# An innovative emergency transportation scenario for mass casualty incident management Lessons learnt from the Formosa Fun Color Dust explosion

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# Abstract

The purpose of this research is to analyze and introduce a new emergency medical service (EMS) transportation scenario, Emergency Medical Regulation Center (EMRC), which is a temporary premise for treating moderate and minor casualties, in the 2015 Formosa Fun Color Dust Party explosion in Taiwan. In this mass casualty incident (MCI), although all emergency medical responses and care can be considered as a golden model in such an MCI, some EMS plans and strategies should be estimated impartially to understand the truth of the successful outcome.

Factors like on-scene triage, apparent prehospital time (*app*PHT), inhospital time (IHT), and diversion rate were evaluated for the appropriateness of the EMS transportation plan in such cases. The patient diversion risk of inadequate EMS transportation to the first-arrival hospital is detected by the odds ratios (ORs). In this case, the effectiveness of the EMRC scenario is estimated by a decrease in *app*PHT.

The average *app*PHTs (in minutes) of mild, moderate, and severe patients are 223.65, 198.37, and 274.55, while the IHT (in minutes) is 18384.25, 63021.14, and 83345.68, respectively. The ORs are: 0.4016 (95% CI=0.1032–1.5631), 0.1608 (95% CI= 0.0743–0.3483), and 4.1343 (95% CI=2.3265–7.3468; P < .001), respectively. The *app*PHT has a 47.61% reduction by employing an EMRC model.

Due to the relatively high *app*PHT, diversion rate, and OR value in severe patients, the EMS transportation plan is distinct from a prevalent response and develops adaptive weaknesses of MCIs in current disaster management. Application of the EMRC scenario reduces the *app*PHT and alleviates the surge pressure upon emergency departments in an MCI.

**Abbreviations:** *app*PHT = apparent prehospital time, ED = emergency department, EMRC = Emergency Medical Regulation Center, EMS = emergency medical service, EMT = emergency medical technician, GIS = geographic information system, IHT = inhospital time, IRB = Institutional Review Board, MCI = mass casualty incident, MOHW = Ministry of Health and Welfare, OR = odds ratio, yo = years old.

Keywords: dust explosion, emergency medical regulation center (EMRC), emergency medical service (EMS), EMS transportation, mass casualty incident (MCI)

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# 1. Introduction

Over the last few decades, natural and man-made disasters have become more intense and frequent,<sup>[1–4]</sup> as catastrophic mass casualty incidents (MCIs) are more frequent than before. The unexpectedly heavy caseload of casualties will force the emergency medical services (EMSs) system to plan an adequate strategy for saving the golden hours of the injured. Therefore, lessons learned from the MCIs will boost the improvement and adaptation of the EMS system.<sup>[5,6]</sup>

The EMS systems may be different depending on the action plans and the strategies in the model of transportation and the constitution of the EMS team in various countries.<sup>[7,8]</sup> In particular, for EMS transportation, the Anglo-American model is performed according to the "patient to doctor" plan, whereas the Franco-German model to the "doctor to patient" plan.<sup>[9–11]</sup> Different transportation models will produce different EMS teams, maybe consisting of emergency medical technicians (EMTs), doctors, and nurses for prehospital care in various settings. In Taiwan, the EMS system adopts the Anglo-American model, in which patients are transported to hospitals ordinarily by 2 EMTs.<sup>[12–14]</sup>

Planners and researchers are concerned about reducing the EMS transportation time as well as distance during MCIs.<sup>[5,14]</sup> Plans, such as the 3 phases of prehospital patient care following an earthquake, are being reviewed to diminish immediate mortality.<sup>[15]</sup> In addition, other investigators have applied the geographic information system (GIS) for a path design to implement effective and time-saving transportation.<sup>[16]</sup> Aero-transportation is another leading force during an MCI, which is recommended to address on-land transportation challenges.<sup>[17]</sup> However, there is much room for improvement in EMS transportation studies, especially on a systemic revolution aspect.

The MCIs wrought havoc in the EMS system due to an unexpected surge of casualties. Once the emergency response and mass casualty incident management cannot perform well in an MCI, it will delay the medication and put the patients in danger with a poor prognosis. Undoubtedly, no disaster can be repeated in a real scene for a drill and training. However, many historical case studies can provide plenty of data and experience to improve the EMS plans and the preparedness stage in disaster management. Unfortunately, valuable information is sometimes covered by the successful medical outcomes of animated controversies, such as the case discussed in this article.<sup>[18–22]</sup> The detailed EMS transportation plan was examined by the appropriateness and reasonable means to learn the lessons for facing an unpredictable MCI similar to the Formosa Fun Color Dust Party explosion.

