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# APPLIED RESEARCH

# Real Time Threat Assessment of Truck Cargos Carrying Dangerous Goods for Preventing Terrorism Attacks on Neighboring Critical Infrastructures

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**ABSTRACT** Critical infrastructures are assets of invaluable importance, essential for the whole world. Since they serve core functions of our societies, they often become targets of terrorists. Many critical infrastructures are vulnerable, due to their short distance from public roads and in the past years, several vehicle-bomb incidents have been recorded. This paper focuses on the case of truck-bombs, which can either be created from scratch, or terrorists can easily hijack truck cargos carrying dangerous goods and turn them into bombs. The latter are typically called ADR truck cargos, according to the respective agreement of the 30th of September 1957, concerning the international carriage of dangerous goods by road. The proposed scheme performs threat assessment of neighboring critical infrastructures, aiming at preventing explosions of truck-bombs. To do so, each crucial point of a critical infrastructure is initially associated with a level of importance. Next, three scenarios are analyzed: (a) single-attack single-infrastructure, (b) multiple-attack single-infrastructure, and (c) multiple-attack multiple-infrastructure. To reduce computational complexity, the third scenario is simplified to one of the two other scenarios, by introducing a novel fusion technique for the non-overlapping segments of the Voronoi tessellation. By this way, an area of threat assessment is estimated for each critical infrastructure. Then, the threat level is assessed in real time by an innovative algorithm, which: (a) estimates the impact of multiple consecutive explosions, (b) uses five adapted threat levels and (c) introduces multiple criteria and minimum classification conditions based on the number of crucial points and their levels of importance. Extensive real world experimental results and comparisons to other works, exhibit the pros and cons of the proposed scheme. In particular, compared to related work, the proposed scheme improves: (a) computational time by 74.5%, (b) threat notification time by 86.9% and (c) estimated surveillance cost by 98.6%.

**INDEX TERMS** ADR, critical infrastructure, multiple explosions, real time, terrorism attacks, threat assessment, truck-bomb, Voronoi tessellation.

#### **I. INTRODUCTION**

Even though several human constructions demand huge efforts, time and money, they can be destroyed with very

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little effort, at the speed of the light and for an insignificant fragment of the cost of construction. For example, an Airbus A380/Boeing 747 costs approximately 400 million Euro and its construction takes several months, but its destruction just needs either an accident or 200 Euro (100 liters of petrol to set fire) and less than 2 hours. Human history is full of

devastating accidents such as the Wanggongchang explosion (30 May 1626) in Beijing, China which destroyed part of the city and killed 20,000 people [1] or the Brescia explosion (18 August 1769) in Italy, which destroyed one-sixth of the city and killed 3,000 people [2]. On the other hand, acts of terrorism always happened. Many people remember the 11<sup>th</sup> September 2001 attacks in New York City, Washington, DC and Shanksville, PA, USA, which killed 2,996 and injured about 25,000 people, while they also caused at least 10 billion Euro damage in infrastructure and property [3]. Unfortunately, acts of terrorism happen very often.

The current work examines truck-bombs, which are commonly used as weapons by terrorists to kill people near the blast site or to damage infrastructures. Truck-bombs carry large amounts of explosives without attracting suspicion. For example, in the Oklahoma City bombing (19 April 1995), USA, more than 3,200 kg of ammonium nitrate fertilizer and fuel oil (ANFO) have been used, killing 168 people, 19 of whom were children, injuring more than 680 others, destroying one third of the Alfred P. Murrah Federal Building which had to be demolished, damaging 324 neighboring buildings within a 16-block radius and 86 cars and causing about 600 million Euro damage [4].

Similar attacks can target any critical infrastructure (CI) such as dams, airports, ports, power plants, refineries, bridges, telecommunication infrastructures, water supply networks and more, which have been built to be costeffective, with little concern for belligerent attacks [5]. Moreover, multiple attacks could be organized, where the target is hit by several truck-bombs. To do so, terrorists can either create truck-bombs, or easily hijack ADR cargos and turn them into extremely dangerous moving bombs. More specifically ADR, formally the Agreement of 30 September 1957 concerning the International Carriage of Dangerous Goods by Road, is a 1957 United Nations treaty that governs transport of hazardous materials. In case of ADR cargos, truck drivers usually cannot confront hijacking events and the cargos are not followed by guards. Furthermore, in case of long distances, truck drivers stop on rest areas, which may become weak links of a route's security chain.

This paper aims at performing threat assessment of neighboring CIs, in order to prevent ADR truck-based terrorism attacks. To do so, crucial points of each CI are initially detected, and each crucial point is associated with a level of importance. Next, the following three scenarios are analyzed: (a) single-attack single-infrastructure, where a single ADR truck explodes near a single CI, (b) multipleattack single-infrastructure, where multiple ADR trucks explode near a single CI and (c) multiple-attack multipleinfrastructure, where multiple ADR trucks explode near neighboring multiple CIs. Reduction of the computational complexity is achieved by simplifying and reducing the third scenario (scenario (c)) to one of the two previous scenarios ((a) and (b)). This is accomplished by proposing CI-based fusion of the non-overlapping segments of the Voronoi tessellation. By this way, an area of threat assessment

(ATA) is estimated for each *CI*. Then, the threat level is assessed within the *ATA* of each *CI*, by an innovative algorithm which: (a) can estimate the impact of multiple explosions (overpressure and positive incident impulse), (b) uses five adapted threat levels, according to the proposal of the Joint Terrorism Analysis Centre & Security Service of MI5 [6] and (c) introduces multiple criteria and minimum classification conditions based on the number of crucial points and their levels of importance. After initialization (Voronoi tessellation and estimation of *ATAs*), the proposed scheme performs in real time. Experimental results and comparisons to other works on real world settings, exhibit the strengths and shortages of the proposed scheme.

To summarize, the major contributions of this paper are:

- Proposal of *CI*-based fusion of the non-overlapping segments of the Voronoi tessellation, leading to estimation of an *ATA* for each *CI*.
- Proposal of a real time innovative algorithm to assess the threat of each *CI*, which considers the impact of multiple explosions, uses five adapted threat levels and incorporates multiple criteria and classification conditions based on the number of crucial points and their levels of importance.
- Aggregation of the impact of multiple consecutive explosions, in case of multiple attacks.
- Examination of neighboring *CIs*, possibly connected through the road network.

Some more contributions include:

- Adaptation of the threat levels proposed by [6], to the problem of threat assessment of *CIs*, considering truckbombs (introduction of specific levels of threat).
- Proposal of a framework for threat assessment of different explosive substances.
- Extensive experimentation on real world settings.

The rest of the paper is structured as follows: Section 2 provides necessary background information. Section 3 discusses related work. In Section 4 the proposed scheme is fully described, while real world experimental results are exhibited in Section 5. Finally, Section 6 concludes this paper, pointing out some future research directions.

# **II. BACKGROUND**

# A. DEFINITIONS

Useful terms and required information are provided next:

- Atmospheric pressure: also known as barometric pressure, is the pressure within the atmosphere of Earth. The standard atmosphere (atm) is a unit of pressure equal to 14.696 psi. The Earth's atmospheric pressure at sea level is approximately 1 atm. On average, a column of air with a cross-sectional area of 1 cm2 measured from mean sea level to the top of Earth's atmosphere, has a mass of about 1.03 kilogram and exerts a force or "weight" of 1.033 kg/cm2.
- Pounds per square inch gauge (psig) or Gauge Pressure: is typically the pressure difference between a supply tank and the outside air; it ignores atmospheric pressure.

