

## Article

# DSP Processor-in-the-Loop Tests Based on Automatic Code Generation

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**Abstract:** The digital signal processing (DSP) processor-in-the-loop tests based on automatic code generation technology are studied. Firstly, the idea of model-based design is introduced, and the principle and method of embedded code automatic generation technology are analyzed by taking the automatic code generation of the DSP control algorithm for pulse width modulation (PWM) output as an example. Then, the control system model is established on MATLAB/Simulink. After verifying the model through simulation, the target board platform is established with DSP as the core processor, and the automatically generated code is tested by the processor-in-the-loop (PIL). The results show that the technology greatly shortens the development cycle of the project, improves the robustness and consistency of the control code, and can be widely used in the complex algorithm development process of the controller, from intelligent design and modeling to implementation.

**Keywords:** automatic code generation; model-based design; DSP; processor in the loop



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## 1. Introduction

As is well known, due to the rapid development of modern industrial technology, product upgrading is changing with each passing day; at the same time, the requirements for product control performance are also becoming higher and higher. In recent decades, as the requirements for control redundancy and safety have become more demanding, the number of control codes of products has also become larger, such as modern automobiles, space shuttles, and aerospace ships, etc., in which there are codes at the level of one million lines or more [1,2]. Nowadays, more and more people are paying increasing attention to the intelligent network function when buying a car, such as automatic driving, intelligent operating system, perception fusion and artificial intelligence (AI) interaction, big data operation and vehicle over-the-air technology (OTA) capabilities, and vehicle core systems, including internal powertrain, electrical and electronic architecture, etc., which all require lines of code [3]. A consensus reached in the automotive industry is that, ten years ago, a car contained approximately 10 million lines of software code. Today, a car has around 100 million lines of software code. In the future, the amount of software code for autonomous vehicles will reach 300 to 500 million lines [3]. As stated in the news report [4], this may introduce 4–6 security flaws per thousand lines of code in smart vehicles.

Indeed, faced with hundreds of thousands or even millions of lines of control code, traditional manual programming is time-consuming and laborious, as shown in Figure 1 [5,6]. It can no longer meet the development needs of modern products. With the rapid expansion of the amount of code, the defects of the traditional manual development model are very obvious. It is faced with many insurmountable difficulties, such as the forced extension of the product development cycle, the multiple R&D investments, and the difficulty of guaranteeing product reliability. It has been difficult to adapt to the current social requirements in product development and testing [1,5]. At present, the development speed of controllers

in aerospace, automotives, etc., is becoming faster and faster. There are many defects in the traditional development process. For example, the errors introduced in the functional requirement analysis stage are generally found in the final testing stage, which causes the development process to be severely blocked or even pushed back.

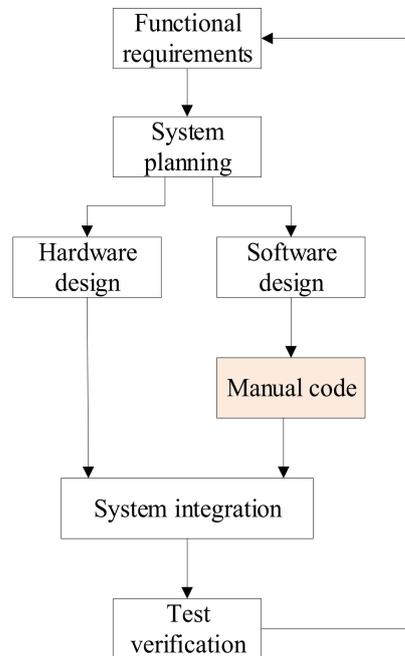


Figure 1. The traditional development model.

2. Materials and Methods

2.1. Model-Based Design and Development Mode

To solve the problems faced by the traditional development process, MathWorks proposed a model-based design (MBD) method based on MATLAB software with the development of software design tools, as shown in Figure 2. The use of a unified software and hardware platform in the development process can unify the offline simulation of the control algorithm on the desktop, the control prototype test in the laboratory, and the actual test calibration process of the vehicles; thus, it can reduce the development cost and redundant work, and accelerate the development process. When this concept was proposed at the time, it was considered an invention in intelligent design and modeling, and it received the attention and application of researchers in industry and academia.

