between the AI and CPS engineering communities to establish shared principles, methodologies and standards for the integration of AI in safety-critical systems. Proper governance frameworks and validation approaches for AI in CPS must be a key focus area going forward.

Introduction and new cross-domain development approaches

In order to manage large complex problems, people break them down into parts. It is for this reason that, from the technology point of view, there are many contributing and influencing domains involved in the creation of future safety-critical products. Of course, the parts subsequently need to be assembled together in order to address the initial complex problem. For the same reasons, the various technological contributions for future large-scale safety-critical systems require layered aggregation in order to achieve these physically interactive and collaborating systems.

This means that there are significant, multi-dimensional influences across CPS communities, which contribute to our ability to transfer technology to industry. It also poses challenges for assuring CPS, which should be based on sound methods of justifying that a CPS is fit for purpose and that all risks of using it are adequately addressed, notwithstanding the complexity and the heterogeneity of the CPS components and of the communities of stakeholders involved. For instance, assurance alone historically has relied heavily on *expert judgement* and this worked. Recently the complexity of the CPS that we try to assure as safe has increased very dramatically. In these circumstances, expert judgement based on previous experience alone becomes problematic. The current trend (see Assurance 2.0 [2]) is that we need new methods for building

assurance cases which should rely on formal methods and also on *automation* to process complex arguments on which assurance is built.

For the purposes of this article, we take CPS in the context of an application; that is to say, the term could be replaced directly with an example CPS application such as railway transport, an autonomous vehicle, or satellite constellations. In this framing, CPS therefore represent *physically interactive and collaborating systems* that are present in many domains including transport, health and manufacturing. (For an in-depth definition of CPS, see, for instance, the HiPEAC Vision article "Defining cyber-physical systems: Large-scale safety-critical systems").

The technology domains involved in CPS, discussed in the subsequent section, range from providers of a) functional properties including sensing, physical action, communication, energy provision, processing and coordinated collaboration to b) system-level engineering including properties like safety and performance specifications, managing customer requirements, architecting, system verification and validation, mechanical engineering and control engineering. There are technology support domains providing c) enabling technology domains like the Internet of Things (IoT), Systems of Systems, Big Data, Artificial Intelligence/machine learning and High-Performance Computing. Finally, there are the influencing domains from d) the production environment, with enterprise processes and product line, and e) the market, such as regulation and current and future needs of society.

These technology domains have tended to transfer technology as a one-to-one mapping with products. However, to respond to the challenges of future CPS and to enhance technology transfer, they will need to take relations with the other contributing domain communities increasingly into account. While the challenges and importance of advancing aggregation techniques are discussed later, there also needs to be a common focal point from which one domain community can interact with any of the other domain communities. This point should provide a common interest based on the physical challenges of these systems. *Discussions have proposed this centre of gravity to be real-time, safe and secure automation* of CPS development and operation.

Research on CPS should seek to enhance the interrelations and automation of these three dependability properties, i.e., real-time, safety and security. They are goals that must be achieved at a global level when all the technologies are combined. As an example, each piece of hardware has an impact on the energy consumption of the whole system. Similarly, individual software and hardware components can jeopardize safety if they fail naturally or due to a security breach. These goals can also be variable and related to environmental conditions, such as a train reducing its speed (performance) in response to heavy showers (to maintain safety).

Hence for technologies to be accepted in these systems, they must guarantee these dependability properties, i.e., they must comply with the safety and security constraints of a product in the intended operational environment and not violate the constraints on real-time responses. This means that the easier it is to couple your technology with these system constraints (through automation), the easier it becomes to adjust it to the system (or adjust the system for new technologies).

It is usually the case that, in order to add new technologies to a CPS, the whole system requires re-certification. This can be prohibitively expensive without sufficient automated information about the impact of the new technologies on these dependability properties – and particularly the interrelations of those properties. Take systems certified, for instance, against an extreme earthquake occurring every 1000 years (for safety), such as a nuclear plant: in this case, the safety experts currently would prefer no new technologies or patches for security to be added to these systems due to the certification costs.

As a result, historically, interrelations between system properties have been limited to minimize complexity, but the current need for adaptability (to new technologies, to environmental or internal changes) requires this design mindset to be readdressed. So in summary, a centre of gravity, as shown in Figure 1, will provide a useful point to channel us towards more impactful research advances for these future large-scale safety-critical systems.
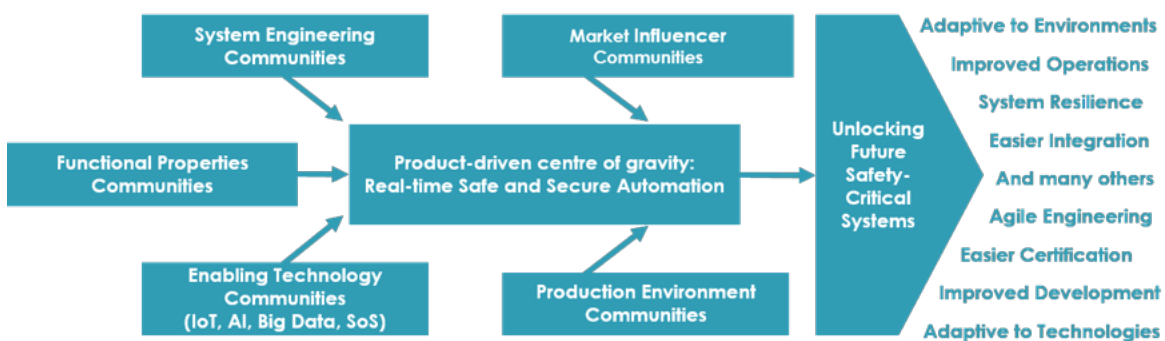