# TABLE 1. Expected damage to infrastructure in relation to overpressure (psig).

Overpressure*	Expected Damage	
(psig)		
0.04	Loud noise (143 db); sonic boom glass failure	
0.15	Typical pressure for glass failure	
0.40	Limited minor structural damage	
0.50-1.0	Windows usually shattered; some window frame damage	
0.70	Minor damage to house structures	
1.0	Partial demolition of houses; made uninhabitable	
1.0-2.0	Corrugated metal panels fail and buckle. Housing wood	
	panels blown in	
1000	Range for slight to serious laceration injuries from flying	
1.0-8.0	glass and other missiles	
2.0	Partial collapse of walls and roofs of houses	
2.0-3.0	Non-reinforced concrete or cinder block walls shattered	
2 4 12 2	Range for 1-90% eardrum rupture among exposed	
2.4-12.2	populations	
2.5	50% destruction of home brickwork	
2.0	Steel frame buildings distorted and pulled away from	
3.0	foundation	
5.0	Wooden utility poles snapped	
5.0-7.0	Nearly complete destruction of houses	
7.0	Loaded train cars overturned	
9.0	Loaded train box cars demolished	
10.0	Probable total building destruction	
14.5-29.0	Range for 1-99% fatalities among exposed populations	
	due to direct blast effects	

\*These are peak pressures formed in excess of normal atmospheric pressure by blast and shock waves.

To convert psi to psig, atmospheric pressure is added to the psig value.

- Overpressure (or blast overpressure): is the pressure caused by a shock wave over and above normal atmospheric pressure. In case of blasts, overpressure is equal to gauge pressure. Table 1 [7] provides the expected damage to infrastructures in relation to overpressure.
- ADR: formally the Agreement of 30 September 1957 concerning the International Carriage of Dangerous Goods by Road, is a 1957 United Nations treaty that governs transnational transport of hazardous materials. Thus, ADR truck is defined as a truck that carries dangerous goods such as: explosives, gases, flammable liquids, flammable solids, spontaneous combustibles, oxidizers, organic peroxides, toxic substances, infectious substances, radioactive materials, corrosives etc.

#### **B. SUBSTANCES' RELATIVE EFFECTIVENESS FACTORS**

Each substance  $S_i$ , i = 1, ..., n, has a different degree of danger per unit. Here it should be stressed that different substances may encapsulate different types of dangers, expressed by demolition power, toxicity, radioactivity, carcinogenesis, mutagenesis, teratogenesis etc. This paper focuses on the demolition power of each substance, for two reasons:

#### **TABLE 2.** $RE(S_i^u)$ of different substances.

Substance Name	$RE(S_i^u)$
Trinitrotoluene (TNT)	1
Propane (in a stoichiometric mixture with oxygen, based	0.28
on the peak hydrostatic overpressure)	
Ammonium nitrate	0.32
Hexamine dinitrate	0.6
Dinitrobenzene	0.6
ANFO	0.74
Nitrourea	1.05
Nitrocellulose	1.10
Picric acid	1.17
Trinitrobenzene	1.2
Nitroglycerin	1.54
Hexogen	1.6
Octanitrocubane	2.38



FIGURE 1. Ideal blast waveform in the air.

(a) vehicle bombing incidents of the past, mainly fall into the demolition category and (b) *CIs* are more vulnerable to destruction/demolition attacks.

Let us denote by  $RE(S_i^u)$  the relative effectiveness factor of one unit of  $S_i$ . The relative effectiveness factor relates a substance's demolition power to that of TNT, in units of the TNT equivalent/kg (TNTe/kg) and thus it expresses the degree of demolition danger of each  $S_i$ . Table 2 [8]–[11] provides the  $RE(S_i^u)$  of different substances.

According to Table 2 and to give an example of how  $RE(S_i^u)$  is used, if 1 kg of TNT is required to demolish a wall, then the same job can be done by 0.42 kg (1.0/2.38) of octanitrocubane.

#### C. DESCRIPTION OF BLAST WAVES

When an explosive is detonated in the free air, hot gases at extremely high pressure are produced, which cause a high velocity shock wave. Figure 1 visualizes the Friedlander equation [12], which describes the pressure-time waveform of an ideal explosion at distance R from the explosion's center.  $P_a$  is the atmospheric pressure. The waveform can be divided into positive and negative phases. In general, the positive phase is more dangerous for critical infrastructures, due to large overpressures and concentrated impulses. The positive phase lasts  $t_p$ , while  $t_r$  is the time of arrival of the blast wave and  $t_n$  is the duration of the negative phase. The area under the pressure-time waveform during the positive phase is the positive incident impulse  $(pi_o)$ . Blast pressure variation is the difference of the peak overpressure  $(P_o)$  and peak underpressure or negative pressure  $(P_u)$ .

For calculating the positive blast pressure, Flynn introduced the linear decaying pressure equation [12]:

$$P(t) = P_a + P_o \frac{\left(t_p - t\right)}{t_p}, \quad 0 < t \le t_p \tag{1}$$

while Ethridge [12] proposed a more accurate form:

$$P(t) = P_a + P_o e^{-ct} \tag{2}$$

where *c* is the decay rate of the wave and *t* is measured from the time of arrival  $(t_r)$ .

Additionally, the most common blast scaling law, namely the Hopkinson-Cranz law [13], [14] defines the scaled distance or proximity factor *SD*:

$$SD = \frac{R}{\sqrt[3]{M}} \tag{3}$$

where R denotes the distance in meters from the center of a spherical charge, while M represents the charge mass in kilograms of TNT.

#### 1) INCIDENT BLAST WAVE

After an explosion, the blast load can lead not only to disproportionate structural failure of *CIs* but also to tremendous casualties (dead and injured). During the second half of the 20th century, a large number of experimental and analytical works studied the nature of blast waves and structural response [15]–[19]. These works led to several empirical relations to predict blast overpressure based on the analysis of large sets of experimental data at different scaled distances and charge sizes. Even though most of them have focused on small ranges, this paper incorporates Kinney and Graham's equation [15], which does not have limits on the valid range:

$$P_{o} = P_{a} \frac{808 \left[1 + \left(\frac{SD}{4.5}\right)^{2}\right]}{\sqrt{\left[1 + \left(\frac{SD}{0.048}\right)^{2}\right]} \cdot \sqrt{\left[1 + \left(\frac{SD}{0.32}\right)^{2}\right]} \cdot \sqrt{\left[1 + \left(\frac{SD}{1.35}\right)^{2}\right]}}$$
(4)

or in terms of distance and TNT mass (5), as shown at the bottom of the next page.

Based on Eq. (5) and for a specific quantity of TNT equivalent (M), the overpressure  $(P_o)$  of a blast wave can be calculated for any distance R from the blast's location.

