



Article A Coupling Optimization Method of Vehicle Structure and Restraint System for Occupant Injury Protection in Traffic Accidents

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Abstract: Vehicle front-end structure has the characteristic of symmetry. The damage of occupants in the crash process is determined by the combined effect of the front-end structure and the restraint system of the vehicle. In this paper, the coupling relationship and an optimized method for the vehicle front-end structure and restraint system are studied based on vehicle crash dynamics, to reduce occupant injury. A fast solution algorithm for occupant motion response was established using a crash analytical model. Then, an occupant response database was established using the algorithm, to analyze the coupling relationship between the crash pulse and the restraint specific stiffness, with respect to the curve shape and parameters. The results showed that the combination of the concave crash pulse and upward restraint stiffness curve was the best coupling. Subsequently, a coupled optimization method of a concave pulse and upward restraint stiffness was proposed and combined with a crash analytical model and genetic algorithm (GA). The crash pulse and restraint stiffness of vehicle crash data from the NHTSA databases were optimized, as an example, to verify the effectiveness of the method. The optimal occupant acceleration was reduced by 44%. In addition, the feasibility of the optimal result is discussed, to provide a reference for occupant injury protection in traffic accidents.

Keywords: occupant injury; vehicle crash pulse; occupant restraint system; optimization design

1. Introduction

In recent years, with the rapid development of the global economy and science and technology, the automobile industry has been growing and car ownership is constantly increasing [1,2]. The ensuing traffic safety problems are an increasing concerned for society. According to a World Health Organization statistics report, road traffic accidents are the eighth leading cause of death worldwide and about 1.35 million people die in traffic accidents every year [3,4]. In road traffic accidents, the probability of a frontal crash is the highest, accounting for about 40% [5]. Therefore, it is of great significance to reduce occupant injury in vehicle frontal crashes, to improve road traffic safety [6].

In a vehicle frontal crash, occupant injury is determined by the front-end structure and restraint system [7,8]. The front-end structure of a vehicle includes the front anticollision beam, energy absorption box, longitudinal beam, front seats, and sub-frame, etc., which have good symmetry in space. In current engineering design strategies, the design of the front-end structures occurs before the restraint system [9,10]. In recent years, experts have used vehicle structure crashworthiness design to increase the structural energy absorption and stability in the crash process, so as to increase the safety of occupants. Qin et al.



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Copyright: © 2023 by the authors. Licensee MDPI, Basel, Switzerland. This article is an open access article distributed under the terms and conditions of the Creative Commons Attribution (CC BY) license (https:// creativecommons.org/licenses/by/ 4.0/). proposed a two-level multiple cross-sectional shape optimization of an automotive body frame, to obtain the optimal transfer path of vehicles during a crash [11]. Szlosarek et al. studied the crushing properties of carbon fiber for application to the front-end energy absorption structure of vehicles [12]. Zhang et al. proposed bio-inspired multi-cell tubes with quadrilateral, hexagonal, and octagonal sections, to design a crashworthy body structure [13].

Other studies did not discuss the specific design method of the front-end structure of the vehicle body, but studied the impact of the vehicle crash pulse on occupant injury in the process of a frontal collision [14]. Some computer-based method are also been applied to obtained the influence rule of parameters, e.g., multitask learning network [15]. Crash pulse is the acceleration of a vehicle in the collision process, which can be used as the overall design objective of the front-end structure of an auto-body and also as the basic data to design a restraint system [16]. Iraeus et al. analyzed the effect of the minimum pulse shape on chest injury prediction in real-life frontal crashes [17]. Ito et al. optimized the crash pulse to protect occupants at various impact velocities [18]. Urbina et al. simplified the crash pulse and designed its crashworthiness to reduce occupant injury [19].

The design of a restraint system is usually carried out after the design of the vehicle body structure and crash pulse [20]. Huang et al. optimized airbag parameters for the Chinese body size [21]. Liu et al. conducted multiobjective optimization of the cooperative controls between the autonomous emergency steering (AES) and occupant restraint system (ORS) in a vehicle frontal crash [22]. Wang et al. proposed a multiobjective optimization design for an occupant restraint system considering interval correlation [23]. These restraint system design methods mainly focused on the optimization of the system parameters but ignored a synchronous design with the body structure. This leads to a small design space for the restraint system and difficulties in compensating for defects in the structural design [24]. It is necessary to present design requirements from the perspective of "restraint coupling" in the initial phase of the safety design. How to achieve the best occupant protection effect from the perspective of coupling design is the key problem addressed in this paper.

From the perspective of vehicle dynamics, the occupant response in the crash process is determined by the vibration coupling effect between the front-end structure and the restraint system [25]. As the response parameters related to coupling are numerous and interactional, coupling effect is studied in the theoretical field of crash dynamics. Huang et al. [25] simplified the complex vehicle frontal collision process into a classical mass spring model and proposed that the relationship between the crash pulse and restraint system is vibration coupling. Considering a simplified linear restraint system, Cheng et al. [26] suggested that an optimal coupled design of vehicle structure and ORS can make the occupant response a constant value. Qiu et al. [27] pointed out the importance of the coupling between vehicle structure and ORS. Meanwhile, other researchers carried out relevant studies, in terms of the stiffness characteristics of ORS [28,29] and ride-down energy [30–32] and reported a series of coupling research results.