Figure 1: The stakeholder communities for creating CPS.

While the management of trade-offs between the system properties of performance, safety and security is an established skill in system development, it still remains very much a manual and qualitative process and one that is based on prior experience. It remains to this day very much a bottleneck and is holding back the domain communities contributing to CPS development from ensuring that advances in areas such as trust in artificial intelligence (AI) are applied to CPS.

System-level engineering for CPS is therefore in need of transformative automation. Fortunately, automation between system-level dependability properties can rely on a number of decades of research in techniques [3], some of which have already been applied in industry but are generally in need of new approaches for technology transfer. Such approaches are included in the coordination suggestions for research orchestration described later in this article. Looking forward, AI itself could potentially be leveraged to enable more automated trade-off management and assurance processes for CPS. Machine learning techniques could be applied to analyze complex system interrelations, identify optimal trade-off configurations, and generate assurance cases based on operational data. However, realizing this potential will require significant research and collaboration between the AI, CPS engineering, and assurance communities to develop robust, explainable, and trustworthy AI methodologies suitable for safety-critical applications.

Of course, current pressures for industry to find advanced solutions for managing system property trade-offs are also driving the search for automated coupling. As examples of some initiatives, the UK Research Institute in Trustworthy Interconnected Cyber Physical Systems

(RITICS) [4] involves dozens of UK universities and industrial collaborators. Topics include safety, security and autonomous systems. Relating to autonomous vehicles, the Intel Research Collaborative Institute of Safety of Autonomous Cars (ICRI-SAVe [5]), deserves a mention as a vibrant community. Likewise, the VVM project (Verification and Validation Methods, https://www.vvm-projekt.de/) built up a sizeable research community addressing the challenges of "safety verification of automated vehicles … on driving functions up to full automation of vehicles (SAE Level 4 and 5)".

Many industries are actively looking for solutions to manage the performance, safety and security of their products, including large enterprise like Siemens, Thales and AVL, who have been forming combined safety-security teams. The challenge also affects small and medium-sized enterprises (SMEs) in their products and services. This recent momentum has visibility, for example, in the Ada and IEEE conferences, in the IET code of practice on cybersecurity and safety [6], in recent large research collaborations including MERgE [7], SeSaMo [8] and AQUAS [9], and in co-engineering discussions.

Overview of stakeholder domain communities for creating and advancing CPS

We now provide overviews of the five communities, indicated in the previous figure, which are involved in creating CPS. We give descriptions and examples of their relevance to CPS as well as their relation to cross-community challenges for future development. These include embedded computing as a CPS backbone, system decentralization and decomposability, and physical collaborations with people.

Functional-property domains

CPS functional properties must address aspects that cover sensing, actuation, communication, energy provision, processing and coordinated collaboration. Such properties are key characteristics of these systems, with actors in specific communities researching and developing the different components.

The relevance of functional properties becomes more evident when considering novel and innovative advanced applications that are being progressively adopted in several large-scale, safety-critical domains, such as industrial automation, transportation, smart cities, critical infrastructures, space, etc. Some examples can be found in H2020 projects such as CPSwarm [10], or Chips Joint Undertaking such as AIDOaRT project [11] or Horizon Europe such as MYRTUS Project [12] and other CPS cluster initiatives.

Industry-driven needs and the well-established nature of general research communities in the CPS domain mean that it is feasible to envision projects that might prototype concepts such as swarms of unmanned aerial vehicles and rovers supporting safety and security operations; swarm of unmanned aerial vehicles and possibly ground robots supporting critical infrastructure management; swarms of automated ground robots that collaboratively support humans in logistic operations within a smart warehouse or in last mile delivery operations within a smart city; or enhanced and dynamic platooning applications for autonomous freight vehicles.

Currently, the development of such applications cannot leverage a simple plug-and-play integration of the various technologies entailed, given the complexity of managing teams of systems and humans in evolving and dynamic scenarios with emergent properties.