#### **III. RELATED WORK**

The problem of CIs' threat assessment and protection has been studied in the past. In particular, in [20], the protection of CIs against a malicious attacker is modeled as a simultaneous game and the Nash equilibrium solution is imposed. In [21] the most prominent threats and attacks against Industrial Control Systems and critical infrastructures, are described. In [22] Digital Twins to secure *CIs* are developed, which are built using real-time, high fidelity replicas of Programming Logic Controllers. Denial of Service attacks are examined. In [23] a model trained using deep learning is proposed to evaluate EEG signals and detect insider threats. The algorithm classifies different mental states based on four category risk matrices. The work in [24] documents and analyzes cyber-attacks at the oil and gas sector. It also builds a vulnerability taxonomy and connects each vulnerability to the respective attack paths. In [25] a trilevel optimization model is proposed that integrates protection, restoration, and adaptive flow redistribution. Complexity is minimized using an evolutionary algorithm. In [26] a defender-attackerdefender model is proposed that analyzes the potential impacts of intelligent attacks and worst-case disruptions on the U.S. air transportation network. The effects of intermodal connections on the resilience of the air network are also considered through a hypothetical bus network. In [27], the security of smart city service infrastructure is modelled at a higher level of abstraction. Multiple tiers of defense at component/system level, and security operation center are introduced, while for a given component vulnerability vector, the model assesses key security parameters. In [28] the impact of node placement and clustering on LWSN network lifetime is analyzed. Existing node placement and clustering schemes are classified for LWSN and various topologies for disparate applications are introduced. In [29] systemic integration of granular computing (GrC) and resilience analysis for CIs is performed. The paper also considers that adverse events suddenly occur and evolve rapidly, giving little time to react. In [30] visual surveillance data, channel state information from Wi-Fi signals for human-presence detection, and ICS sensor data from the utility are analyzed for protecting critical water infrastructures. In [31] wired signal distinct native attribute finger-printing is investigated as a non-intrusive physical-based security augmentation. Results are based on remote transducer differential pressure transmitter devices, where time domain and slope-based FSK fingerprints' analysis is incorporated. In [32] an automated attack generation method is proposed that can produce detailed, scalable, and consistent attack trees. The paper also discusses identification of the adversarial strategies. In [33] six existing threat assessment frameworks are examined. The paper argues that the complexities associated with modern Cls, make existing methods insufficient to assess systems security risks exposure. In [34] a Unified Modelling Language profile is proposed that enables the modelling and security specification for CIs. Security assessment is carried out through survivability analysis and stochastic

analysis, carried out with Generalized Stochastic Petri nets is discussed. Other interesting works include [35]–[47], which cover different aspects of *CIs*' threat assessment and protection.

Even though very interesting, most aforementioned works are not tested on real world settings and do not provide specific levels of threat. This paper builds on previous extensive experience on surveillance, authentication, illicit goods detection and location-based action analysis [48]–[53], to perform threat assessment of neighboring *CIs*. Three scenarios are analyzed, multiple explosions are considered, a *CI*-based fusion algorithm is proposed for non-overlapping segments of the Voronoi tessellation and a real time innovative algorithm to assess the specific threat of each *CI* is presented. Strengths and weaknesses are exhibited and compared to other schemes through an extensive experimentation phase on real world settings.

#### IV. THE PROPOSED THREAT ASSESSMENT FRAMEWORK

#### A. FRAMEWORK OVERVIEW

This paper focuses on ADR trucks, approaching *CIs*, as it can be seen in Figure 2. If ADR trucks are hijacked by terrorists or other extremists, they can be used as truck-bombs that can cause serious damage to *CIs*. Even an accident (non-terrorism event) can lead to devastating results.

In this subsection, definitions cover all required concepts, objects and actors of the proposed framework. Towards this direction, let us define by  $CI_k^{cp_b}$ , k = 1, ..., l, b = 1, ..., q, the *k*th *CI* under anti-terrorism/security intelligent surveillance, which has *b* crucial points ( $cp_b$ ). For example, an airport (transportation *CI*) has several crucial points that can be stricken by terrorists. These crucial points include fuel tanks, the flight control tower, airstrips etc.

Let  $ADR_{j}^{cp_b}$  be the *j*th ADR truck, j = 1, ..., m, which is located within a radius  $\rho$  from crucial point *b* of a *CI*. More specifically  $r_j$  is the distance of  $ADR_j^{cp_b}$  from crucial point *b* of a *CI* under surveillance. In this case, an ADR truck may be in the vicinity of more than one crucial points. Here it should be mentioned that a different  $r_j$  (e.g.  $r_j^{cp_b}$  for each crucial point *b* of any individual  $CI_k$ ) could be used, according to the importance of each point, but for simplicity reasons and without loss of generality, it is avoided in this paper.

Let us also denote by  $IPC_k^{cp_b}$ , k = 1, ..., l, b = 1, ..., q, the level of importance (*IPC*) of the *b*th crucial point of the *k*th *CI*. Each  $cp_b$  may have a different level of importance. For example, in case of a petroleum refinery, the desalter unit (which washes out salt from the crude oil before it enters the



**FIGURE 2.** Overview of the scheme: ADR trucks approaching neighboring *CIs*, through the road network.

atmospheric distillation unit) has a high level of importance. In the same example, a gasoline storage tank with capacity of 70,000 m<sup>3</sup> has an extremely high level of importance, since if it catches fire, it may destroy the whole refinery. In this paper and since the focus is on *CIs*, three levels of importance are considered for *IPC*: "high", "very high", "extremely high".

## B. SINGLE-ATTACK SINGLE-INFRASTRUCTURE THREAT ASSESSMENT

In case of single-attack single-infrastructure threat assessment, it is assumed that a single ADR truck explodes near a single *CI*. In this case the overpressure ( $P_o$ ) of the blast wave can be calculated by Eq. (5) and the positive incident impulse ( $p_i_o$ ), expressing the overall shock that  $cp_b$  of *CI* receives, can be calculated by:

$$pi_{o} = \int_{t_{r}}^{t_{r}} \left( P\left(t\right) - P_{a} \right) dt$$
(6)

and by using Eq. (2):

$$pi_o = P_o \int_{t_r}^{t_r} e^{-ct} dt = P_O \cdot \left(\frac{e^{-c \cdot t_r} - e^{-c \cdot (t_r + t_p)}}{c}\right)$$

$$P_{o} = P_{a} \frac{808 \left[1 + \left(\frac{R}{4.5\sqrt[3]{M}}\right)^{2}\right]}{\sqrt{\left[1 + \left(\frac{R}{0.048\sqrt[3]{M}}\right)^{2}\right]} \cdot \sqrt{\left[1 + \left(\frac{R}{0.32\sqrt[3]{M}}\right)^{2}\right]} \cdot \sqrt{\left[1 + \left(\frac{R}{1.35\sqrt[3]{M}}\right)^{2}\right]}}$$
(5)

#### TABLE 3. MI5's adapted LoT for Cls.

Level #	LoT	Description			
1	Low	Explosion is likely to produce no malfunction to			
		the CI			
2	Moderate	Explosion is likely to produce non-significant			
		malfunction to the CI			
3	Substantial	Explosion is likely to produce significant			
		malfunction to the CI			
4	Severe	Explosion is likely to produce severe			
		malfunction to the CI			
5	Critical	Explosion is likely to produce critical			
		malfunction to the CI			

$$= = P_O \cdot \frac{e^{c \cdot (t_r + t_p)} - e^{c \cdot t_r}}{c \cdot e^{c \cdot (t_r + t_p)} \cdot e^{c \cdot t_r}}$$
(7)

Equations (5) and (7) are calculated for all  $cp_b$ 's,  $b = 1, \ldots, q$ , of the *CI*, since in case of an explosion more than one crucial points may be affected. In order to assess the threat of the *CI*, the MI5's [6] five levels of threat (*LoT*) are adapted. These five levels can be seen in Table 3:

In order to assess the *LoT* of the *CI*, in this paper the following novel algorithm is introduced:

Algorithm 1 provides the minimum conditions to classify a threat as critical, severe or substantial. Towards this direction, overpressure thresholds  $T_1$ ,  $T_2$ ,  $T_3$ ,  $T_4$  ( $T_2 > T_1 > T_3 > T_4$ ), positive incident impulse thresholds  $t_1$ ,  $t_2$ ,  $t_3$ ,  $t_4$  ( $t_2 > t_1 > t_3 > t_4$ ) and cardinality thresholds  $T_{crd1}$ ,  $T_{crd2}$ ,  $T_{crd3}$  are incorporated such as: (a)  $T_2 / t_2$  consider very high overpressure / positive incident impulse, (b)  $T_1 / t_1$  consider high overpressure / positive incident impulse, (c)  $T_3 / t_3$  consider significant overpressure / positive incident impulse incident impulse and (d)  $T_4 / t_4$  consider medium overpressure / positive incident impulse.