Large casualty caseloads push EMS providers to brainstorm an appropriate adaptation. Once the overloaded patients in an MCI surge to the emergency departments (EDs) of the response hospitals, 2 questions will be asked: does the response ED have enough capacity to receive the patients? How can we reserve higher levels of medical resources for severely injured people? In order to resolve those questions, the Emergency Medical Regulation Center (EMRC) has been designed to accommodate moderate and mild cases to provide professional prehospital emergency medical care by physicians, while severe ones will be transferred to the EDs by first-line ambulances. It can prevent the competition of the medical center's resources between the urgent and non-urgent patients and release the surge pressure of EDs by employing the EMRC as a buffer space. EMRC is a transient location or building near the disaster area, while supported medical teams will provide first aid and stabilize conditions of moderate and mild patients. EMRC can be considered a conceptual term since its format is modified based on the demands of each incident. For example, in the Boston Marathon bombing in the USA,<sup>[23–25]</sup> the EMRC may have included tents and carpets, while during the Chi–Chi earthquake disaster in Taiwan,<sup>[26,27]</sup> schools and stadiums were provided to cover the patients' needs. In other words, EMRC can be considered as an innovative design for disaster response, emergency transportation, and patient distribution; therefore, the model will be scenarioing in the Formosa Fun Dust explosion MCI.

## 2. Methods

On 27th June 2015 in Taiwan, the Formosa Fun Color Dust Party explosion caused 499 people with different degrees of burn wounds to be transported to the hospitals via different means such as ambulances, taxis, private cars, and military vehicles. Due to the policy of the local health sectors, the casualties in situ were evacuated within 3.5 hours approximately. Although the emergency transportation strategy is far from regular guidance, a triagebased transportation practice, the mortality rate is quite low (about 3%). Therefore, it is worth evaluating the EMS transportation plan thoroughly in such a case to learn the lessons for a burn MCI revolution and try to develop an adaptive EMS transportation plan to reduce the deficiency and improve efficiency.

The patient's data of age, sex, on-scene triage, admitted hospitals, and ED arrival times were adopted from a previous study of the 2015 Formosa Fun Color Dust Party explosion. Real-time tracing of the patients' health status records was retrieved from the Emergency Medical Management System of the Ministry of Health and Welfare (MOHW) (http://ems.mohw. gov.tw/). The raw data was obtained by one of our team members who has legal access to the database. All acquisitions and applications have proceeded carefully according to the regulations of MOHW as in previous research.<sup>[20]</sup> The study was reviewed by the Institutional Review Board (IRB) at Changhua Christian Medical Center (IRB No. 200907), which judged it to be exempt from further review. The IRB waived the requirement for informed consent for this study.

Since the emergency conditions of the explosion site, records of ambulance arrivals and departures, transportation time, and onscene time were missing; apparent prehospital time (*app*PHT) can be defined as the time from the initiation of the explosion until the time patients registered and admitted to the ED.

AppPHT and inhospital time (IHT) for the 3 triage leveled patients are subjected to trimming the outliers by applying the *Z*score method.<sup>[28–30]</sup> The outliers are trimmed beyond the range of -3 < Z < 3; therefore, the *app*PHT and IHT outliers will be excluded from both average time calculations. The percentage of outliers in *app*PHT and IHT is less than 3% for all cases.

Based on a general perspective, less *app*PHT means the patients transported to the EDs in a prior order, while the patients will be delayed to reach the hospitals with a long *app*PHT. Besides, the IHT can be defined as the time period from the patient's arrival in the hospital until the patient gets discharged regardless of the number of hospitals a patient has been transferred to.