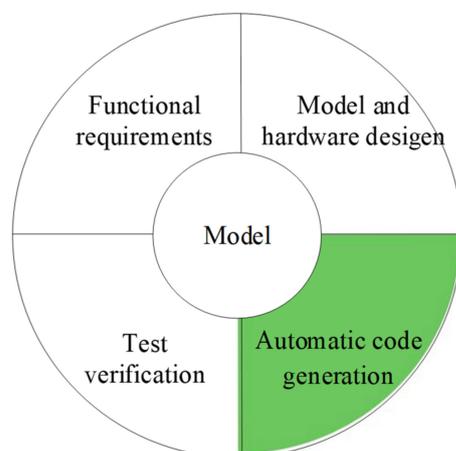


Figure 2. The model-based design.

Compared with traditional design methods, the various processes of MBD are integrated and linked together. Developers can focus on the modeling of algorithms and test cases. Controller code can be automatically generated using Embedded Coder™ to reduce the manpower, material resources, and time required for manual programming, and it has been successfully applied to the development of large-scale projects. In addition, MATLAB is in a leading position in scientific computing and modeling. Many companies around the world have directly developed module libraries that support MBD in MATLAB, such as Texas Instruments, dSPACE, Quanser, TRlab, etc. MATLAB/Simulink is used as a tool to implement the processor-in-the-loop (PIL) experiments of DSP based on automatic code generation technology in this paper.

Different from the Model-in-the-Loop (MIL), Software-in-the-Loop (SIL), and Hardware-in-the-Loop (HIL) tests, the PIL test compiles the automatically generated code into the target system program, and then virtualizes the target hardware environment on the PC and performs the test [7–9]. It is one of the tests involved in a model-based approach that allows the combination of the computer simulation (computations performed on a computer) and the microprocessor simulation [10]. It is verified whether the function implemented by the code on the target processor (such as DSP) is consistent with the simulation model. The four test methods used in the controller development process, and their definitions, are shown in Table 1. Each test process has differences and connections, which together constitute a complete test process and a unified whole.

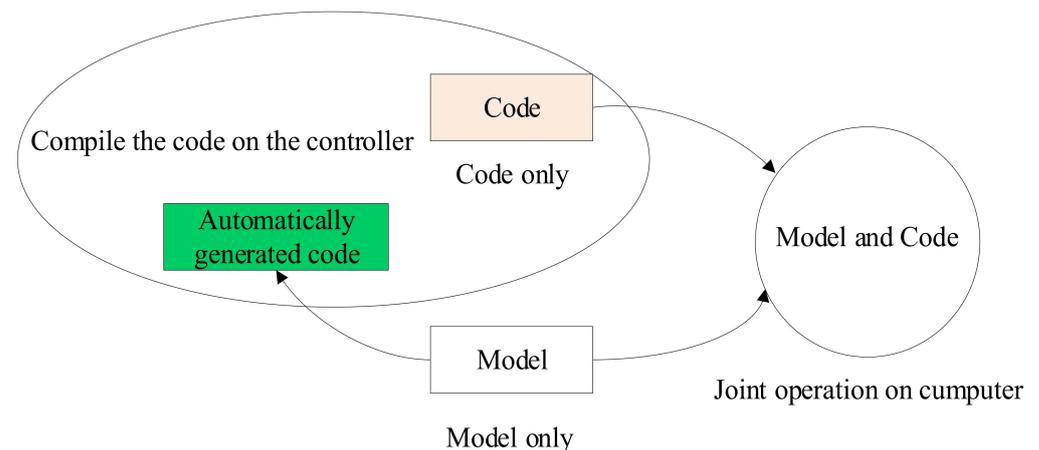
**Table 1.** The four test methods and their definitions.

Abbreviation	Full Name	Meaning of Definition
MIL	Model-in-the-Loop	In the Simulink model, the control algorithm model and the controlled object model are connected to form a closed loop for simulation (a purely mathematical model).
SIL	Software-in-the-Loop	To verify that the automatically generated code and the original model used for code generation are consistent in function and behavior (a mathematical model and code).
PIL	Processor-In-the-Loop	The code generated runs on the actual controller in the PIL tests, so, in addition to verifying whether the code and the model are consistent, the longest running time of the algorithm on the actual controller can also be obtained (a mathematical model and actual controller).
HIL	Hardware-in-the-Loop	Different from PIL, HIL is used to test the controller system. The control system includes hardware, low-level software, and application-level software (real controller system and virtual real object).