According to *Algorithm 1*, a critical threat is distinguished if the explosion: (a) possibly generates high overpressure or high positive incident impulse to at least one crucial point  $(cp_b)$ , which has extremely high *IPC*, (b) possibly generates very high overpressure or very high positive incident impulse to at least one crucial point  $(cp_b)$ , which has very high *IPC*, (c) possibly generates very high overpressure or very high positive incident impulse to at least  $T_{rcd1}$  crucial points, which have high *IPC*. Severe and substantial threats can be described in a similar manner. Additionally, since low and moderate *LoT* are not of specific concern and in order to reduce computational complexity, minimum conditions for classifying an event into low and moderate *LoT* are not included.

On the other hand, for analyzing time and space complexity of Algorithm 1, the big O (Bachmann–Landau or asymptotic) notation is used. In particular, regarding time complexity of Algorithm 1, let us assume that each computer operation takes approximately constant time, denoted as ct. Let us also assume that the worst-case scenario is considered, Algorithm 1 Threat Assessment in Case of Single-Attack Single-Infrastructure

#### // ######## INITIALIZATION ########

**Data**: one CI; one ADR; all  $cp_b$ 's of CI;

form set EH =  $\{cp_b | IPC_k^{cp_b} ==$  "extremely high"} // set of extremely high level of importance points form set  $VH = \{cp_b | IPC_k^{cp_b} ==$  "very high"} // set of very

high level of importance points  $PC_k^{*} = PV$  and  $PC_k^{*} = PV$  and PV set of very high level of importance points

form set  $H = \{cp_b | IPC_k^{\hat{c}p_b} == \text{``high''} \} // \text{ set of high level of importance points}$ 

 $CR_H = card(H)$  //cardinality of set H

for b = 1 : q //for all  $cp'_{b}s$ estimate  $P_{O}^{cp_{b}}$ ; //overpressure at each  $cp_{b}$ form vector  $OP_{O} = [P_{O}^{cp_{1}}, P_{O}^{cp_{2}}, \dots, P_{O}^{cp_{q}}]$ ; estimate  $pi_{O}^{cp_{b}}$ ; // positive incident impulse at each  $cp_{b}$ form vector  $Opi_{O} = [pi_{O}^{cp_{1}}, pi_{O}^{cp_{2}}, \dots, pi_{O}^{cp_{q}}]$ ;

end for ;

# // ######## THREAT ASSESSMENT ######## $\forall P_o^{cp_b} \in OP_O$ ; $\forall p i_o^{cp_b} \in Op i_O$ ;

//Minimum conditions for critical level of threat (LoT = 5) **if**  $\exists cp_b : \{(P_O^{cp_b} > T_1 \text{ OR } p_i^{cp_b} > t_1) \&\& IPC_k^{cp_b} ==$ "extremely high")} **then** LoT = "5"; if  $\exists cp_b$  : { $(P_O^{cp_b} > T_2 \text{ OR } p_o^{cp_b} > t_2)$  &&  $IPC_k^{cp_b} \ge$ "very high") fight then LoT = 5; if  $\{\{\exists SH \subseteq H: (card(SH) \geq T_{crd1})\}$  &&  $(\forall cp_b \in SH):$  $(P_{O}^{cp_{b}} > T_{2} \text{ OR } pi_{o}^{cp_{b}} > t_{2})\}\}$  then LoT = "5";//Minimum conditions for severe level of threat (LoT = 4) if  $\exists cp_b : \{(T_1 > P_O^{cp_b} \ge T_3 \text{ OR } t_1 > pi_O^{cp_b} \ge t_3) \&\&$  $IPC_k^{cp_b} ==$  "extremely high")} then LoT = "4"; if  $\exists cp_b$  : { $(T_2 > P_0^{cp_b} \ge T_1 \text{ OR } t_2 > p_i^{cp_b} \ge t_1)$  &&  $IPC_{\nu}^{cp_b} \geq$  "very high")} then LoT = "4"; if  $\{\{\exists SH \subseteq H: (card(SH) \geq T_{crd2})\}$  &&  $(\forall cp_b \in SH):$  $(P_{O}^{cp_{b}} > T_{2} \text{ OR } p_{o}^{cp_{b}} > t_{2})\}\}$  then LoT = "4"; // $\dot{M}$ inimum conditions for substantial level of threat (LoT = 3) if  $\exists cp_b : \{(T_3 > P_0^{cp_b} \ge T_4 \text{ OR } t_3 > p_0^{cp_b} \ge t_4) \&\&$  $IPC_k^{cp_b} ==$  "extremely high")} then LoT = "3"; if  $\exists c_{pb}^{\kappa}$  : { $(T_1 > P_O^{cp_b} \ge T_3 \text{ OR } t_1 > pt_o^{cp_b} \ge t_3)$  &&  $IPC_{k}^{cp_{b}} \geq \text{``very high'')} \text{ then } LoT = \text{``3''};$ if {{ $\exists SH \subseteq H: (card(SH) \geq T_{crd3})$ } && ( $\forall cp_{b} \in SH$ ):  $(T_2 > P_O^{cp_b} \ge T_1 \text{ OR } t_2 > pt_O^{cp_b} \ge t_1)\}$  then LoT = "3";

for LoT < 3 (in this case, all minimum conditions of Algorithm 1 are examined). Then the number of operations to be executed depends on the number of  $cp_b$ 's (input length). The major operations for an input length N are: (a) ct\*Ninput operations (b) ct\*N operations to estimate overpressure (c) ct\*N operations to estimate positive incident impulse (d) ct\*N\*logN to short the overpressure set (e) ct\*N\*logN to short the positive incident impulse set and (f) ct\*N operations to check all minimum conditions. Hence the time complexity of Algorithm 1 is O(N\*logN). So, if the number of  $cp_b$ 's increases, the time of execution also increases in a non-linear way (O(N\*logN)).

Regarding space complexity of Algorithm 1, let us assume that each element occupies a unit space of memory, denoted by *sp*. Then the occupied space also depends on the number of  $cp_b$ 's (input length). In particular, for an input length N, the used memory space (for the major data to be stored) is: (a) sp\*N for forming sets *EH*, *VH* and *H*, (b) sp\*N for forming vector  $OP_O$ , (c) sp\*N for forming vector  $Opi_O$ , (d) sp\*N to short the overpressure set and (e) sp\*N to short the positive impulse set. Hence the space complexity of Algorithm 1 is O(N). So, if the number of  $cp_b$ 's increases, the required memory also increases in a linear way (O(N)).

# C. MULTIPLE-ATTACK SINGLE-INFRASTRUCTURE THREAT ASSESSMENT

Before proceeding to full analysis of this scenario, it should be stressed that the scope of this paper is to establish the foundations for ADR threat assessment of critical infrastructures and not to examine case-based blast waves' interferences, reflections, angles of incidence etc. In any case, an individual threat assessment plan should be prepared for each *CI*, by taking into full consideration the specifics of the infrastructure (e.g. location, elevation level, crucial points, distance from road, obstacles etc.).