A statistical method of odds ratio (OR) can be employed to evaluate the EMS transportation effects on patients with different medical conditions. According to standard EMS protocol, severely injured patients should be transferred to the medical centers, moderately injured to the regional hospitals, and patients with mild injuries to the district hospitals, based on the on-scene

# Table 1

The definition of terms of the odds ratio analysis for the EWS transportation in the Formosa Fun Golor Dust explosion.
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	OR		
	With diversions	Without diversions (as a reference)	
First transportation to an inadequate hospital First transportation to an adequate hospital (as a reference)	D <sub>E</sub> D <sub>N</sub>	H <sub>E</sub> H <sub>N</sub>	

<sup>\*</sup> OR: odds ratio; the equation is:  $OR = \frac{D_E/H_E}{D_R/H_R}$ .

triage. If the primary distribution of the patients is done adequately, then there is no need for other diversions. On the contrary, the diversions were unavoidable, and the risk exposure rates of the patients became high due to the extra extended transportation time, especially in the case of severe patients. The definition of terms in an OR table is shown in Table 1.

The OR values of patients with 3 different levels of on-scene triage are separately computed. Once a high OR value (>3, experientially) is observed, first inadequate emergency transportation will have a strong connection with secondary diversion. That is to say, the EMS transportation plans and strategies may argue a change in facing such an MCI.

In this research, a new EMS transportation scenario was proposed and considered. There are 2 essential elements, the EMRC, and the two-stage transportation method, which shall be defined briefly for the idea. EMRC is a conceptual construction to accommodate the mild and moderate patients for providing a first aid treatment, while the two-stage transportation method categorizes the ambulances into 2 lines. First-line ambulances will reciprocate between the disaster area and an EMRC in a general situation, and the patients with the severe condition will be transported to the response EDs directly by the same first-line ambulances. Moreover, second-line ambulances are located in an EMRC on standby to receive orders from physicians to transport unstable patients to the recommended hospitals.

In our case, time efficiency can be determined by a reduction in *app*PHT through the EMRC scenario. Since the Formosa Fun Water Park can be selected as a competent location to set up an EMRC in the unaffected area of the Park, the mild and moderate patients will be retented in situ without any ambulance transportation. As a result, first-line ambulances are only transporting severe casualties to the EDs in this case. The *app*PHT of mild and moderate patients will be sent and treated in the nearby EMRC. Therefore, the total *app*PHT in an EMRC model is calculated by the *app*PHT of severe patients majorly.

# 3. Results

The basic information on 499 casualties is shown in Table 1. The youth whose age is defined between 15 and 24 years old (yo) takes a large percentage of the injured population (64.13%); also, the average age was  $23.37 \pm 4.53$  yo (maximum: 39 yo; minimum: 13 yo). The on-scene triage data is a critical factor for the subsequent analyses since it can provide persuasive medical evidence for selecting a competent response hospital for emergency transportation. In order to apprehend the EMS transportation policy in this dust explosion incident, the *app*PHT is assessed to differentiate patients with which level of injury will arrive at the hospitals within the shortest period. There is only a slight discrepancy in the *app*PHT under 40% of the population

approximately in each triage level (Fig. 1). The EMS transportation has followed the "To see is to send" policy regardless of the on-scene triage results. The average *app*PHTs and IHTs for each category are listed in Table 2. Based on previous research, extended prehospital time will cause a poor prognosis and may prolong the IHT.<sup>[31–35]</sup>Figure 2 depicts the interaction between *app*PHT and IHT of the 3 on-scene triaged patients. The *app*PHTs of the mild and moderate patients scattered in a bandlike range along the IHT axis; nevertheless, there are 2 obvious bands in the chart of the severe patients. This unusual phenomenon may exist in some unexplored practical meanings; therefore, it will get discussed in the subsequent section.

The detailed categorization of the patient is shown in Table 3 for further OR analysis to evaluate the diversion risk in the EMS transportation approach. The diversion rates of mild, moderate, and severe patients are 20.93%, 24.54%, and 46.46%, respectively. Similarly, the ORs for the 3 groups are 0.4016 (95% Cl, 0.1032–1.5631), 0.1608 (95% Cl, 0.0743–0.3483), and 4.1343 (95% Cl, 2.3265–7.3468) (Table 4).

The conceptual idea of the EMRC model is depicted in Figure 3. Based on patient retention capability, time efficiency has increased to 47.61% by reducing the *app*PHT of moderate and mild patients (Fig. 4).