Therefore, to properly combine and integrate the different technology building blocks required, the various 'functional properties communities' have to be properly engaged. Experts from the functional property communities will need to work with other actors with collaborative systems competence. Moreover, while the increased adoption of CPS has resulted in the maturation of solutions for CPS development, a single consistent science for future CPS has not yet been consolidated. Few functional properties community members have already started working alongside other communities on a connective framework e.g., using modelling, design/development tools and methodologies, deployment solutions, monitoring and controlling solutions for large-scale challenges. In this context, model-centric approaches have clear relevance for facilitating collaboration between experts from different sectors and thus enabling the definition, composition, verification and simulation of collaborative, autonomous CPS.

For these reasons, it is important for future CPS to be considered not only from the technology perspective but also as an application domain where the technology of the functional property communities plays a role for aggregation of CPS-related research. To promote this, closer and wider collaboration is needed within the communities, along with new research initiatives. Understanding the nature of this aggregation from the bottom up and top down is important for driving the communities towards much-needed technology advances. The resulting collaboration plays a very important role in finding solutions to the bottlenecks that currently prevent CPS from having greater impact on society; such solutions would also promote market uptake, open new markets and optimize the use of resources in the various industry sectors.

These communities have many cross-cutting challenges for future CPS. Embedded computing will evolve significantly, playing an essential enabling role for functional properties. For instance, the need to use specific sensors on a CPS and to timely process the relevant raw data onboard will need increased computational power. However, energy limitations introduce other constraints; only a holistic vision of CPS can help drive research initiatives. Moreover, the envisioned combination of 5G, beyond 5G and Smart Networks and Services/6G technologies with distributed and high-performance computing will pave the way towards a deep integration of future CPS in the computing continuum, where there are also direct links with enabling technologies, discussed presently, such as IoT and Systems of Systems. In relation to decentralization and decomposability, with distributed intelligence and emergent properties, an example research context would aim to solve/work on delays in physical, computing and actuation timing. This requires model design and simulation approaches to capture the full heterogeneity of the system and its contributing communities. Physical interaction with people requires a system to have high fidelity knowledge of its environment and its physical dynamics. This requires the technologies of the functional properties community, which in turn need integration with the safety and security measures set by the system-engineering community. In the future, achieving greater energy efficiency will pose an additional challenge for CPS. The evolution of CPS must consider their overall energy footprint to minimize their environmental impact. To achieve this goal, all aspects, components, and technologies related to CPS need to be carefully considered. This effort will involve traceability among the contributing communities.

It is therefore evident that the best way to advance future CPS is to further support integration and aggregation approaches for community collaboration.

Systems-engineering domains

The development of CPS requires a holistic development approach that brings together a wide range of disciplines. This includes the typical systems engineering disciplines, such as requirements engineering, architectural design, implementation and quality assurance including system-wide responsiveness, safety and security. The disciplines of this community are important in terms of both the CPS in general and individual systems engineering sub-processes, such as mechanical engineering, control theory, electrical engineering and software engineering.

In almost all of our application-driven future scenarios, like in autonomous driving and Industry 4.0, CPS must be able to fulfill their purpose to a large extent without intervention of human users [13]. According to the Society of Automotive Engineers (SAE) taxonomy for autonomous driving, we refer to such systems as highly automated or fully automated CPS [13]. Already today and even more so in the future, systems engineering is one of the core competence fields for building such highly automated or fully automated CPS.

In the case of highly automated CPS, it is necessary to have a more comprehensive understanding of the term 'functional safety'. In contrast to the understanding of the term by the ISO 26262 standard, which essentially considers the malfunction of system components, highly automated CPS require an analysis of the interaction of a) the functionality of the CPS under consideration with b) its context (e.g. other CPS in collaboration). This analysis serves to detect possible safety threats resulting from the interaction between system functions and contextual conditions, such as the interaction between the autonomous driving function of a vehicle and the failure of the signalling system at an automated road intersection. This new understanding of functional analysis, which goes far beyond the requirements of ISO 26262, is the subject of the SOTIF standard [14].

It is important to understand that security threats can also arise from inadequate or non-compliant cyber security. Relevant cyber security standards, such as ISO 21434 [15] in the automotive sector, have recently attempted to take this into account. Corresponding measures to mitigate such security issues then refer to the establishment of appropriate measures and technologies to increase the cyber security of the CPS to an adequate level. It becomes evident that systems engineering research in the CPS field needs to take holistic, tightly integrated approaches for safety and cyber security engineering that consider both the engineering of the CPS and the management of its operation.

These threats to safety must be identified during the development process and mitigated, e.g. by specifying suitable requirements or safety devices (safety monitors) which bring the CPS to a safe state should CPS fail to behave according to requirements or expectations. Since CPS often monitor and control technical or physical processes, control theory is a discipline of great importance in the development of such systems. In this context, the concepts of monitoring and controlling technical/physical processes are reflected in various artefacts of systems engineering. For instance, the requirements originated from the way the processes should be controlled, as

well as from decisions made about the design of the necessary sensors and actuators or even about the design of the algorithm for the computational processes of the feedback system.