Now, in case of multiple-attack single-infrastructure threat assessment, it is assumed that multiple ADR trucks explode near a single CI. Explosions may happen at the same time, may have time overlap or may be successive. For simplicity reasons: (a) this paper focuses on successive explosions, where the next explosion occurs after the previous explosion is completed (typically after milliseconds) and (b) only the positive incident impulse of each explosion is estimated, which is typically much larger than the negative phase. Figure 3 visualizes the scenario of consecutive, nonoverlapping explosions. In this case the overpressure  $(P_{\alpha})$ of each blast wave (for each explosion) can be calculated by Eq. (5) and the overall positive incident impulse (OPI), expressing the overall shock that  $cp_b$  of CI receives after N consecutive explosions (Figure 3 shows the first three out of N explosions), can be calculated by:

$$OPI^{cp_b} = \sum_{i=1}^{N} pi_o \tag{8}$$

by using Eq. (6):

$$OPI^{cp_b} = \int_{t_{1a}}^{t_{1a}} (P_1(t) - P_a) dt + \int_{t_{2a}}^{t_{2a}} (P_2(t) - P_a) dt + \int_{t_{3a}}^{t_{3a}} (P_3(t) - P_a) dt + \dots$$
(9)

by using Eq. (7):

$$OPI^{cp_b} = P_O^1 \cdot \frac{e^{c_1 \cdot (t_{1a} + t_{1b})} - e^{c_1 \cdot t_{1a}}}{c_1 \cdot e^{c_1 \cdot (t_{1a} + t_{1b})} \cdot e^{c_1 \cdot t_{1a}}}$$



FIGURE 3. Consecutive non-overlapping explosions, near a single critical infrastructure.

$$+P_{O}^{2} \cdot \frac{e^{c_{2} \cdot (t_{2a}+t_{2b})} - e^{c_{2} \cdot t_{2a}}}{c_{2} \cdot e^{c_{2} \cdot (t_{2a}+t_{2b})} \cdot e^{c_{2} \cdot t_{2a}}} \\ +P_{O}^{3} \cdot \frac{e^{c_{3} \cdot (t_{3a}+t_{3b})} - e^{c_{3} \cdot t_{3a}}}{c_{3} \cdot e^{c_{3} \cdot (t_{3a}+t_{3b})} \cdot e^{c_{3} \cdot t_{3a}}} + \dots$$
(10)

$$OPI^{cp_b} = \sum_{i=1}^{N} P_O^i \cdot \frac{e^{c_i \cdot (t_{ia} + t_{ib})} - e^{c_i \cdot t_{ia}}}{c_i \cdot e^{c_i \cdot (t_{ia} + t_{ib})} \cdot e^{c_i \cdot t_{ia}}}$$
(11)

where  $P_O^i$ ,  $c_i$ ,  $t_{ia}$ ,  $(t_{ia} + t_{ib})$  are overpressures, decay factors, times of arrival of the blast waves to  $cp_b$  and duration of positive incident impulse of the  $i_{th}$ , i = 1, ..., N, explosion respectively.

Equations (5) and (11) are calculated for all  $cp_b$ 's, b = 1, ..., q, of the CI and in order to assess the LoT, the proposed Algorithm 1 is incorporated, with  $P_O^{cp_b} = P_O^i$ , i = 1, ..., N and  $p_i^{cp_b} = OPI^{cp_b}$ .

# D. MULTIPLE-ATTACK MULTIPLE-INFRASTRUCTURE THREAT ASSESSMENT

In case of multiple-attack multiple-infrastructure threat assessment, it is assumed that multiple ADR trucks possibly explode near multiple neighboring CIs. In order to achieve efficient computational complexity, this scenario is simplified and reduced to one of the two previous scenarios (single-attack single-infrastructure, multiple-attack singleinfrastructure). An oblate spheroid or oblate ellipsoid is the regular geometric shape that best approximates the shape of Earth. Thus, Riemannian manifolds could provide better accuracy in case of large geographic areas. However, and for simplicity reasons, in this paper mapped limited geographic areas are considered and handled as 2D euclidean spaces. For simplifying the following notations, crucial points from all CIs are not distinguished according to their origin CI. As a result, the location of crucial point  $cp_i$  can be denoted as  $(x_{cp_i}, y_{cp_i})$ , providing the corresponding vector  $\vec{z}_{cp_i}$ . Now let us gather all crucial points from all CIs under consideration, into set  $OCP = \{cp_1, cp_2, \dots, cp_n\} \in \mathbb{R}^2$ , where  $2 \le n < \infty$ and  $cp_i \neq cp_i$ ,  $i \neq j$  and  $\forall i, j = 1, 2, ..., n$ . In this paper the points of set OCP are used as the generator points of a Voronoi tessellation and the region given by

$$VR(cp_i) = \left\{ \vec{z}_{cp} \mid \left\| \vec{z}_{cp} - \vec{z}_{cp_i} \right\| \le \left\| \vec{z}_{cp} - \vec{z}_{cp_j} \right\| \forall j \ni i \neq j \right\}$$
(12)



FIGURE 4. Map of the south-west area of Attica prefecture including the locations of the five most important C/s.

is called the Voronoi region of  $cp_i$ , where  $\|\cdot\|$  denotes the Euclidean distance. Then the following set

$$VD_{OCP} = \bigcup_{i=1}^{n} VR(cp_i)$$
(13)

is called the Voronoi diagram of *OCP*, which consists of non-overlapping segments. Each segment corresponds to a crucial point of a specific *CI*. In order to reduce the multiple-attack multiple-infrastructure scenario to one of the two previous scenarios, this paper proposes *CI*-based fusion of the non-overlapping segments of the Voronoi diagram. Towards this direction, segments which originate from crucial points that belong to the same *CI*, are fused to provide the *ATA* for each *CI*. More specifically, for the  $CI_k$ , k =1, 2, ..., *l*, *CIs*, *l* classes are created, say  $C_i$ , i = 1, 2, ..., l, as:

$$C_{i} = \left\{ \bigcup_{b=1}^{q} VR\left(cp_{b}\right) : cp_{b} \in CI_{i} \right\}, \quad i = 1, 2, \dots, l$$

$$(14)$$

Then, if only one ADR truck is within the ATA of a CI, this case is considered as single-attack single-infrastructure and the respective approach of subsection 4.2 is followed. On the other hand, if several ADR trucks are within the ATA of a CI, this case is considered as multiple-attack single-infrastructure and the respective approach of subsection 4.3 is followed.

#### **V. EXPERIMENTAL RESULTS**

### A. EXPERIMENTAL SETUP

The unpredictable and persistent nature of terrorism makes it a very difficult issue to tackle. Typically, security authorities do not know whether, at which time and in which place, a terrorist attack will take place. On the other hand and in some cases, current technologies may be able to somehow speculate the cargo of a truck [54]. However, there is not yet any mature technology to distinguish between terrorist and regular trucks, ADR and non-ADR cargo, or terrorist and regular driver. In addition to acts of terrorism, accidents and explosions of trucks also occur often [55]. Furthermore, the crucial points of a critical infrastructure, as well as their levels of importance are confidential information.



FIGURE 5. The selected five most important CIs located at the south-west area of Attica prefecture.

(e)

By taking into consideration all aforementioned remarks and limitations, an extended experimentation phase was properly designed and carried out within the interval March 1st – March  $30^{\text{th}}$ , 2022 (30 days). Initially the five most important *CIs* located at the south-west area of Attica prefecture (Figure 4) were selected:

a)  $CI_1$ : Hellenic Petroleum Industrial site of Aspropyrgos, one of the main public refineries of Greece (Figure 5(a))

b)  $CI_2$ : DEH – KYT Koumoundourou, one of the two main high voltage electrical power distribution centers of Attica prefecture (covering 1/3 of the total electrical power of Attica prefecture), (Figure 5(b))

c)  $CI_3$ : the Military Airport and Airforce base of Elefsina region, (Figure 5(c))

d)  $CI_4$ : the Hellenic Petroleum industrial site of Elefsina, another one of the main public refineries of Greece (Figure 5(d)) and

e)  $CI_5$ : Elefsis Shipbuilding & Industrial Enterprises S.A., the largest shipyard in Greece (Figure 5(e)).