Research in this area has been extensive, and there are many studies reported in the world and particularly in Europe. A PIL simulation system was developed in [11], which has led to the full testing and validation of the GNC flight code to be ported to a VxWorks environment in a PowerPC8245 board, representative of the onboard computer, while a Field Programmable Gate Array (FPGA)-based PIL simulation test bench for the proposed machine was set up in [12]. Furthermore, [13] shows how to implement PIL and the preliminaries to HIL of electronic/electric systems with easy access technology through a code generation tool called Xilinx System Generator, an FPGA device, and a personal computer. By using the MBD, the embedded software is designed in [14], and the main interests are SIL and PIL approaches.

## 2.2. DSP Code Automatic Generation Based on MATLAB/Simulink

In the past, there was no connection between the model and the code. The simulation model was not directly related to the coding/code. The model was for intended theoretical analysis and algorithm design and could be used to guide programming. However, with the development of science and technology, the model and the code gradually merge, and the model and the code can be directly run jointly on the computer. Model and code are inseparable now, as shown in Figure 3.



**Figure 3.** Model and code from independence to integration.

The core technology in the MBD development method is automatic code generation technology. As an emerging engineering realization technology, automatic code generation technology has been widely used in aerospace and defense, automotive, industrial control, and automation fields [2,6,15]. Through advanced auxiliary design development tools, it is conducive to the rapid and efficient development of the controller.

The Embedded Coder™ product in the MATLAB product family integrates Texas Instruments Code Composer Studio™, Analog Devices™ VisualDSP++®, and other third-party embedded development environments, which can directly convert MATLAB/Simulink model block diagrams and Stateflow diagrams into efficient and optimized C/C++ program code, and the entire code generation, compilation, and corresponding target download process are all performed automatically. The automatically generated readable and compact C/C++ code can be conveniently used in embedded processors, target system rapid prototyping boards, and microprocessors used in mass production, so that control prototyping and product-level code can be completed rapidly.

The first step is to build the PWM output control model in MATLAB/Simulink, which is the aforementioned MIL test, verify the algorithm through a purely mathematical simulation model, and then only keep the controller control algorithm part, after fixed-point processing (de-floating-point operation), to generate the embedded code that DSP can run. A flowchart of automatic code generation based on Embedded Coder™ in MATLAB/Simulink is shown in Figure 4 [16].

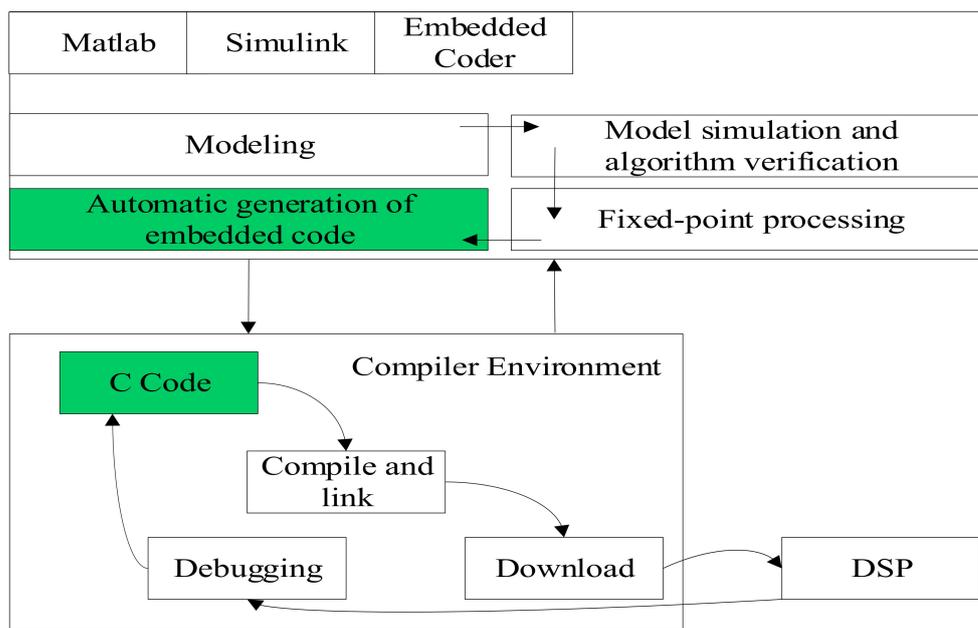


Figure 4. The embedded code automatic generation process of DSP.