The above literature studied the optimal design of the crash pulse at a theoretical level using a simplified linear restraint stiffness and discussed the division of energy absorption between the vehicle structure and ORS. The existing design methods simplify ORS into a linear system, which is convenient for theoretical calculation, but cannot guide the parameter design of the restraint system, due to the few characteristic parameters involved. In addition, while the existing studies focused on the coupling between crash pulse and restraint systems, they still cannot be designed synchronously. Moreover, specific coupling design strategies or methods with engineering guiding significance have not yet been formulated. Thus, based on a simple vehicle–occupant crash analytical model, this paper established a database of crash pulse and restraint system stiffnesses–occupant responses. Design strategies for the crash pulse and restraint system stiffness curve, regarding shape and parameters were studied through a database analysis. A coupling optimization algorithm is proposed, to design crash pulse and restraint system parameters simultaneously. This coupling method provides a target for the crashworthiness design of

complex and symmetrical vehicle front-end structures and avoids the process of repeated trial and error in structural design.

Compared with the existing references, this work makes four contributions: (1) a fast solution algorithm of occupant motion response is derived using a crash analytical model, with the input of crash pulse and restraint stiffness; (2) from a qualitative perspective, the coupling relationship of the curve shape and parameters between the crash pulse and restraint system stiffness are analyzed using an occupant response database; (3) combined with a crash analytical model and GA, a coupled optimization method is established, to design parameters for crash pulse and restraint system stiffness; (4) finally, the feasibility of an optimal design scheme to protect the occupant in traffic accidents is discussed.

2. Fast Solution Algorithm for a Vehicle—Occupant Crash Analytical Model

2.1. Vehicle–Occupant Crash Analytical Model

Matthew Huang et al. [25] used a classical simplified vehicle–occupant crash analytical model, which selected appropriate description parameters from the complex nonlinear system, to elaborate the interactions among the vehicle, occupant, and restraint system during the crash process. In the model, the vehicle and the occupant were simplified to mass blocks. The front-end structure and the restraint system were simplified to springs, according to the energy absorption characteristics. The relationship between the front-end structure and the restraint system was essentially vibration coupling. The vibration response of the occupant was solved by the frontal crash model, with the crash pulse as the system excitation and the restraint system characteristics as the system stiffness. This model was verified in the references [33–35].

The vehicle–occupant crash analytical model in Figure 1 can be further simplified under the condition that the crash pulse is known. As shown in Figure 1, M and m are the mass of the vehicle and occupant, respectively; x_v and x_o are the displacement of the vehicle and the occupant, respectively; and k is the equivalent stiffness of ORS. The occupant response is the result of the coupled vibration of the crash pulse a(t) and the equivalent stiffness k of ORS. The vibration equation can be expressed by Equation (1).

$$\begin{aligned} \dot{x}_{o/v} + \frac{k}{m} x_{o/v} &= -\ddot{x}_v \\ \dot{x}_{o/v} + \frac{k}{m} x_{o/v} &= -\ddot{x}_v \end{aligned} \tag{1}$$

where $x_{o/v}$ is the displacement of the occupant relative to the vehicle, and $\ddot{x}_{o/v}$ is the acceleration of the occupant relative to the vehicle. The motion response of the occupant is calculated as

$$\alpha_o = A\sin(\omega_n t + \varphi) + R(\ddot{x}_v) + x_v \tag{2}$$

where *A* is the amplitude, ω_n is the natural frequency of ORS, φ is the phase angle, and $R(\ddot{x}_v)$ is the particular solution of the vibration equation.



Figure 1. Vehicle–occupant crash analytical model.

2.2. The Approximation of Vehicle Crash Pulse

The crash pulse is the deceleration history of the vehicle during a crash, which records various physical quantities of the crash. Due to the relative complexity of a crash pulse, it is difficult to establish a direct relationship with the structural parameters of the vehicle. Therefore, a crash pulse often needs to be simplified to support the study of the crashworthiness of a vehicle.

The frequently used simplified crash pulses include an equivalent square pulse, equivalent dual-trapezia pulse, multi-step pulse, and Fourier pulse. These equivalent pulses can reflect a series of important information during the crash, the crash energy, and the moment of maximum deformation. The appropriate equivalent pulse should be selected to meet the specific needs when analyzing different problems.

Theoretically, the crash pulse can be simplified into any form required by the research purpose, but the simplified pulse needs to meet the fundamental criteria of the crash pulse [36], which are detailed as follows:

1. The integral of the simplified pulse in time domain equals the initial crash velocity of the vehicle.

$$v_0 = \int_0^{t_E} a(t)dt \tag{3}$$

- 2. The vehicle decelerates from the initial crash speed to zero, the time t_E remains unchanged.
- 3. The displacement obtained by simplified pulse equals the maximum deformation displacement of the vehicle d_{max} .

$$d_{\max} = \int_0^{t_E} \left[v_0 - \int_0^{t_E} a(t) dt \right] dt$$
 (4)

4. The integral of the simplified crash pulse in the displacement domain equals the total energy absorption of vehicle in the crash, which is the initial kinetic energy of the vehicle.

$$\frac{1}{2}v_0^2 = \int_0^{d_{\max}} a(d)dd$$
 (5)

2.3. The Approximation of Occupant Restraint Stiffness

As shown in Figure 2, the ORS is mainly comprised of the seat belts, airbags, seats, and other parts. When a crash occurs, the ORS restricts the occupant motion in the vehicle, by exerting force on the occupant for purpose of occupant protection [37–40].