In order to be able to develop such complex technical systems consisting of software and hardware, seamless systems engineering processes are required, establishing techniques, methods and tools for challenges such as the following examples. Since CPS in many fields of application work together in dynamically formed networks at runtime to pursue higher-level goals, possible collaboration structures must be identified and analysed in requirements engineering. For example, in the development of autonomous vehicles, the collaboration structures in which these vehicles must operate should be taken into account. Examples of such structures might be vehicle convoys to optimize the flow of traffic or at automated intersections to ensure safe crossing of the intersection, even with high traffic volumes and in complex traffic situations. In collaborative CPS, the issue of coordinated decentralized monitoring and control of technical/physical processes is added; an example of this is the coordinated acceleration or deceleration of the various vehicles within a convoy of vehicles.

In the case of highly automated systems, the involvement of the human user is required in (a few) defined situations to ensure that the system is able to fulfil its purpose of ensuring safe operation. The integration of the human user must be effective, i.e. the user interface of these systems must be designed in such a way that the human user is able to perform the necessary tasks according to the intention, as free from errors as possible and within the existing time restrictions. One might think here of the example of autonomous road traffic, where highly automated systems require the driver to take control of the vehicle when a critical driving situation occurs.

Enabling-technology domains

Internet of Things (IoT)

The Internet of Things community developed around the goal of providing a means for all devices to be globally connected via the internet. The name 'Internet of Things' was used in 1999 by Kevin Ashton during a presentation to his higher management at Procter & Gamble. He described IoT as a technology that connected several devices with the help of RFID tags (radio frequency identification) for supply-chain management [16]. In 2008 the first international conference on IoT took place in Switzerland, discussing RFID, short-range wireless communications, and sensor networks; today, these topics continue to represent the major technological research domain for advancing the IoT, gathering information about the real world that can then be made useful in some way [17].

Since 2010 it has been normal for many different devices to be in our homes to be connected to the internet. Connected devices are used extensively in the consumer domain. In 2015, to support advancement of IoT for industry, the European Commission created the Alliance for Internet of Things Innovation (AIOTI). Applying IoT to the industrial environment has been termed industrial IoT, or IIoT, and has the goal of optimizing production value while considering the many additional challenges related to safety, security and performance. IIoT technologies support interconnectivity with the internet in the context of these challenges, enabling not only networked smart objects and information technologies but also "optional cloud or edge

computing platforms, which enable real-time, intelligent, and autonomous access, collection, analysis, communications, and exchange of process, product and/or service information, within the industrial environment" [18]. IoT technologies, in particular those for the IIoT, will be standard constituent elements of future safety-critical frameworks. IIoT is an enabler for Industry 4.0, which will affect all industries [19]. However, IIoT will only become a reality through the convergence of Operational and Information Technologies (OT & IT), which are currently separated. The convergence of IT and OT will be supported by dependable Edge Computing [20], which is a logical extension from Cloud Computing towards the edge of the network (where machines are located), enabling applications that demand guarantees in safety, security, and real-time behaviour.

Enabling the infrastructure to support distributed intelligence and information exchange is at the core of IoT, so supporting cross-community work on CPS decentralization, decomposability and human interaction is important. These are already areas receiving some focus from the IoT community [21], [22], as indeed is the case for bringing communities around an embedded computing backbone, with work considering edge-cloud computing [23] exchanges. As an enabling technology, IoT responds to support other domains which means its focus changes based on the latest domain challenges, corroborated in recent IoT roadmapping activities that its landscape is changeable in nature [24].

Artificial intelligence (AI)

The Artificial Intelligence (AI) community plays a crucial role in the development of future cyber-physical systems (CPS). AI technologies, such as machine learning, deep learning, and reinforcement learning, hold immense potential to enhance the capabilities, autonomy, and adaptability of CPS. However, the integration of AI into safety-critical systems poses significant challenges that require close collaboration between the AI community and other stakeholders.

One of the primary concerns is ensuring the trustworthiness and reliability of AI systems in safety-critical applications. The AI community is actively working on developing techniques for explainable AI, which aims to provide clear and understandable explanations for the decisions made by AI algorithms. Projects like SAFEXPLAIN [25] focus on creating explainable deep learning solutions with end-to-end traceability that comply with functional safety requirements for critical autonomous AI-based systems while preserving high performance. This is particularly important in domains such as autonomous vehicles and healthcare, where the actions of AI systems can have significant consequences.

Another key focus area for the AI community is the robustness and safety of AI systems. Researchers are developing methods for adversarial testing, formal verification, and runtime monitoring to ensure that AI systems behave safely and reliably even in the presence of uncertainties and adversarial inputs. Collaborations between the AI community and domain experts in safety-critical industries are crucial for understanding the specific requirements and constraints of each application domain.

The AI community is also working on addressing the challenges of data quality and bias in AI systems. Ensuring the diversity, representativeness, and integrity of training data is essential for

building AI models that perform reliably and equitably in real-world scenarios. Standards organizations and industry consortia are developing guidelines and best practices for data collection, annotation, and validation in safety-critical applications.