# 4. Discussion

The case of the Formosa Fun Dust explosion is a classic focal disaster, noting its main difference with historical incidents is the age of the casualties involved. The indications in Figure 1 revealed that the EMS transportation in this calamity followed a "To see is to send" model; in other words, the on-scene triage may not be the main criterion for determining the priority patient transportation. The delay of the severely injured patient will cause pernicious consequences, which are well-discussed in other researches.<sup>[36–38]</sup> However, EMS transportation in such a burn MCI creates a space for further discussions.

Based on the results of IHT vs *app*PHT diagrams (Fig. 2), the IHT is independent of the *app*PHT among the 3 triaged groups. This phenomenon is quite different from the previous researches and practical evidence.<sup>[39–43]</sup> The key reason may be political interventions.<sup>[44]</sup> Since the incident was well-known headline news, the government of Taiwan exercises the public authority to take care of all the casualties by converging the medical workforce and resources, exempting the medical expenses, and providing indefinite IHT. Hence, the longer IHT is proposed due to the incapability of the IHT computation in a conventional manner. It can also explain the low mortality rate compared to other similar cases. Nevertheless, the average IHTs of mild, moderate, and severe patients correspond to their injured conditions.

Due to the policy of the local government, the central dogma of EMS response is the disaster area clearances as speedily as possible. Consequently, the patients in minor conditions



Figure 1. The prehospital time analyses for three-leveled patients. A zoom-in chart is shown inside the figure.

occupied the resources of high-level emergency response hospitals in the initial stage; hence the severe ones had no choice but to divert to other medical centers. Moreover, a portion of the severe patients had relevant extended *app*PHTs. A reasonable inference is that the severe patients near the explosion site cannot move to the ambulances by themselves, and the pathways are all blocked

# Table 2

The b	background	information	of the 499	casualties i	n the	Formosa	Fun	Color	Dust	explosion.
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		On-scene triage			
	Total	Mild	Moderate	Severe	
Number of casualties	499	86	163	226	
Gender:					
Male	242	51	88	103	
Female	233	31	75	123	
Age	$23.37 \pm 4.52$	$24.15 \pm 4.52$	23.47 ± 5.12	22.98±3.77	
Average apparent prehospital time (min)	232.19	223.65	198.37	274.55	
Average inhospital time (min)	54917.02	18384.25	63021.14	83345.68	



Figure 2. The interactions between apparent prehospital time and inhospital time in different triage levels. Panels A–C, indicates mild, moderate, and severe casualties, respectively.

by the patients and crowds. According to the OR results, inadequate emergency transportation will correspond to the diversion risk in severe patients. It clarifies that the EMS plan of "To see is to send" in this case should be improved, especially in an emergency transportation aspect.<sup>[44]</sup>

A more effective EMS transportation scenario is introduced in this research, combined with the ideas of the EMRC and the twostage transportation method. In this case, we select the Park area to set up the EMRC since the in situ space is large enough to accommodate the casualties and the shortest distance between the disaster area and EMRC. The first-line ambulance transportation of mild and moderate patients can be saved for severe casualties, especially in OHCA cases. Moreover, severe patients can be transferred directly to the response hospitals without competition from the ED beds by moderate and mild patients. Since moderate and mild patients will get retained by EMRC, it can create extra time and space for response hospitals to release the patient surge pressure of an MCI. This will help alleviate the mental pressure of ED physicians and casualties such as burnout syndrome, disaster traumatic stress, anxiety depression, and social anxiety.<sup>[45,46]</sup> In



the case of an inexhaustible capacity of the EMRC for moderate and mild patients, the transportation time may have a 47.61% decrease than the EMS transportation action plan in this MCI.

## 5. Limitations

The prime limitation of this research is the uncertain *app*PHT intervals. The general definition of total prehospital time includes response time, on-scene time, and transportation time.<sup>[47]</sup> Since the prehospital time data for the Formosa Fun

Color Dust Party explosion case is missing due to the chaotic condition; the *app*PHT is defined as a time interval from the initiation of the explosion until the time patients registered and admitted to the ED. Therefore, the error cannot be excluded during the calculation of *app*PHT. Another limitation of this research is the establishment of EMRC. Several factors should be considered for a competent EMRC, such as the capacity, the site for set up, traffic flow between EMRC and EDs, and stampede management. In this study, we had selected the unaffected area of Formosa Fun Park as the EMRC; neverthe-



Figure 3. An EMRC scenario for the EMS transportation. All casualties will be transported to the response hospitals directly in conventional EMS transportation (light-blue background). The EMRC-based model will retented the moderate and mild patients for a first-aid treatment, while the unstable patients can be systemically transported to the response hospitals based on the orders of EMRC physicians. Nevertheless, the severe patients will be transferred straight from the disaster area to the response hospitals without any retention (light-green background). EMRC, Emergency Medical Regulation Center; EMS, emergency medical service.