Figure 2. Restraint subsystem forces.

The comprehensive response of ORS can be expressed by the stiffness characteristics of the restraint system. To facilitate research and applications in conceptual design, a series of simplified methods can be made using the characteristics of the ORS. The current simplified methods for restraint system stiffness curves include single linear restraint stiffness, bilinear restraint stiffness, trapezoidal restraint stiffness, and double trapezoidal restraint stiffness.

The simplified stiffness characteristics for the restraint system should satisfy the following basic criteria:

- (1) The maximum relative displacement of the occupant D_{ov} remains unchanged.
- (2) The energy absorbed by the ORS remains unchanged.

2.4. Fast Solution Algorithm of Occupant Response

The occupant response can be obtained directly by solving the vehicle–occupant crash analytical model. However, the solution process of the differential equation becomes very difficult when the input crash pulse or restraint stiffness is relatively complex. Therefore, based on the definition of ORS, a fast solution algorithm for the vehicle–occupant crash analytical model is introduced in this section [41]. The formulas of the fast solution algorithm are as follows:

$$\ddot{x}_{o}(i) = k(i)[x_{o}(i) - x_{v}(i)]$$
(6)

$$\dot{x}_{o}(i) = \dot{x}_{o}(i-1) - \dot{x}_{o}(i)t$$
(7)

$$x_o(i) = x_o(i-1) + \dot{x}(i)t - \frac{1}{2}\ddot{x}_o(i)t^2$$
(8)

The fast solution algorithm can be used as a quick tool to study the coupling relationship between the crash pulse and restraint stiffness.

In a FRB crash experiment, the front-end structure of the vehicle deforms, to absorb the impact energy, and the vehicle is in a deceleration process. However, the lower end of the B-pillar or the position of the seat beam deforms little during a frontal crash. Generally, the acceleration signal measured at the position without deformation in the collision process is taken as the crash pulse of the vehicle. After CFC60 filtering, a crash pulse extracted from the NHTSA database in a FRB condition for a certain vehicle is shown in Figure 3.



Figure 3. Crash pulse of a vehicle during a FRB test. (**a**) Crash pulse in the time domain. (**b**) Crash pulse in the displacement domain.

A crash pulse can be divided into time domain and displacement domain, according to the direction of its coordinates. A crash pulse in the time domain (shown in Figure 3a), namely the acceleration–time curve, is the kinematic signal that can be directly measured

in a collision test. In the vehicle safety development stage, a crash in the time domain can be used as the input condition for the restraint system, to calculate the occupant response. The crash pulse in displacement domain (shown as Figure 3b), namely the acceleration–displacement curve, is obtained by integrating the curve in the time domain twice. The acceleration–displacement curve represents the relationship between the crash force and the longitudinal (collision direction) position of the vehicle body, which can be used to guide the energy absorption design of the structure.

If the occupant is reduced to a particle, the force of the restraint system on the occupant can be made equivalent to a concentrated force, then the overall performance of the restraint system can be expressed using a restraint system characteristic. The curve of the occupant acceleration–relative displacement can approximately represent the force–displacement curve of the restraint system and is defined as a restraint stiffness curve. After CFC120 filtering, the restraint stiffness of a certain vehicle extracted from the NHTSA databases is shown in Figure 4. The shape characteristics of the constraint stiffness curve (black dashed line in Figure 4) were simplified to the bilinear restraint stiffness shown in the red line.



Figure 4. Restraint stiffness curve of a restraint system.

The crash pulse in Figure 3a was discretized, and the unit time after discretization was 0.0001 s. The discrete crash pulse and the simplified bilinear restraint stiffness were put into the vehicle–occupant crash analytical model, and then the model was solved using the proposed algorithm, to obtain the occupant acceleration, as shown by the red line in Figure 5. Compared with the occupant acceleration of the test data (black dotted line in Figure 5), the peak error of the calculated result was less than 1%, and the curve variation trend was basically the same. This indicated that the proposed algorithm has sufficient accuracy and could be used to further study the occupant response.





3. Analysis of the Coupling Relationship between Crash Pulse and Restraint Stiffness *3.1. Occupant Response Database*

Based on the crash pulse in Figure 3, a total of twenty simplified crash pulses are proposed. According to the simplification criteria for the crash pulse, the area between each simplified pulse and the time axis is equal to the initial crash speed of the vehicle in the FRB test: $v_0 = 15.64$ m/s. Using the crash pulse to calculate the velocity of the vehicle in the crash process, it can be shown that the velocity of the vehicle is zero at the time of 0.0693 s, and then the total width *t* of each simplified pulse in the time domain is 0.0693 s. As shown in Table 1, the simplified crash pulses are divided into five categories according to their shape: rectangular pulse, upward pulse, downward pulse, convex pulse, and concave pulse.

Table 1. Simplified crash pulses.





Table 1. Cont.