There is a need for ongoing monitoring and updates of AI systems deployed in CPS. As AI models learn and adapt over time, it is crucial to have mechanisms in place for continuous assessment and improvement of their performance and safety. The AI community is exploring techniques such as lifelong learning, transfer learning, and online adaptation to enable AI systems to evolve safely and effectively in dynamic environments.

Collaboration between the AI community and other stakeholders, including CPS engineers, domain experts, and regulatory bodies, is essential for the successful integration of AI in safety-critical systems. Joint research initiatives, workshops, and standards development efforts provide platforms for knowledge sharing, best practice development, and the creation of common frameworks and guidelines.

One area where AI can significantly contribute to CPS is in enabling coordinated collaboration among system components and with humans. Multiagent systems [26] provide a paradigm for understanding and building distributed systems where autonomous computational components work together towards common goals. Agent-oriented software engineering methodologies, such as Tropos [27], offer promising approaches for specifying, designing, testing, and delivering CPS from a software engineering perspective, taking into account the specific requirements of these systems.

High-Performance Computing (HPC)

High-performance Computing (HPC) consists of the aggregation of powerful computing resources for solving problems that require large computing power [28]. Recently, HPC technologies were only required in the context of traditional massively parallel "number crunching" applications like weather prediction, computational chemistry, or computational fluid dynamics. However, the latest developments in low-power computing technologies [29] – required in the HPC industry to scale performance levels further – has facilitated the adoption of HPC technologies in a wide range of CPS applications.

Existing HPC platforms offer the computation capabilities needed by the most demanding CPS applications within an affordable power budget in domains such as automotive, space, avionics, robotics and factory automation. Centralized domain architectures that replace the traditional federated computing architectures – like those required by economically affordable autonomous driving systems – are only possible when HPC technologies are deployed. Single-chip high-performance embedded computing platforms reduce the traffic flow through CPS' electronic networks and enable high-speed communication as required for processing vast amounts of information in real time. So this community will be important for consolidating the embedded computing backbone.

Furthermore, these technologies involve parallel processing, that is, splitting the tasks up into parts for several computers (or multiple cores) to process, thus reducing the time taken to complete tasks. This characteristic thus holds a direct relation with the CPS challenges of

decomposability and decentralization – how tasks can be split up while ensuring safety and security for people, the system and its environment.

Unfortunately, the deployment of HPC in a CPS increases the complexity of the resulting system and may have non-negligible impact on the verification and validation costs of relevant system properties (e.g. safety and security). Thus, an effective exploitation of HPC technologies in cyber-physical applications requires at least either the development of new methodologies to verify and validate such complex systems or the adaptation of key technologies to the specific context, as explored in the EU-funded PROXIMA [30] and MASTECS [31] projects, for example.

Big Data

Cyber-physical systems are being driven by the combination of embedded and internet technologies and a vision of "smart anything everywhere" [32]. The blend of this cyber, physical (and social) data can help us to understand incidents and changes in our adjacent environments better, monitor and control buildings and urban infrastructure, and provide better healthcare and care services for older people, among many other applications. To make effective use of the physical-cyber-social data, integration and processing of data from a variety of heterogeneous sources is necessary. A key objective for big data in CPS is to analyse very large, fast, and heterogeneous data streams, mostly from industrial rather than consumer environments. This can be achieved through machine learning, which is the most common technique used to extract information from the data.

The core Big Data applications in CPS are in varied fields, including energy utilization, city management, transportation systems and disaster management. For example, a smart transportation system would generate big data consisting of drivers' behaviour, commuter information, vehicle locations, traffic-signal management, accident reporting, automatic fare calculations, and so on. Robot-aided surgical systems (i.e. human-in-the-loop CPS) comprise a teleoperation console operated by a surgeon, an embedded system hosting the control of the automated robot, and the physical robotic actuators and sensors. Big Data methods can be used here for the modelling of surgical skills, for the detection and classification of surgical motions for automation and environment, and for the integration of this knowledge into control and automation of surgical robots.

In the operation of complex systems (e.g. aircraft and industrial processes), fault-detection and fault-isolation schemes are designed to detect the onset of adverse events. Such systems use big data methods (such as machine-learning classifiers) to enhance the diagnostic accuracy of the online reasoner on board the aircraft. Moreover, big data can be utilized in command and control with cyber-physical infrastructures for emergency services and defense.

The value of the Big Data community as a contributor to CPS products can only grow in the future due to increasing interest in data as an important business asset. The combination of heterogeneous data from numerous sources will require new applications for integration, query and analysis, along with embedded computing, high-performance computing, and data-reduction techniques. This remains an open research issue for CPS. The variety of types and sources of data will give rise to new kinds of data stores to sustain flexible data models.