Here it should be stressed that: (a) more than 5 million people live within the Attica prefecture, (b) the south-west area of Attica prefecture was selected for experimentation, since it hosts some of the most important *CIs* of Greece, which are also concentrated within a radius of about 5 km (neighboring *CIs*) and (c) similar experiments and analysis can be performed for any region worldwide and for any number of *CIs*.

During the experiments, all trucks moving only on main access roads and highways, neighboring to the *CIs* under examination, were considered as ADR and were analyzed. In particular, traffic passing by the following main

CI	ср	Latitude	Longitude	Туре
	1	38.031287	23.597916	Storage Tank
	2	38.031824	23.597494	Storage Tank
	3	38.032197	23.615452	Storage Tank
	4	38.032191	23.614451	Storage Tank
1	5	38.031456	23.614292	Storage Tank
	6	38.031002	23.613503	Storage Tank
	7	38.030596	23.612752	Storage Tank
	8	38.030062	23.611979	Storage Tank
	9	38.029563	23.611292	Storage Tank
	1	38.033341	23.619775	Power Pylon
	2	38.033397	23.620048	Power Pylon
	3	38.033462	23.620314	Power Pylon
2	4	38.033522	23.620585	Power Pylon
	5	38.033594	23.620914	Power Pylon
	6	38.033721	23.621642	Power Pylon
	7	38.033439	23.622358	Power substation
	8	38.033527	23.622691	Power substation
	1	38.054289	23.555997	Aeroway
2	2	38.075054	23.556128	Aeroway
3	3	38.065867	23.550570	Control Tower
	4	38.062697	23.563463	Repair Station
	1	38.039885	23.504270	Storage Tank
	2	38.040427	23.505214	Storage Tank
	3	38.041040	23.506184	Storage Tank
	4	38.042698	23.508889	Storage Tank
	5	38.046948	23.516366	Storage Tank
	6	38.046366	23.515128	Storage Tank
4	7	38.045552	23.514056	Storage Tank
	8	38.045763	23.509540	Storage Tank
	9	38.045100	23.508493	Storage Tank
	10	38.044346	23.507345	Storage Tank
	11	38.043402	23.505942	Storage Tank
	12	38.043211	23.504755	Storage Tank
	13	38.047474	23.505084	Storage Tank
	14	38.046631	23.504045	Storage Tank
5	1	38.032592	23.495531	Industrial Building
	2	38.032839	23.496693	Industrial Building
	3	38.033719	23.497204	Industrial Building
	4	38.034367	23.497554	Industrial Building

**TABLE 4.** Latitude, longitude and type of the 39 crucial points, for the five *Cls*.

roads/highways, was considered: Old Highway Athinon-Korinthou (passing near  $CI_4$  and  $CI_5$ ), NATO Avenue (passing near  $CI_3$ ), A8-E94 highway (passing near  $CI_1$ ,  $CI_3$  and  $CI_4$ ,), A65 highway (passing near  $CI_1$ ), Panagias Faneromenis Avenue (passing near  $CI_1$  and  $CI_2$ ) and Dimiourgias Avenue (passing near  $CI_1$  and  $CI_2$ ). Then, crucial points of the  $CI_s$  under consideration were filtered, based on the main access roads and highways. More specifically, the closest to the main access roads and highways crucial points were kept and as a result 39 crucial points were considered in this experimentation phase. The



**FIGURE 6.** The five clusters formed by fusing segments of the Voronoi diagram.

latitude, longitude and type of each crucial point are presented in Table 4, where the decimal degrees format is incorporated.

Set OCP includes all these 39 points, used as the generators of the Voronoi tessellation. Then the proposed CI-based fusion algorithm of the non-overlapping segments of the Voronoi diagram was applied and five clusters  $(C_1, C_2, C_3, C_3)$  $C_4$ ,  $C_5$ ) were created, one for each CI. Figure 6, which presents all data, was created using the R libraries leaflet [56], sf [57], dismo [58], sp [59] and deldir [60], as well as OpenStreeMap [61]. In Figure 6 the OCP points are represented with different colors (red, green, blue, yellow and black) and for each point a polygon is created (the lines of which are visualized in grey color). In particular,  $C_1$  (red area within the bounding box) is formed by fusing the segments of the Voronoi diagram, originating from the 9 crucial points (red circles) of  $CI_1$ .  $C_2$  (green area within the bounding box) is formed by fusing the segments, originating from the 8 crucial points (green circles) of  $CI_2$ .  $C_3$  (blue area within the bounding box) is formed by fusing the segments, originating from the 4 crucial points (blue circles) of  $CI_3$ .  $C_4$  (yellow area within the bounding box) is formed by fusing the segments, originating from the 14 crucial points (yellow circles) of  $CI_4$ .  $C_5$  (black area within the bounding box) is formed by fusing the segments, originating from the 4 crucial points (black circles) of  $CI_5$ . Here it should also be mentioned that a Voronoi diagram is typically extended to the whole map. However, in this paper threat assessment is considered as local in nature, since an ADR truck explosion should occur near a CI, in order to cause damage. For this reason, a bounding box is estimated, so that it includes all aforementioned roads/highways and limits the ATA to a maximum distance of 1,000 meters away from the outer crucial points. Thus, when ADR trucks are outside the bounding box, threat assessment is not performed, reducing the computational complexity of the proposed scheme. When ADR trucks enter the bounding box, threat assessment is carried out separately for each cluster, by following the



FIGURE 7. Example of truck and license plate detection using [62]–[64].

single-attack / multiple-attack single-infrastructure methodologies. Additionally, in order to maintain a high degree of awareness of the surroundings of each *CI* and since it may be difficult to install surveillance cameras everywhere, in our experiments traffic surveillance cameras were installed: (a) at the intersections of the considered roads/highways and the bounding box and (b) at the intersections of the considered roads/highways and the limits of the five clusters ( $C_1$ ,  $C_2$ ,  $C_3$ ,  $C_4$ ,  $C_5$ ). In total 13 surveillance cameras were installed.

# B. ADR TRUCKS CHARGE ESTIMATION

The recorded (from the 13 surveillance cameras) content was collected daily and analyzed by three PCs with Intel(R) Core(TM) i7-9700 CPU @ 3.00GHz and 16 GB DDR4 RAM. Under these settings, content analysis is performed in real time, for up to four video streams per PC. For more than four video streams, either a parallel processing architecture satisfies the real time condition or frame skipping. Initially the following two sample projects were installed and properly adjusted, in order to analyze only trucks: "Vechicle Detection, Tracking and Counting" using TensorFlow Object Counting API [62] and "License Plate Detection and Recognition in Unconstrained Scenarios" [63], [64]. The first project: (a) detects and classifies vehicles (cars, trucks, bicycles, motorcycles, buses) and (b) estimates the speed of a vehicle, while the second project detects and recognizes license plates.

Only vehicles classified as trucks were further processed. For each truck, its speed was estimated, while its license plate was detected and recognized. In the current experiments the estimated speed of each truck was assumed to be constant, until another camera provides information for a new estimation. The constant speed assumption enables real time estimation of the location of each truck, within each *ATA*. Furthermore, due to plates' recognition, our scheme is aware of the trucks entering/exiting each *ATA*. Figure 7 presents a truck, detected within a rectangle (detection rectangle), where its license plate is concealed for privacy issues.