Based on the characteristic curve of the ORS in Figure 4, ten simplified restraint stiffness curves are proposed. Through calculation, the energy-absorbing density of the original restraint system is 75.42 $(m/s)^2$ and the maximum relative displacement is 0.3 m. According to the simplification criteria of the stiffness characteristics of the restraint system, the area between each simplified curve and axis of the relative displacement is equal to 75.42 $(m/s)^2$ and the total width D_{ov} of each simplified curve is 0.3 m. As shown in Table 2, the simplified restraint stiffness curves can be divided into three types according to their shape: upward curve, convex curve, and concave curve.



Table 2. Simplified restraint stiffness curves.

The occupant response database was established using the fast solution algorithm and y combining the simplified crash pulse (Table 1) and the simplified restraint stiffness curve (Table 2). The peak occupant accelerations extracted from the occupant response database are shown in Table 3.

3.2. Qualitative Analysis

To study the influence of the crash pulse shape and restraint stiffness curve on the occupant acceleration, the average peak occupant acceleration corresponding to each group of crash pulses and restraint stiffnesses in the occupant response database was calculated. The sequence number of the pulses, peak value of each set of crash pulses, and restraint stiffness curve, as well as the corresponding average peak occupant acceleration, are recorded in Table 4.

In Table 4, concave pulses (A16, A17, A18, A19, and A20) have a lower average peak occupant acceleration, which indicates that a concave pulse has a better coupling effect with restraint stiffness. In addition, the rectangular pulse A1 is a second-tier pulse, which is worse than the concave pulse. Except for A5, the average peak occupant acceleration of the upward pulses (A2, A3, A4, A6, and A7), downward pulses (A8, A9, A10, and A11), and convex pulses (A12, A13, and A14) increase with the increase of the peak value of the crash pulse. This shows that, for the upward, downward, and convex pulses, the pulses