Another important issue is that of remote storage of big data. Until now, cloud-based models have facilitated the storage and processing of big data sets, providing data accessibility and better IT power. However, this creates a centralized data store that does not scale in the CPS setting. To facilitate decentralized data storage and processing, a number of problems (e.g. replication, parallelism and requirements) arise. There is an urgent need for new approaches and techniques.

System of systems

The "System of Systems" (SoS) concept has been around for at least fifty years, but in the last twenty it has been an area of major concern. Following the description of its characteristics by Maier [33]; it is defined in ISO15228 as: "SoS…brings together a set of systems for a task that none of the systems can accomplish on its own. Each constituent system keeps its own management, goals, and resources while coordinating within the SoS and adapting to meet SoS goals" [34]. As for CPS, SoS represents a type of application, which can be the same, e.g. railway systems, as well as a technology domain - where the focuses are different.

Broadly, one can consider SoS applications as independent systems that interoperate (work together) to achieve a purpose, with a significant amount of ubiquitous networking. In the case where they have extensive software control between safety-critical systems, the application itself is both a SoS and a CPS because they share common characteristics. Figure 2 describes the relationship between SoS, CPS, and the Internet of Things. Where infrastructure interactions are supported by internet protocol, then the CPS is also described as IoT, which is necessarily always a SoS. There are also interesting SoS-CPS applications that interact through means other than the internet protocol (e.g. mechanical or electromagnetic interactions) and the engineer may need to guard against such interactions for safety or performance reasons.
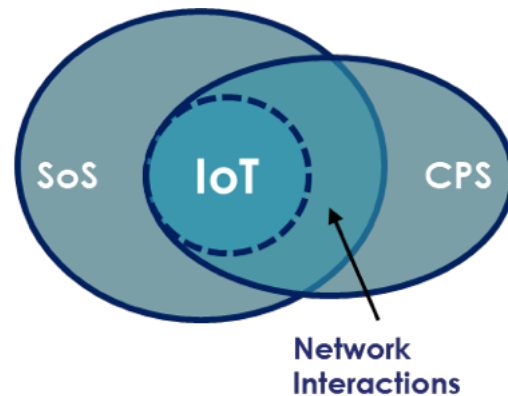

Figure 2: Technology relations of SoS, IoT, and CPS [35].

However, from the technology perspective, CPS application research considers how all technology communities are integrated to create a system and its interactions, with the SoS technology community contributing to the coordinated collaboration aspect. This is a key property for future CPS, meaning that SoS research is indispensable for creating future CPS. In relation to embedded computing, the importance of localized processing, while maintaining a connection to centralized processing capacity, is recognized as a priority in areas such as edge computing, which uses SoS technology. This also links directly with the challenge of decentralization or decomposability where systems work together. A smart city is an example of human interaction and SoS, for example; it manages busy traffic at city junctions to minimize delays for drivers and pedestrians.

In 2012, INCOSE conducted a survey to identify "pain points" for SoS practitioners, i.e., the problems that kept systems engineers and managers awake at night [36]. The study indicated seven main areas of concern: SoS authorities; leadership; constituent systems; capabilities and requirements; autonomy, interdependencies and emergence; testing, validation and learning; and SoS principles. It is no coincidence that creating CPS includes these pain points, because they are concerned with networked, intelligent systems of high complexity. This suggests that the communities of SoS and CPS as research fields have areas of common interest suitable for collaboration. SoS technology is considered an essential element within the final CPS [37].

Digital Twins and the Metaverse

Digital twins are a global phenomenon, the target of major investment and the subject of countless projects and publications. Part of their appeal is the simplicity of the concept, at least to those of us who have grown comfortable with digital, virtual worlds. The term "Digital Twin" was coined by Grieves and Vickers to describe a concept that arose in their work on managing product life cycles. There is extensive, diverse and rapidly growing literature on digital twins, alongside a burgeoning market for the technology. In 2018, digital twin technology was at the top of the Gartner Group's hype cycle[1] and in 2019 it was identified as one of the 10 most strategically important technologies[2], and in 2022 they predicted[3] that the digital twin market would reach $183 billion in revenue by 2031. Realising the full potential of digital twins is more of a challenge than it might at first seem. The engineering of digital twins requires a systems engineering approach including different kinds of models in order to provide predictive capabilities. In order to keep down the costs of establishing digital twins different frameworks automating parts of the elements are promoted e.g. [38].

Human-CPS interaction will also advance with the advent of "metaverse" technologies [39], in particular when CPS operate in close proximity or hand-in-hand with human operators. The metaverse will provide haptic feedback over robots that complement and advance human capabilities [40]. Human operators will receive visual guidance in their view of augmented reality, and will obtain the ability to project themselves into the CPS they control. They will sense, act and interact through the impersonated system with other humans and with the environment in which the CPS operates. They will receive extended cognition and operating capabilities over swarms and manage the complexity of CPS hierarchies with ample application areas. Human caretakers may intervene in case of emergency or when service robots hit the boundaries of autonomy. At the same time, the fact that the environments surrounding a CPS are very diverse and unpredictable, will require that they also be incorporated in these virtual representations. Any kind of CPS autonomy risking damage to people or goods in the surroundings must be

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[1] See https://tinyurl.com/yc86c53v.