### 3. Results and Discussion

#### 3.1. Experimental Platform

Pulse width modulation (PWM) is a technology that uses the digital output of a microprocessor to control analog circuits [16,17]. Motor output performance is closely related to its terminal voltage, and PWM technology is widely used in motor control technology. Through PWM technology, the electronic control unit can adjust the duty cycle according to the change in the external load to ensure the set speed of the motor [18,19].

The duty cycle is the ratio of the high level in a cycle. As shown in Figure 5a, the wave is a 10% PWM output, i.e., in the signal cycle, 10% of the time is on, and the remaining 90% of the time is off. Assuming that the power supply is 10 V and the duty cycle is 10%, it corresponds to an analog signal with an amplitude of 1 V. In Figure 5b,c, the PWM output with a duty cycle of 50% and 90% are shown, respectively. The three kinds of PWM output codes are three different analog signal values with the intensity of 10%, 50%, and 90% of the full-scale value. This is a simple PWM with equal pulse width, and the realized adjustment voltage is also a fixed value.

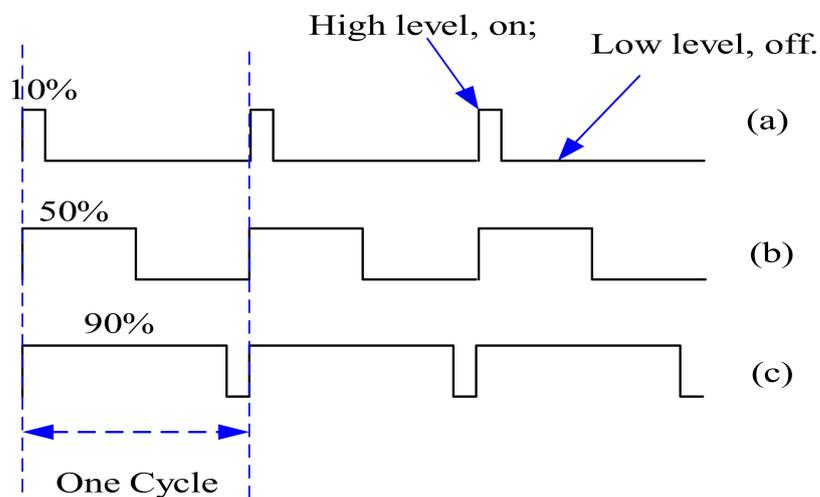
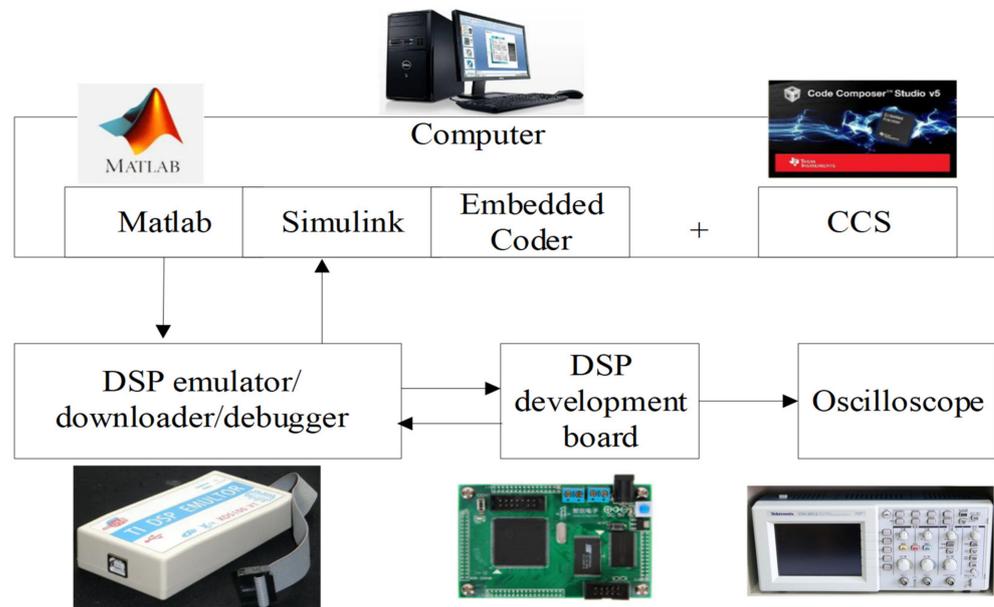


Figure 5. The technology of PWM. (a) the duty cycle is 10%; (b) the duty cycle is 50%; (c) the duty cycle is 90%.