B1	B2	B3	B 4	B5	B6	B 7	B8	B 9	B10
45.67	32.11	69.25	34.16	39.36	38.37	36.04	46.26	39.27	39.28
51.28	34.36	84.41	34.09	47.33	38.39	36.04	51.19	44.80	42.28
50.59	33.87	80.73	34.15	45.85	38.24	36.04	51.27	43.49	40.19
51.25	34.54	86.38	34.14	47.78	38.40	36.05	51.18	45.53	44.38
50.37	33.97	79.39	34.16	46.29	38.39	35.91	51.28	43.54	41.62
46.44	32.04	72.73	34.19	38.75	38.41	36.00	44.79	39.43	37.25
49.50	33.09	79.53	34.19	42.47	38.29	36.06	51.29	42.00	36.92
51.29	35.41	80.71	34.19	50.94	38.50	35.91	51.28	47.00	49.52
50.60	34.49	78.19	34.18	47.97	38.26	35.96	51.26	44.71	45.38
51.25	36.09	82.20	34.09	51.36	38.36	35.86	51.18	48.82	53.27
46.44	32.77	69.98	34.15	41.92	38.37	35.88	50.57	41.10	42.24
51.25	36.31	87.63	34.09	51.17	38.44	35.84	51.14	48.82	50.06
48.58	33.12	75.76	34.12	43.06	38.39	36.02	50.49	41.66	39.29
48.58	33.53	74.20	34.15	44.56	38.24	36.03	51.29	42.38	42.39
50.82	34.28	79.79	34.12	47.43	38.39	36.05	51.27	44.19	42.94
36.10	28.63	51.51	34.19	25.58	38.46	35.95	41.48	33.89	41.25
42.48	30.86	63.24	34.17	34.58	38.45	35.98	42.20	35.94	39.29
36.94	29.08	54.19	34.15	27.26	38.27	35.91	42.95	34.66	42.40
42.18	30.79	63.12	34.16	34.31	38.45	35.87	41.87	35.53	40.06
39.24	29.55	56.28	34.19	28.50	38.46	36.01	40.16	33.91	38.64
	B1 45.67 51.28 50.59 51.25 50.37 46.44 49.50 51.29 50.60 51.25 46.44 51.25 46.44 51.25 48.58 48.58 50.82 36.10 42.48 36.94 42.18 39.24	B1 B2 45.67 32.11 51.28 34.36 50.59 33.87 51.25 34.54 50.37 33.97 46.44 32.04 49.50 33.09 51.29 35.41 50.60 34.49 51.25 36.09 46.44 32.77 51.25 36.31 48.58 33.12 48.58 33.53 50.82 34.28 36.10 28.63 42.48 30.86 36.94 29.08 42.18 30.79 39.24 29.55	B1 B2 B3 45.67 32.11 69.25 51.28 34.36 84.41 50.59 33.87 80.73 51.25 34.54 86.38 50.37 33.97 79.39 46.44 32.04 72.73 49.50 33.09 79.53 51.29 35.41 80.71 50.60 34.49 78.19 51.25 36.09 82.20 46.44 32.77 69.98 51.25 36.31 87.63 48.58 33.12 75.76 48.58 33.53 74.20 50.82 34.28 79.79 36.10 28.63 51.51 42.48 30.86 63.24 36.94 29.08 54.19 42.18 30.79 63.12 39.24 29.55 56.28	B1B2B3B445.6732.1169.2534.1651.2834.3684.4134.0950.5933.8780.7334.1551.2534.5486.3834.1450.3733.9779.3934.1646.4432.0472.7334.1949.5033.0979.5334.1951.2935.4180.7134.1950.6034.4978.1934.1851.2536.0982.2034.0946.4432.7769.9834.1551.2536.3187.6334.0948.5833.1275.7634.1248.5833.5374.2034.1550.8234.2879.7934.1236.1028.6351.5134.1942.4830.8663.2434.1736.9429.0854.1934.1542.1830.7963.1234.1639.2429.5556.2834.19	B1B2B3B4B5 45.67 32.11 69.25 34.16 39.36 51.28 34.36 84.41 34.09 47.33 50.59 33.87 80.73 34.15 45.85 51.25 34.54 86.38 34.14 47.78 50.37 33.97 79.39 34.16 46.29 46.44 32.04 72.73 34.19 38.75 49.50 33.09 79.53 34.19 42.47 51.29 35.41 80.71 34.19 50.94 50.60 34.49 78.19 34.18 47.97 51.25 36.09 82.20 34.09 51.36 46.44 32.77 69.98 34.15 41.92 51.25 36.31 87.63 34.09 51.17 48.58 33.53 74.20 34.15 44.56 50.82 34.28 79.79 34.12 47.43 36.10 28.63 51.51 34.19 25.58 42.48 30.86 63.24 34.17 34.58 36.94 29.08 54.19 34.15 27.26 42.18 30.79 63.12 34.16 34.31 39.24 29.55 56.28 34.19 28.50	B1B2B3B4B5B6 45.67 32.11 69.25 34.16 39.36 38.37 51.28 34.36 84.41 34.09 47.33 38.39 50.59 33.87 80.73 34.15 45.85 38.24 51.25 34.54 86.38 34.14 47.78 38.40 50.37 33.97 79.39 34.16 46.29 38.39 46.44 32.04 72.73 34.19 38.75 38.41 49.50 33.09 79.53 34.19 42.47 38.29 51.29 35.41 80.71 34.19 50.94 38.50 50.60 34.49 78.19 34.18 47.97 38.26 51.25 36.09 82.20 34.09 51.36 38.36 46.44 32.77 69.98 34.15 41.92 38.37 51.25 36.31 87.63 34.09 51.17 38.44 48.58 33.12 75.76 34.12 43.06 38.39 48.58 33.53 74.20 34.15 44.56 38.24 50.82 34.28 79.79 34.12 47.43 38.39 36.10 28.63 51.51 34.19 25.58 38.46 42.48 30.86 63.24 34.17 34.58 38.45 36.94 29.08 54.19 34.15 27.26 38.27 42.18 30.79 63.12 34.16	B1B2B3B4B5B6B745.6732.1169.2534.1639.3638.3736.0451.2834.3684.4134.0947.3338.3936.0450.5933.8780.7334.1545.8538.2436.0451.2534.5486.3834.1447.7838.4036.0550.3733.9779.3934.1646.2938.3935.9146.4432.0472.7334.1938.7538.4136.0049.5033.0979.5334.1942.4738.2936.0651.2935.4180.7134.1950.9438.5035.9150.6034.4978.1934.1847.9738.2635.9651.2536.0982.2034.0951.3638.3635.8646.4432.7769.9834.1541.9238.3735.8851.2536.3187.6334.0951.1738.4435.8448.5833.1275.7634.1243.0638.3936.0248.5833.5374.2034.1544.5638.2436.0350.8234.2879.7934.1247.4338.3936.0536.1028.6351.5134.1925.5838.4635.9542.4830.8663.2434.1734.5838.4535.9836.9429.0854.1934.1527.2638.2735.9142.1830.7	B1 B2 B3 B4 B5 B6 B7 B8 45.67 32.11 69.25 34.16 39.36 38.37 36.04 46.26 51.28 34.36 84.41 34.09 47.33 38.39 36.04 51.19 50.59 33.87 80.73 34.15 45.85 38.24 36.04 51.27 51.25 34.54 86.38 34.14 47.78 38.40 36.05 51.18 50.37 33.97 79.39 34.16 46.29 38.39 35.91 51.28 46.44 32.04 72.73 34.19 38.75 38.41 36.00 44.79 49.50 33.09 79.53 34.19 42.47 38.29 36.06 51.29 51.29 35.41 80.71 34.19 50.94 38.50 35.91 51.28 50.60 34.49 78.19 34.18 47.97 38.26 35.86 51.18 46.44	B1 B2 B3 B4 B5 B6 B7 B8 B9 45.67 32.11 69.25 34.16 39.36 38.37 36.04 46.26 39.27 51.28 34.36 84.41 34.09 47.33 38.39 36.04 51.19 44.80 50.59 33.87 80.73 34.15 45.85 38.24 36.04 51.27 43.49 51.25 34.54 86.38 34.14 47.78 38.40 36.05 51.18 45.53 50.37 33.97 79.39 34.16 46.29 38.39 35.91 51.28 43.54 46.44 32.04 72.73 34.19 38.75 38.41 36.00 44.79 39.43 49.50 33.09 79.53 34.19 42.47 38.29 36.06 51.29 42.00 51.29 35.41 80.71 34.19 50.94 38.50 35.96 51.26 44.71 51.25

with a higher peak value of crash pulse have a worse quality. In addition, the range of the average peak occupant acceleration in the same category of crash pulse is within 5 g.

Table 3. Peak occupant accelerations.

Table 4. Average peak occupant acceleration.