# Table 3

The primary and	secondary	distribution	of	different	categorized
patients in the Fo	rmosa Fun	explosion e	ver	nt.	

On-scene triage	Primary distribution	Secondary distribution
Severe (n = 226)	Medical center (n=142)	Medical center $(n = 31)$ Regional hospital $(n = 16)$ District hospital $(n = 1)$ No diversion $(n = 94)$
	Regional hospital (n=77)	Medical center $(n = 33)$ Regional hospital $(n = 18)$ District hospital $(n = 0)$ No diversion $(n = 26)$
	District hospital (n $=$ 7)	Medical center $(n = 2)$ Regional hospital $(n = 2)$ District hospital $(n = 0)$ No diversion $(n = 1)$
Moderate (n = 163)	Medical center (n=105)	Medical center $(n = 7)$ Regional hospital $(n = 2)$ District hospital $(n = 1)$ No diversion $(n = 95)$
	Regional hospital (n=51)	Medical center $(n = 17)$ Regional hospital $(n = 5)$ District hospital $(n = 3)$ No diversion $(n = 26)$
	District hospital $(n = 7)$	Medical center $(n = 2)$ Regional hospital $(n = 3)$ District hospital $(n = 0)$ No diversion $(n = 2)$
Mild (n=86)	Medical center (n=51)	Medical center $(n = 6)$ Regional hospital $(n = 3)$ District hospital $(n = 0)$ No diversion $(n = 42)$
	Regional hospital (n=24)	Medical center $(n=3)$ Regional hospital $(n=2)$ District hospital $(n=0)$ No diversion $(n=19)$
	District hospital (n=11)	Medical center $(n = 1)$ Regional hospital $(n = 3)$ District hospital $(n = 0)$ No diversion $(n = 7)$

n = number of patient(s).

less, the aptness of the EMRC in the Park should be evaluated by further research.

Equally important is to consider the arguments between onscene triage and ED triage. We adopted the on-scene triage outcomes for the patient classification in this research since the on-scene triage is the principal reference for EMS transportation. However, an unpredictable error might exist when evaluating the diversion risk in an OR analysis.





# 6. Conclusions

Injuries, illnesses, and also deaths have resulted from floods, storms, fires, droughts, heatwaves, and other natural and manmade disasters that are on the increase. Therefore, the EMS providers should scheme out an adaptive plan to face the unpreventable MCIs. In this MCI, although all the evaluation data using the mortality or patient clearance time as indexes showed remarkable success in the EMS action, some weaknesses in the EMS transportation plans should be emphasized to improve patient safety in future actions. However, an innovative scenario of EMRC is introduced in this research to enhance the efficiency of emergency transportation and reduce the surge pressure on response EDs. In order to obtain the optimized efficiency of the EMRC-based emergency transportation model, issues such as command system establishment, site selection, medical staff, supplies requests, information network, ambulance allocation, and surge capacity analyses should be considered in the additional studies.

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## Table 4

The odds ratios of EMS transportation strategies cause a next diversion for the three-leveled patients.

		On-scene triage				
	Severe	Moderate	Mild			
Diversion rate*	46.46%	24.54%	20.93%			
Odds ratio (95% Cl)	4.1343† (2.3265–7.3468)	0.1608 (0.0743–0.3483)	0.4016 (0.1032–1.5631)			

CI = confidence interval, EMS = emergency medical service

\* Among different hospital levels.

<sup>†</sup> P<.0001.

# **Author contributions**

All listed authors meet their authorship requirements. M-WL and C-LP conceived the study. Z-PW, C-FC, and C-WC collected the data and shared their experience in the matters of the emergency medical response during a disaster. Their contribution and ideas were extremely important to understand the real conditions of the case study. J-CW supervised all the details of this research. MWL, C-LP, C-HL, and J-CW performed a literature review and drafted the initial manuscript. All authors thoroughly revised the manuscript. J-CW takes responsibility for the paper as a whole. **Conceptualization:** Ming-Wei Lin, Chih-Long Pan, Jet-Chau Wen.

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