Next, a worst-case scenario is analyzed for the three most characteristic substances of Table 2. In this scenario it is assumed that all trucks are truck-bombs and carry the maximum amount of explosive matter. In case of terrorist attacks, this is a reasonable scenario, since terrorists aim at maximizing the overall impact of an attack. In order to estimate the possible maximum amount of the explosive matter carried by a truck, the detection rectangle is used, which provides an estimation of the size of the truck. In particular, the detection rectangle for each truck and for a specific distance from the surveillance camera is selected, so that mapping to a specific truck size is accomplished. In this paper, mapping parameters have been estimated and tested by performing several experiments. Then, each truck is classified to one of the categories presented in [65], having a capacity between 82 and 120 m<sup>3</sup>. The most dangerous substance of Table 2, octanitrocubane, has a density of 1.98 tons per m<sup>3</sup>, thus, in the worst-case scenario, the aforementioned trucks could carry from 162.4 to 237.6 tons of octanitrocubane, or 386.5 (Mass2) to 565.5 (Mass1) tons of charge mass of TNT (parameter M of Eq. (5)). The most characteristic explosive substance is TNT, which has a density of 1.65 tons per m<sup>3</sup>, thus, in the worst-case scenario, the aforementioned trucks could carry from 135.3 (Mass4) to 198 (Mass3) tons of TNT. Furthermore, the cheapest and easiest to produce is ANFO, which has a density of 0.82 tons per m<sup>3</sup>, thus, in the worst-case scenario, the aforementioned trucks could carry from 67.2 to 98.4 tons of ANFO, or 49.7 (Mass6) to 72.8 (Mass5) tons of charge mass of TNT. Based on the cost of each explosive, terrorists are more likely to use ANFO (~400 Euro/ton) [66], which, in its worst case, it is represented by Mass5. TNT may require 5 times the cost of ANFO [67], while octanitrocubane is extremely unlikely to be used, since the commercially available starting material for octanitrocubane, dimethyl cubane-1,4-dicarboxylate, costs about 36,000 Euro per kg [68]. Similar calculations can be performed for all substances of Table 2. Figure 8 shows overpressure versus distance, for the six different masses (Mass1-Mass6) and for samples every 50 meters, where the minimum distance is 40 meters (some  $cp_b$ 's are ~40 meters away from the roads/highways under examination). The maximum distance is 1,000 meters (see Section 5.2). As it can be observed from Figure 8: (a) for Mass1 the maximum overpressure is 89.4 psig at a distance of 40 meters and the minimum is 0.16 psig at a distance of 1,000 meters, (b) for Mass3 the maximum overpressure is 46.3 psig at a distance of 40 meters and the minimum is 0.11 psig at a distance of 1,000 meters and (c) for the smallest Mass6 the maximum overpressure is 17.6 psig at a distance of 40 meters and the minimum is 0.07 psig at a distance of 1,000 meters. Additionally, explosion of a truck full of octanitrocubane (Mass1) is extremely dangerous even for a distance of 180 meters away from a crucial point of LoT=5, while in case of ANFO (Mass5) the distance falls to 80 meters.

# C. THREAT ASSESSMENT AND VULNERABILITY ANALYSIS OF CIs

For the 30 days experimentation interval, in total 33,810 unique trucks, or on average 1,127 unique trucks per day,



FIGURE 8. Overpressure (psig) versus distance, for the six different masses (Mass1-Mass6).



FIGURE 9. Trucks within CIs' ATAs per day.

were detected within the ATAs of the five *CIs* under examination, 72.4% of which passed through A8-E94 highway. Here it should be mentioned that a truck moving on A8-E94 highway, usually passed near all related *CIs* (*CI*<sub>1</sub>, *CI*<sub>3</sub> and *CI*<sub>4</sub>), one at a time. Similar cases were observed for Old Highway Athinon-Korinthou, Panagias Faneromenis Avenue and Dimiourgias Avenue, which pass from more than one *CIs*. Thus, a unique truck could threaten more than one *CIs*, at different time instances. This paper focuses on the overall threat assessment of each *CI* per time instance and subsequently the total charge mass of TNT per time instance within an *ATA* is considered.

The diagram of the flow of the number of trucks within each area of threat assessment for the 30 days period is provided in Figure 9. As it can be observed, numbers of trucks within the *ATAs* of  $CI_1$  and  $CI_4$  are similar, since these two CIs are connected with A8-E94 highway and both of them



**FIGURE 10.** Percentage of *LoT* for (a)  $CI_1$ , (b)  $CI_2$ , (c)  $CI_3$ , (d)  $CI_4$  and (e)  $CI_5$ .

also have a secondary important source (A65 for  $CI_1$  and the Old Highway Athinon-Korinthou for  $CI_4$ ). Furthermore, the number of trucks dropped substantially on the 7<sup>th</sup> of March 2022, which was a public holiday (Green Monday) and trucks were not allowed to move on highways. Additionally, the total number of trucks was 83,379, which means that each of the 33,810 unique trucks, passed from the ATAs of 2.47 *CIs* on average. In particular 27,368 passed from  $CI_1$ , 891 from  $CI_2$ , 23,859 from  $CI_3$ , 27,095 from  $CI_4$  and 4,166 from  $CI_5$ .

Next, based on Table 1, thresholds  $T_1$ ,  $T_2$ ,  $T_3$ ,  $T_4$  (in psig) and the respective  $t_1$ ,  $t_2$ ,  $t_3$ ,  $t_4$  (in kPa-ms) were selected as  $T_2 = 5 > T_1 = 3 > T_3 = 2 > T_4 = 1$ ,  $t_2 = 200 >$  $t_1 = 100 > t_3 = 70 > t_4 = 40$ . Additionally,  $T_{crd1}$ ,  $T_{crd2}$ ,  $T_{crd3}$  were selected to be 70%, 50% and 30% of the  $cp_b$ 's with high *IPC*. Figure 10 presents the *LoT* barplots (*LoT* instances) of the five *CIs*, in case of Mass5 and for the total surveillance period. Axis *x* represents the *LoT* while axis *y* the percentage (%).

As it can be observed in Figure 10: (a)  $CI_1$  is extremely vulnerable with an almost 84% of LoT=4 and almost 15% of LoT=5. This is due to the fact that all trucks moving on A8-E94 highway, pass near ( $\sim 90$  meters) a large fuel tank. Additionally, all trucks moving on A65 highway / Panagias Faneromenis avenue, pass very near (~50 meters /  $\sim$ 40 meters) large fuel tanks, (b)  $CI_2$  is extremely vulnerable with an almost 25% of *LoT*=5. This is due to the fact that all trucks moving on Dimiourgias avenue pass very near (~25 meters) from several power pylons, (c)  $CI_3$  is the least vulnerable CI, since its crucial points are far away (distance >400 meters) from the highways/avenues under examination. Even in case of Mass1, the estimated overpressure is less than 0.6 psig. (d)  $CI_4$  is extremely vulnerable and it also presents a peculiarity: all trucks moving on the Old Highway Athinon-Korinthou pass very near ( $\sim 40$  meters) from large fuel tanks and then, the same trucks, pass near ( $\sim 90$  meters) other large fuel tanks. In the first case they lead to LoT=5and in the second to LoT=4. As a result the two LoTs are merged (Figure 10(d)) into one class, (e) finally  $CI_5$  is under substantial risk, since all trucks moving on the Old Highway Athinon-Korinthou pass near ( $\sim 100$  meters) the machinery buildings of CI<sub>5</sub>.

Here it should be mentioned that similar analysis can be performed for any of the aforementioned masses (Mass1 – Mass6), any substance of Table 2 as well as any other explosive substance.

Figure 11 presents the evolution of LoT versus time. More specifically, results for the rush hour 15:00 – 16:00 pm (UTC+2) of the 11<sup>th</sup> of March 2022 are depicted. The specific date was the busiest of the period under consideration, according to the overall number of trucks that passed from the five *CIs*. In Figure 11: (a) the rush hour (60 minutes) is represented by 3,600 seconds, (b) each highway/avenue that a truck passes from and generates a LoT (*LoT* 3 to 5), is represented by different color (purple color for Old Highway Athinon-Korinthou, blue color for A8-E94 highway, red color for A65 highway, green color for Panagias Faneromenis Avenue and orange color for Dimiourgias Avenue).