No.	Average Peak Occupant Acceleration (g)	Peak Value of Crash Pulse (g)	No.	Average Peak Occupant Acceleration (g)	Peak Value of Restraint Stiffness (g)
A1	41.98	23	B1	47.04	51.3
A2	46.42	46.1	B2	32.95	33
A3	45.45	34.6	B3	73.46	77
A4	46.97	69.1	B4	34.15	34.2
A5	45.49	27.6	B5	41.83	51.3
A6	42.00	30.7	B6	38.38	38.5
A7	44.33	34.5	B7	35.97	36.1
A8	47.48	46.1	B8	48.22	51.3
A9	46.10	34.5	B9	41.53	38.5
A10	48.25	69.1	B10	42.43	36.2
A11	43.34	30.7			
A12	48.48	46.1			
A13	44.05	30.7			
A14	44.53	30.7			
A15	45.93	27.6			
A16	36.70	46.1			
A17	39.72	30.7			
A18	37.58	34.5			
A19	39.63	27.6			
A20	37.49	51.8			

By comparing the crash pulses with the same peak value, it can be seen that the of quality of the concave pulse, upward pulse, downward pulse, and convex pulse decreases successively. In addition, the average peak occupant acceleration of the concave pulse is much lower than that of other categories of crash pulse with the same peak value, which again indicates that the quality of the concave pulse is obviously better than the other types of pulse.

According to the average peak occupant acceleration corresponding to the restraint stiffness in Table 4, B2 and B4 with the lowest average peak occupant acceleration also have lower peak values of restraint stiffness. In addition, exception for B10, the average peak occupant acceleration increases with the increase of the peak value of restraint stiffness, which indicates that the peak value of restraint stiffness is closely related to the peak occupant acceleration.

When comparing B7 and B10 that have the same peak value, the average peak occupant acceleration of the convex curve is lower than that of downward curve in the condition where the peak value of restraint stiffness is the same. Under the same conditions, the average peak occupant acceleration of the convex curve is higher than that of upward curve, when comparing B6 with B9, B1, B5, and B8. Therefore, in the case with the same peak value for restraint stiffness, the quality of the upward, convex, and downward waves decreases successively.

To further analyze the coupling relationship between the crash pulse and restraint stiffness, the crash pulse was taken as the X-axis and the restraint stiffness curve as the Y-axis, and the peak occupant acceleration corresponding to the crash pulse and restraint stiffness curve were drawn in a 3D scatter-plot. As shown in Figure 6, in the area where crash pulses A16, A18, and A20 are combined with restraint stiffness B2 and B5, the peak occupant acceleration is the lowest (less than 30 g). It should be noticed that A16, A18, and A20 are concave pulses, while B2 and B5 are upward curves. Therefore, it can be seen that the concave crash pulse and upward restraint stiffness curve have the best coupling effect.



Figure 6. Three-dimensional scatter-plot of peak occupant acceleration.

Along the Y-axis direction in Figure 6, the peak occupant acceleration of the areas A16 and A20, and A1 and A6 is smaller than that of the others. In addition, for the other crash pulses, the contours of the peak occupant acceleration have almost no change along the Y-axis direction. This indicates that in the design of a crash pulse, adopting a concave, rectangular, or relatively gentle crash pulse can provide more design space to match the

ORS. In the X-axis direction, the peak occupant accelerations of B2, B4, B6, and B7 have no significant changes, which indicates that these restraint stiffnesses have a better tolerance for matching the crash pulses. The choice of these restraint stiffness can leave more space for the design of the crash pulse. Compared with the various groups of restraint stiffness curves are less compatible with the crash pulse. In particular, if the restraint stiffness is of the type B3, it is difficult to match the appropriate crash pulse, due to the high peak occupant acceleration.

In general, the shape of a crash pulse is the main factor affecting the occupant acceleration; and the quality of a concave pulse, rectangular pulse, upward pulse, convex pulse, and downward pulse decreases in turn. The peak value of a crash pulse is the secondary factor affecting occupant acceleration. For the same crash pulse shape, the higher the peak value, the worse the crash pulse quality. Instead, the peak value of restraint stiffness is the main factor affecting occupant acceleration, and the higher the peak value, the worse the quality of restraint stiffness. The shape of the restraint stiffness curve is the secondary factor affecting the occupant acceleration. When the peak value of the restraint stiffness curve is the same, the quality of the upward curve, convex curve, and concave curve decreases progressively. From the perspective of coupling, a concave pulse or nearly rectangular crash pulse should be selected to match a bilinear restraint stiffness, under the premise of controlling the peak value of the restraint stiffness. So that a better coupling effect is obtained. A concave or nearly rectangular crash pulse can be selected to match a single or double trapezoidal restraint stiffness. In this way, a large design space of crash pulse and restraint stiffness can be obtained under a given requirement of peak occupant acceleration.

4. Coupling Optimization Design of Crash Pulse and Restraint Stiffness

4.1. Coupling Optimization Method

In this section, the coupling of a concave pulse and bilinear restraint stiffness, which has a good effect, is taken as an example, to study the matching strategy in an FRB test. Based on the fast solution algorithm, a coupling optimization method suitable for the conceptual design was proposed using the variable recognition function of the GA [42–46].