The composition and schematic diagram of the experimental software and hardware platform is shown in Figure 6, in which the hardware mainly includes the computer, a DSP development board, a DSP emulator/downloader/debugger, and an oscilloscope, while the software mainly includes MATLAB/Simulink™ and Texas Instruments' Code Composer Studio™.



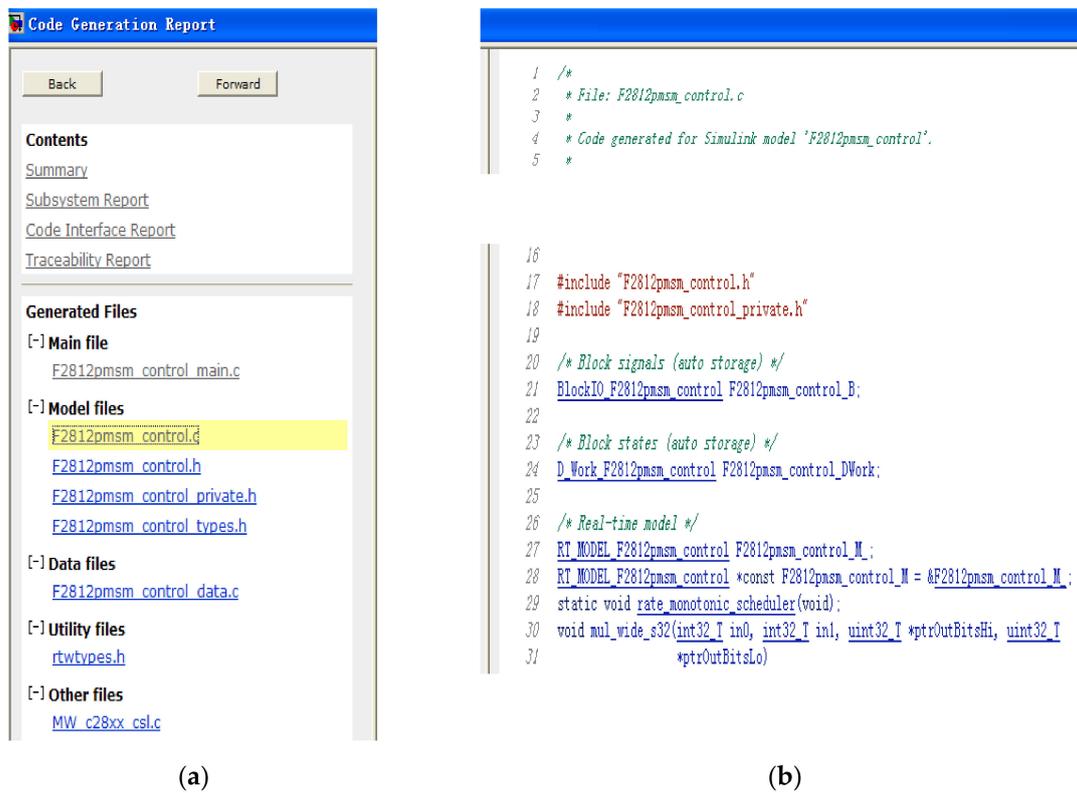
**Figure 6.** The composition and schematic diagram of the experimental software and hardware platform.

The DSP controller can generate six PWM signals. In the verified MATLAB model, only the control modules that need to be processed in the DSP are retained, and the pulse code modulation PWM module in Texas Instruments' Code Composer Studio™ is substituted for the modules in the original simulation model, and then the model is fixed-pointed to meet the low power requirements of the TMS320F2812 DSP chip, because the fixed-point signal calculation is simple and the calculation speed is fast, and the calculation time is reduced. In addition, it should be pointed out that TMS320F28335 DSP has been widely used to replace the original DSP2812. DSP28335 is a 32-bit floating-point DSP controller newly launched by TI. Compared with fixed-point DSP2812, DSP28335 adds a single-precision floating-point arithmetic unit (FPU) and high-precision PWM, doubles Flash (256 K × 16 Bit), and adds a direct memory access (DMA) function, which can directly store ADC conversion results in any storage space of DSP [20,21].