[2] See https://tinyurl.com/y5wkfewe.

[3] See www.gartner.com/en/documents/4011590.

accounted for from a trustworthiness perspective [41]. This is investigated, for instance, in the RoboSAPIENS project[4].

Swarms will act in harsh environments on Earth, in space and on remote celestial bodies instead of exposing humans to the risks they have to take today. Examples include mining, nuclear-waste handling and reactor deconstruction, but also asteroid mining and exploration. Replacing the internet with a network of immersive virtual worlds, cyber-physical systems will allow the metaverse to bridge into reality, with all the benefits, but also all privacy, safety and security risks this entails.

Digital twinning is one of the enabling technologies for exercising such advanced control from the digital realm over the real, physical world. Digital twins are virtual models of reality that are continually updated about the actual state of their physical counterparts and which can enable decision-making that, in turn, leads to changes in the real world. The long-term goal of digital twins is to be able to capture the intentions and objectives of the physical twin, but also to improve overall performance through digital simulation, testing and monitoring how the real-world physical system will act in its environment. While the aim is to advance into a better future, this can threaten safety and security when not handled with utmost care. Thus, it will be inevitable for the metaverse and digital-twin communities to join forces with the CPS community to achieve real-time safe, secure, and cyber-attack resilient automation from the moment metaverse-enlightened CPS are designed and throughout their lifetime.

Production-environment influencer domains

Members of the production-environment domain communities are responsible for the industrial product process and lifecycle. This includes enterprise policy and processes, decisions about technology usage and the evolving physical plant [42]. They drive the large-scale production of goods using equipment in the form of modular automated product lines. Such equipment typically combines mechanical, electrical, and software components; it also requires substantial initial investment and maintenance costs. Throughout its long lifecycle (15-30 years) [42], the equipment operator and component suppliers cooperate to repair and repurpose/upgrade parts at a minimal cost. This imposes several constraints on component models and their versions, which in turn constraints policy and process management.

In addition, the arrival of digitalization and the CPS revolution brings the "servitization in manufacturing" opportunity, a paradigm shift where manufacturers shift to offer product-related services, beyond just selling a tangible asset (For further discussion of this concept and examples, see the article "Everything as a service" in this HiPEAC Vision). In the above example of automated product lines, component providers could offer monitoring, online maintenance, repair, and overhaul services [43] among other value-added services. Service contracts generate more steady revenue compared to the cyclical product business, but, in general, organizations in manufacturing struggle to drive servitization [43], because the introduction of the new services incurs higher costs without proportional returns.

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[4] See https://robosapiens-eu.tech/

The adoption of digitalization tools and solutions and the development of innovative services leveraging the full potential of CPS require incentives and coordinated efforts among different partners. Research projects, partnerships in which early movers and less-digital companies cooperate to embrace servitization and adopt CPS tools, provide a nurturing environment, where decision-makers find that the "test-before-invest" concept is an incentive that helps lower barriers and can evaluate potential benefits. For example, in the H2020 HUBCAP [44] project, less digitally focused SMEs were able to pair up with model-based design providers to adopt digital innovation and enhance their solutions using model-based design technology.

Among the success stories, there is the example of the partnership between Mototok International GmbH, a provider of innovative aircraft tug solutions, and Evitado Technologies GmbH, a provider of LiDAR-based algorithms adding advances from the self-driving car industry to an already innovative CPS product. Other examples show how advances were made in training for industry 4.0, the development of innovative organ preservation devices in the medical domain, smart textiles, and precision agriculture.

The prime innovative aspect of HUBCAP is a web-based collaboration platform that facilitates stakeholders' access to computing resources and advanced CPS design and engineering solutions, by providing a cloud-based sandbox solution (Figure 3). The sandbox provides pre-installed models and tools, allowing companies to experiment with new tools and assets in a ready-to-use virtual machine available via a regular web browser, with emphasis on performance and interaction between partners. This is taken forward and combined with DevOps capabilities, also in a digital twin as a service (DTaaS) setting [38].
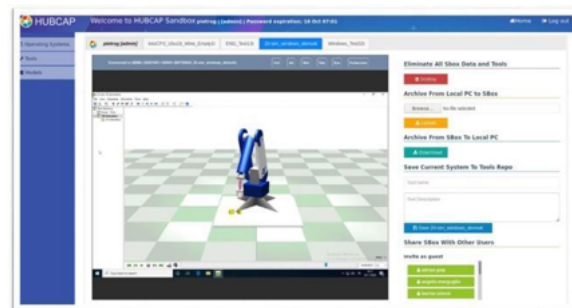

Figure 3: Snapshot from the Sandbox showing SME asset.