In the conceptual design phase of vehicle safety, the occupant safety requirements are given, and it is assumed that the energy absorption space of the vehicle's front structure and the available space in the occupant's cabin are all exhausted. The occupant safety requirements include both the peak occupant acceleration *B* and the maximum occupant living space D_{ov} . The total width of the crash pulse in the displacement domain *D* corresponds to the energy absorption space of the front-end of the vehicle. Since the fast solution algorithm is applicable to the coupling solution of the crash pulse in the time domain, a concave pulse in the displacement domain needs to be converted into the time domain in the optimization process.

The parameters defining a concave pulse in the time domain are shown in Figure 7, where a_1 , a_2 , and a_3 are the heights of the three-stage concave pulse; and t_1 , t_2 , and t_3 are the widths of the three-stage concave pulse, respectively. According to the physical significance of the crash pulse and the characteristics of the concave pulse, the parameters of a concave pulse should meet the following requirements:

$$(a_1t_1 + a_2t_2a_3 + a_3t_3) \times g = v_0 \tag{9}$$

$$a_1, a_3 \ge a_2 \ge 0 \tag{10}$$

$$t_1 + t_2 + t_3 = t \tag{11}$$

Utilizing Equations (9) and (11), this can be given as:

$$\begin{cases} t_3 = t - t_1 - t_2 \\ a_3 = \frac{v_0/g - a_1 t_1 - a_2 t_2}{t_3} \end{cases}$$
(12)



Figure 7. Parameters of a concave pulse.

Therefore, t_1 , t_2 , a_1 , and a_2 are the design parameters of a concave pulse in the time domain.

The integral of the crash pulse in the displacement domain is the total energy absorption density of the vehicle in the crash process. The total absorbed energy of a vehicle in the FRB test equals the initial kinetic energy of the vehicle:

$$\begin{cases} v_i = v_{i-1} - \int_{t_{i-1}}^{t_i} a_i dt \\ d_i = \int_{t_{i-1}}^{t_i} (v_{i-1} - \int_{t_{i-1}}^{t_i} a_i dt) dt \end{cases} i = 1, 2, 3$$
(13)

If a_1 , a_2 , d_1 , and d_2 are the design variables of the crash pulse in the displacement domain, a_3 and d_3 should satisfy Equation (14).

$$\begin{cases} d_1 + d_2 + d_3 = D\\ a_1 d_1 + a_2 d_2 + a_3 d_3 = \frac{1}{2} v_0^2 \end{cases}$$
(14)

The widths of the steps t_1 , t_2 , and t_3 correspond to the displacements d_1 , d_2 , and d_3 , respectively, and the conversion formulas are as follows:

$$\begin{cases} t_1 = \frac{v_0 - \sqrt{v_0^2 - 2a_1 d_1}}{a_1} \\ t_2 = \frac{(v_0 - a_1 t_1) - \sqrt{(v_0 - a_1 t_1)^2 - 2a_2 d_2}}{a_2} \\ t_3 = \frac{(v_0 - a_1 t_1 - a_2 t_2) - \sqrt{(v_0 - a_1 t_1 - a_2 t_2)^2 - 2a_3 d_3}}{a_3} \\ d_3 = D - d_1 - d_2 \\ a_3 = \frac{v_0^2 - 2a_1 d_1 - 2a_2 d_2}{2(D - d_1 - d_2)} \end{cases}$$
(15)

The parameters defining the bilinear restraint stiffness curve are shown in Figure 8, k_1 and k_2 are the two-stage stiffnesses of the bilinear restraint stiffness curve, respectively; D_{ov} is the maximum occupant relative displacement; d_{ov1} is the occupant relative displacement corresponding to the inflection point of the bilinear restraint stiffness curve; and *B* is the peak occupant acceleration of the bilinear restraint stiffness curve. D_{ov} corresponds to the maximum occupant living space in the conceptual design phase and can be determined in advance. The peak occupant acceleration *B* represents the safety index of a frontal crash

and should also be limited in the conceptual design phase. Hence, the designability of D_{ov} and B is low. Combined with the characteristics of the bilinear restraint stiffness curve, the inflection point (d_4 , a_4) of the bilinear restraint stiffness curve is taken as the design variable, and k_1 and k_2 can be calculated using

$$\begin{cases} k_1 = \frac{a_4}{d_4} \\ k_2 = \frac{B - a_4}{D_{ov} - d_4} \end{cases}$$
(16)



Figure 8. Parameters of the bilinear restraint stiffness curve.

A flowchart for coupling optimization is shown in Figure 9. The optimization target is the peak occupant acceleration, and the smaller the better. The design variables are set to the usual range for engineering. The population p_0 is 100, the *MAXGEN* is 300, the fixed crossover probability P_c is 0.7, and the fixed mutation probability P_m is 0.01.