The Embedded Coder™ tool is used to automatically generate the C language project file for the TI CCS compiler, further complete the compilation, connection, and download, and finally run on the DSP development board to complete the PIL real-time tests.

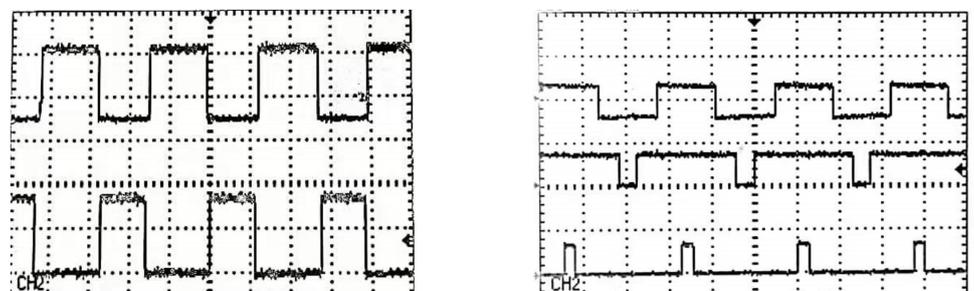
### 3.2. Experimental Results

Through MATLAB Embedded Coder™ automatic compilation, we can obtain the required C code files. Through the code generation report, we can see that the generated report includes a summary, subsystem report, a code interface report, traceability report, etc., as shown in Figure 7. The generated files mainly include main files, model files (including C-language header file .h files, C-language source files .c files, etc.), utility files, and other files.



**Figure 7.** Code generation report and its generated files. (a) code generation report; (b) generated C file.

There are three elements for evaluating high-quality code: readability, maintainability, and changeability. As shown in Figure 7, we can see that the MATLAB Embedded Coder™ can generate independent, readable, and portable C/C++ code from the MATLAB/Simulink model. Although the default variable data type of the automatically generated code is a structure, a large number of structure types are used in the program, which is laborious to read. However, we can manually improve the readability of the code later. In terms of the overall development process, model-based design can still speed up project development and reduce research and development costs. After the automatically generated code runs on the DSP, we can judge whether the program is correct by observing the waveform of the DSP output pin through the oscilloscope. Under different duty cycle, the PWM output waveform is shown in Figure 8.



**(a)** Peak-peak value 424 mV Average value 132 mV Cycle 272.8 us Frequency 3.666 kHz **(b)** Peak-peak 440 mV Average value 292 mV Cycle 272.9 us Frequency 3.664 kHz

**Figure 8.** Observation of the PWM output waveform with an oscilloscope. (a) PWM waveform output on the pins of the DSP chip; (b) in different duty cycles.

#### 4. Conclusions

As former President Jack Little of MathWorks stated, in the process of embedded software development, model-based design can bring us at least four benefits. The graphical design is clear and easy to communicate and maintain. There are more efficient early verification methods. The code can be generated automatically. The relevant information in the model can be read through the software, and documents can be automatically created to realize document automation.

As shown by the example of DSP controller PWM output control shown in this paper, engineers only need to build the control model and verify the correctness of the model in MATLAB/Simulink from the perspective of the entire development and design process, without writing any code, to obtain reliable and accurate embedded code. Researchers no longer need to possess the complex C language editing knowledge, and can realize the comparison between different control methods and improved methods more quickly.

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**Data Availability Statement:** The data in the paper can be requested by email to the corresponding author.

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**Conflicts of Interest:** The authors declare no conflict of interest.

#### Abbreviations

AI	artificial intelligence
DMA	direct memory access
DSP	digital signal processing
FPGA	Field Programmable Gate Array
FPU	floating-point unit
HIL	hardware-in-the-loop
MBD	model-based design
MIL	model-in-the-loop
OTA	over-the-air technology
PIL	processer-in-the-loop
PWM	pulse width modulation
SIL	software-in-the-loop

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