Production-environment community members are deeply involved with the cross-community challenges identified. There is a historical synergy with the development and advancement of embedded computing, which will continue in the future. This community is always demanding advancements in embedded computing, and advances in manufacturing also affect how we produce the embedded platforms of the future. Regarding decentralization and decomposability, there are several lessons learned and case studies in which cooperation and adaptation to local and greener processes promote research, discussion, and changes to manufacturing. Finally, this community has a particular interest in the challenge of physical collaboration with people. This interest is from both an internal perspective, covering topics such as human-machine interaction and collaborative robots, and an external perspective, where the potential for improvement from product usage data needs to be fully explored.

Market-influencer domains (society needs, regulation, standards, policy)

CPS are believed to have an enormous impact on many aspects of socio-economic life. Therefore, a number of stakeholders grouped here under the generic name of 'market influencers' will have a stake in shaping the future of CPS and of the contributing domain communities.

Societal needs may be described basically by means of individuals or groups putting forward requirements and benefitting from CPS. The individual appears here as the consumer who is, in one way or another, making use of either a product incorporating CPS, or elements of larger CPS implementations, addressing communities of end users in terms of mobility, personal life (general wellbeing), healthcare, leisure, environment, etc. Other needs may be identified in the area of public services offered at local and national government level, including education, healthcare services, community services, and operation of public institutions.

As well as responding to societal needs, however, CPS also pose new challenges. Some specific fields include education and employment, as CPS induce the obsolescence of certain professions and create new ones. Therefore education, including training and retraining will be affected, as will the employability of the existing and future workforce, which will have implications for the labour market and social security.

Regulation – both hard and soft legislation - will have to be adapted in order to govern CPS so as to ensure their smooth integration into society. However, given the rapid cross-border spread of CPS technology, international agreements might be needed, too, particularly if we consider the globalized nature of today's value chains. Regulation will have to address the interplay between CPS actors (producers, consumers) as well the foreseen and unforeseen effects of the technology. Regulation is also supposed to be structured according to the societal needs that the technology is supposed to fulfill. A particular aspect of related regulation might address the human individual, chiefly in relation to human-machine interaction, which is anticipated to increase significantly in the coming years (intruding into both privacy and healthcare). The "must be implemented" regulation should be supplemented with recommendation-type measures of indicative nature.

Standards ensure interoperability and compatibility of products from different producers and allow the market presence of a large number of actors. Moreover, standards are important in order to set and describe safety levels and quality frameworks. To some extent, standards provide the technical base for legislation governing the area and also give room to innovation as usually standard specifications can be fulfilled in a variety of competing ways.

Policy aims to achieve certain results in a given field by reflecting society's needs or goals. Public policy in particular is directed towards supporting certain areas through frameworks of development in terms of tax incentives, grants or even regulation. Policy also includes public investment in facilities or processes of general interest. A further aspect for consideration is policies aiming to increase employment in a differential manner within the given population (i.e. in favour of disadvantaged groups), or to ensure development of regions lagging behind. Such policies also set out to address issues of general interest like climate change (that can only be done at international level) or the environment.

Beyond public policy, one should take into consideration policies of generically named "groups of interest". Pressure groups such as non-governmental organizations (NGOs) consumer associations also have policies for their vision and procedures to support their realization, which can indirectly influence the market.

These "market influencer" stakeholders between them represent the conditions under which all the other domain communities operate for producing future CPS. The relevance of their involvement should be apparent, especially when considering the aggregative effects of contributing and cross-domain technologies. Deficits in education in one domain community can have a knock-on effect on other communities. Training approaches and certification can be a deciding factor in the sustainability of mixed-domain technologies. Policy can evolve approaches and perspectives that enhance behaviours supporting longer-term governance or culture, providing resilience, value generation and trust in new technologies.

Conclusion

With respect to coordinating CPS research as an application domain, additional approaches and orchestration will need to be introduced. This is because the application-domain perspective is based on the product side, with cumulative effects being considered through the aggregation of layered technology contributions from the contributing stakeholder domain communities. Another issue is that disruptive discoveries, technologies or developments might influence the cycle of research. For example, if significant progress is made on quantum computing, or discoveries in material/biological science, that could make sensors more different.

Orchestration of research is particularly about knowledge management, longer development cycles, persistence and refinement of multi-disciplinary approaches for collaboration between communities. Take the example of constructing a building where a new team takes over every few months. Limited progress can be made without guidance at a higher level. This is similar for advancing CPS research. Persistence of acquired interaction techniques, between project collaborations, is significantly more difficult to maintain. For instance, usability and sensor experts have specific languages for their domains.

Therefore, approaches that support collaborations and tailored during the work should be taken, refined, and applied in subsequent collaborations of different groups. A dedicated CPS research instrument could advance this concept, in conjunction with future CPS support action projects. Projects themselves will also need to provide environments with favourable conditions for integrated research across knowledge domains, considering the multi-dimensional challenges, with conditions significantly different to those for developing component technologies.

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Acknowledgements