4.2. Optimization Example

Based on the vehicle data mentioned in Section 2.4, the proposed optimization algorithm was used to perform coupling optimization of the crash pulse and restraint stiffness for the vehicle [47]. The parameter formula of the optimization algorithm can be defined as follows:

$$\begin{cases}
Find: X = [a_1, a_2, a_4, d_1, d_2, d_4]^{T} \\
Min: a_{omax} \\
s.t. & 0 \le a_1 \le 50g \ 0 \le a_2 \le 50g \\
& 0 < a_3 \le 30g \ 0 \le a_4 \le 38.7g \\
& 0 \le d_1 \le 0.325 \ 0 \le d_2 \le 0.325 \\
& 0 < d_4 < 0.3
\end{cases}$$
(17)

After 300 iterations, as shown in Figure 10, the final optimized peak occupant acceleration was 22.5 g, and the peak occupant acceleration had decreased by 44%. The optimized crash pulse and bilinear restraint stiffness curves are shown in Figures 11 and 12, respectively. The optimization result was consistent with the conclusion in Section 3.2 that the coupling effect of a concave crash pulse and convex bilinear restraint stiffness curve is the best option. A comparison of optimization results with the original data is shown in Figure 13. It can be seen that the optimized result was significantly better than the original data. The coupling of the concave crash pulse with bilinear constraint stiffness



can bring forward the peak of occupant acceleration and keep the acceleration stable in the medium term.

Figure 9. Flowchart of coupling optimization.



Figure 10. Evolution of the optimization method.



Figure 11. Comparison of optimization results with the test data of crash pulses.



Figure 12. Comparison of optimization results with test data of restraint stiffnesses.



Figure 13. Comparison of optimization results with the test data of occupant accelerations.

5. Discussion

Using the coupling optimization algorithm, the final design of the crash pulse was a concave pulse, which could be divided into three phases: high, low, and moderate level, and the restraint stiffness was a bilinear convex curve. In this section, the engineering feasibility of the concave crash pulse and bilinear restraint stiffness will be discussed further.

A crash pulse is the crashworthiness design objective for the vehicle front-end structure, and it is necessary to reasonably design the deformation mode of the structure to obtain the target pulse. Experience suggests that the main deformation modes of the front-end structure in the crash process are crushing and bending. A structure with regular collapse deformation absorbs the most energy and the crash reaction force can be maintained at a higher level, which shows that a regular collapse is the ideal deformation mode. By contrast, local bending of the structure will produce a lower crash force. Thus, a concave crash pulse can be realized by appropriately designing the crushing and bending deformation modes of the structure. Note that the cross-section of the structure designed to bend should be the weakest part in the front rail. This means that, for the front rail, these points deform first. Therefore, in the design process, it is important to address the buckling of the weaker parts before the final collapse.

For the structural design, new material technologies provide methods for realizing the control of the crash force. The tensile, compressive, and shear strength of strain ratesensitive materials varies significantly under different strain rates. During the initial phase of a crash, the front-end energy-absorbing structure made of a strain-rate-sensitive material deforms rapidly and the crash reaction force is high. As the crash velocity decreases, the strain rate effect weakens rapidly and the reaction force decreases. In the final phase of the crash, the energy-absorbing space of the vehicle front-end decreases, and the reaction force starts to increase as the deformed structures are gradually compacted.

The restraint stiffness curve of an ORS represents the energy-absorbing characteristics of the restraint system and can be used as the performance design objective for the ORS in the conceptual design phase. At present, the matching of a ORS is mainly used to design the performance parameters of the safety belt, airbag, steering string, and other subsystems. Therefore, according to the mechanism of the restraint subsystem and its interaction with occupants, the restraint stiffness can be decomposed into the energy-absorbing goals and stiffness design goals of each subsystem, so that the main parameters of the subsystem can be calculated using the theoretical formula. Restraint stiffness decomposition realizes the performance decoupling of the restraint system by dividing the restraint stiffness curves of the area. For a bilinear restraint stiffness curve, this is usually divided into a seat belt and airbag. The equivalent stiffness of the safety belt, the force limiting acceleration, and the equivalent stiffness of the airbag can be obtained from the restraint stiffness curve after decomposition. By adjusting the seat belt stiffness, force limiting level, airbag vent size, and airbag filling rate, the required bilinear restraint stiffness curve can be achieved.

6. Conclusions

In this paper, a database of crash pulse, restraint system stiffness, and occupant response was established using a vehicle–occupant crash analytical model. According to the database, the coupling relationship of the crash pulse and restraint stiffness was qualitatively analyzed from the perspective of the curve shape and peak value. Then, combing with the GA and crash analytical model, a coupling optimization algorithm was proposed, to design the parameters of the crash pulse and restraint stiffness using a specific shape. Finally, the engineering feasibility of the coupling design was discussed. The main conclusions of this paper are summarized as follows:

- (1) For a crash pulse, the pulse shape is more important than the pulse parameters, and the quality of the concave pulse, rectangular pulse, upward pulse, convex pulse, and downward pulse decreases successively.
- (2) For the restraint stiffness curve, the peak value of the curve is closely related to the peak occupant acceleration. When the peak value is the same, the quality of the restraint stiffness curve for an upward curve, convex curve, and concave curve decreases successively.
- (3) The crash pulse and restraint stiffness curve of a vehicle was optimized using the proposed coupling optimization method, and the peak occupant acceleration was decreased by 44%.

In summary, this paper studied a coupling design strategy for crash pulse and restraint stiffness, which provides an effective method for occupant injury protection in traffic accidents. Follow-up research will focus on the following aspects: (1) the parameters of the symmetrical energy absorption structure of vehicle will be optimized with the target of the crash pulse; (2) taking the crash pulse and restraint stiffness curve as the target, parameter design of the vehicle structure and restraint system will be carried out; (3) the model will be further improved to allow studying the coupling design of a multiple frontal impact test, such as MPDB (mobile progressive deformable barrier) and SOB (small overlap barrier).

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