As it can be observed in Figure 11: (a) due to the distance of the  $cp_bs$  of  $CI_1$  from A8-E94 highway, A65 highway and Panagias Faneromenis Avenue,  $CI_1$  may suffer critical, severe or significant malfunction several instances per hour, (b) compared to  $CI_1$ , things are better for  $CI_2$ , however  $CI_2$ may suffer critical malfunction often (2 time instances for the specific date and time), c)  $CI_3$ 's LoT is always less than 3 and thus it is not depicted, (d)  $CI_4$  may suffer critical or severe malfunction several instances per hour, (e) finally  $CI_5$ may suffer significant malfunction several instances per hour, however, compared to  $CI_1$ ,  $CI_2$  and  $CI_4$ , it is in a better position. Here it should be mentioned that similar diagrams



FIGURE 11. Evolution of LoT versus time for a specific date and time.

can be provided for any date and time of the surveillance period under consideration, however, the busiest date was analyzed to better illustrate the maximum threat (worst case).

#### D. COMPARISON TO OTHER APPROACHES

Most of the existing schemes present interesting theoretical solutions to perform threat assessment of CIs (based on simulations), while a limited number examines real world settings. To the best of the authors' knowledge, there are not any similar schemes, providing threat analysis of CIs, based on the cargos and routes of ADR trucks and using specific *LoTs*. Nevertheless, in this subsection, comparison of the proposed to three existing schemes is provided. In particular: (a) the complexity of the proposed scheme is compared to the complexity of a linear scheme [69], where the concept of omni-directional propagation of the proposed scheme is compared to the one presented in [70], where sensors/cameras are mounted along the perimeter fence of a CI and (c) the estimated surveillance equipment cost of

**Complexity Comparison** 



FIGURE 12. Complexity comparison of the proposed scheme and of [69].

the proposed scheme is compared to the cost of [71], where surveillance of the area of a CI is accomplished by a grid of sensors.

In terms of complexity, our scheme proposes fusion of Voronoi segments to estimate the ATA of each CI. In the linear case (omni-directional wave propagation), the threat is estimated for all  $cp_b s$ , irrespectively of their distance from the blast. Figure 12 illustrates complexity of the proposed scheme and of [69] for a random selection of 300 different time instances (300 instances of possible explosion). As it can be observed, the proposed method reduces computational complexity compared to the linear approach. The average reduction is 3.92 times, providing an average calculation time of 362.73 msec versus 1,422.83 msec for the linear approach (74.5% improvement). Additionally, for the specific settings and for the performed experiments, in most cases the linear approach cannot work in real time (blue line), while the proposed approach is always real time.

In terms of threat notification time, the proposed scheme suggests starting the surveillance of each CI at a maximum distance of 1,000 meters away from the outer crucial points. This is due to the fact that in case of Mass5, an explosion becomes extremely dangerous for a  $cp_b$ , less than 100 meters away. Even for Mass1, an explosion is extremely dangerous for less than 200 meters. Furthermore, for a truck moving with a speed of 60-90 km/h, it takes 48/32 seconds to cover 800 meters (approach at 200 meters) and 54/36 seconds to cover 900 meters (approach at 100 meters). This time is enough for trained forces to stop a possible attack. On the other hand, in [70] sensors/cameras are mounted along the perimeter fence of a CI. Even if a truck can be detected and its size can be estimated at every point of the field of view of a fence-mounted sensor/camera, in several cases the structure and morphology of the roads do not allow large radiuses of surveillance, for the specific settings and for the performed experiments.

Figure 13 provides the comparison of the average threat notification time of the proposed scheme and of [70]. As it can be observed, the average threat notification time is: (a) 7.7 seconds for [70] and 42.2 seconds for the proposed,



FIGURE 13. Threat notification time comparison of the proposed scheme and of [70].

in case of  $CI_1$ , (b) 5.5 seconds for [70] and 48.5 seconds for the proposed, in case of  $CI_2$ , (c) 6.1 seconds for [70] and 45.1 seconds for the proposed, in case of  $CI_3$ , (d) 5.3 seconds for [70] and 41 seconds for the proposed, in case of  $CI_4$ , (e) 4.4 seconds for [70] and 43.9 seconds for the proposed, in case of  $CI_5$ . On average, the proposed scheme notifies of a threat 7.9 times faster than [70] (86.9% improvement). Here it should be stated that threat notification times are estimated for the minimum distance that a truck may approach a CI. For this minimum distance, threat is at a maximum level, thus threat notification times are even smaller for lower threat levels.

Finally, in terms of estimated surveillance basic equipment cost, the proposed scheme is compared to [71], where surveillance of the area of a CI is accomplished by a grid of sensors. In particular the scheme in [71] presents a grid (with grid size  $5m \times 5m$ ). In the performed experiments about 21 - 35 % of the rectangles of the grid contained a set of hardware components (ARM-based CPU with 800 MHz, 512 MB RAM, 512 MB flash memory, power requirement of about 1.5 W, iSense sensor node, iSense Core Module (CM30I), iSense Gateway Module (GM20-P) and iSense GPS Module (GPSM10S)). There are several different combinations of similar hardware components in Farnell, Ebay and other sites, starting at about 30 Euro. On the other hand, 4G outdoor wireless cameras start at about 100 Euro (Amazon, Ebay etc.). A rectangle to include all CIs under examination, covers an area of about 70 km<sup>2</sup>  $(56 \text{ km}^2 \text{ by excluding sea segments})$  and in this case the cost of [71] would be enormous. In order to provide an as fair comparison as possible, this paper considers a surveillance area at a maximum distance of 1,000 meters from a CI. Figure 14 provides comparison of the proposed scheme and for [71], for the same maximum distance and for the same highways/avenues.

Here it should be mentioned that: (a) some highways/avenues pass from more than one CI and in these experiments the cost has been properly split between CIs, (b) for [71], the lowest equipment coverage (21%) was assumed, (c) the total cost (March 2022) for the proposed scheme is about 1,300 Euro, while for [71] it is about 96,000 Euro (98.6% improvement), and (d) [71] may provide higher accuracy regarding the exact position of each truck compared to the proposed approach, but for a significantly higher cost.



**FIGURE 14.** Cost comparison of the proposed scheme and of [71] for each of the *CIs* under consideration.

Additionally, for the specific setup and for the performed experiments, the position accuracy of the proposed scheme is satisfactory.

#### **VI. CONCLUSION**

*CIs* can be destroyed in minutes, with insignificant cost or with no cost, if terrorists hijack and turn ADR trucks into moving bombs.

This paper focused on threat assessment of neighboring *CIs*, three scenarios were analyzed and a novel fusion technique of the non-overlapping segments of the Voronoi tessellation was proposed. Additionally, an innovative algorithm was introduced for threat assessment and extensive real-world experiments were carried out.

Future work can focus on different aspects of the problem. For example, toxicity, radioactivity, carcinogenesis, mutagenesis, teratogenesis etc. of the various substances can be considered and a more spherical threat assessment estimation framework can be examined. Sea and air *ATAs* can also be defined, and new surveillance methods can be proposed. Additionally, in detecting trucks, occlusion problems should be confronted, by possibly using multiple cameras/sensors. A lot of work can also be done to provide specific rules of each individual infrastructure. Different scenarios can be covered e.g. for setting the complete *CI* or part of the *CI* out of order.

Furthermore, *CI*-specific blast wave physics could be examined both for a single and for multiple explosions. Finally, *CI*-specific plans for truck ramming attacks could be analyzed, since trucks may forcibly penetrate into *CIs* to approach specific crucial points that are not located near the security fence/wall of the *CI*.

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