



### Machine Learning in Microcontrollers

# DAY 2: Writing Embedded Software with ChatGPT and Open.AI

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### THE SPEAKER



# Jacob Beningo

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# Beningo Embedded Group - President

Focus: Embedded Software Consulting and Training

Specializes in <u>creating</u> and <u>promoting</u> embedded software **excellence** in businesses around the world.

**MicroPython** 

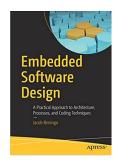
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# **Course Sessions**

- AI and ML for Microcontrollers
- Writing Embedded Software with ChatGPT and Open.Al
- Tools for Machine Learning in Microcontrollers
- Training a Model for the STM32
- Deploying Machine Learning Models









# AI Tools for Embedded Software





# AI Tools for Embedded Software

		<i>ر</i> ،	· ·
int	main		) {
		• •	· ·

```
if (wiringPiSetup() == -1) {
    fprintf(stderr, "Failed to initialize wiringPi.\n");
    return 1;
}
```

```
pinMode(LED_PIN, OUTPUT);
```

```
while (1) {
    digitalWrite(LED_PIN, HIGH);
    delay(BLINK_DELAY_MS);
    digitalWrite(LED_PIN, LOW);
    delay(BLINK_DELAY_MS);
}
```

priı	ntf("I	Hello,	world!	\n");		
] .						
eturn (	0:					

### Github Copilot

- Powered by OpenAI Codex
  - Generative pretrained model
- Suggests code to the developer
- Emulates pair programming with Al
- 26% 40% percent of code suggestions are accepted

https://github.com/features/copilot





## AI Tools for Embedded Software



### ChatGPT

- GPT-3.5 or GPT-4 LLM
- ChatGPT is an AI language model by OpenAI.
- It creates human-like text from given prompts.
- GPT-4 architecture enables context understanding and response generation.
- Trained on diverse internet text, specifics are unknown.
- No access to personal data unless explicitly provided.
- Versatile: drafts emails, writes, tutors, translates, simulates, codes.
- Despite sophistication, ChatGPT has limitations.
- It doesn't understand like humans, may err.
- · Aim is to continuously refine and improve it.





# AI Tools for Embedded Software

AI Tools can help embedded developers in several ways:

- Debugging code by suggesting potential causes and solutions.
- Writing embedded software documentation for specific hardware components.
- Providing code snippets for common embedded system tasks.
- Assisting in real-time troubleshooting of embedded systems issues.
- Offering guidance on best practices in embedded software development.
- Generating skeleton code for communication protocols (SPI, I2C, UART).
- Reviewing existing code and suggesting improvements or refactoring.
- Simulating responses from different hardware components for testing.
- Tutoring in advanced embedded systems concepts and programming languages.
- Assisting in project management tasks for embedded systems development.





# Do you trust AI generated code?

- Yes
- No
- Maybe so . . .









# Generating a USART Interface using ChatGPT

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### Generating a USART Interface using ChatGPT

We are going to write an embedded software interface in C for a usart peripheral. We are going to use the Google C++ coding standard. Don't use built-in types such as char, but use fixed width integer types from stdint.h. Please create an initial draft of the usart interface

### Analysis:

- I like the configuration structure for initialization.
- The interface is a bit verbose and repetitive.
  - SendByte, SendBytes, etc
- Interface support only a single USART device
- Not a fan of variables with \_. Would rather use camel case
- The use of const in parameters is a good practice
  - USART\_Init should really have a const config
- There's no considerations for interrupts or DMA through callback functions

Note: You may get different results. I've done this exercise several times.

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#### #ifndef USART\_H

#define USART\_H

#### include <stdint.h>

#### // USART configuration struct

cypedef struct {

uint32\_t baud\_rate; uint8\_t data\_bits; uint8\_t stop\_bits; uint8\_t parity; } USART\_Config;

; // Baud rate for USART communication // Number of data bits (5-9) // Number of stop bits (1 or 2) // Parity mode (0: none, 1: odd, 2: even)

// Initialize USART with the given configuration
void USART\_Init(USART\_Config config);

// Send a single byte over USART
void USART\_SendByte(uint8\_t byte);

// Receive a single byte from USART
uint8\_t USART\_ReceiveByte(void);

// Send a byte array over USART
void USART\_SendBytes(const uint8\_t\* data, uint32\_t size);

// Receive a byte array from USART
void USART\_ReceiveBytes(uint8\_t\* buffer, uint32\_t size);

// Send a null-terminated string over USART
void USART\_SendString(const uint8\_t\* str);

// Receive a null-terminated string from USART
void USART\_ReceiveString(uint8\_t\* buffer, uint32\_t buffer\_size);

G Regenerate response





### Generating a USART Interface using ChatGPT

This is a good start. Can you update the usart interface based on the following changes 1) Can you simplify the interface so that there are not so many repetitive functions 2) The interface only supports one device. Can you add support for multiple usart devices 3) Instead of using \_ in parameter variable names, please use camel. For example, buffer\_size would become bufferSize

Analysis:

- The interface still has the string functions which I would not include in a low-level driver. This is a library function.
- The device has been added but coupled with USART\_Config.
- Each function does have a device pointer, but these should be const
- There are a lot of useless comments in the code
- There's no considerations for interrupts or DMA through callback functions

Note: You may get different results. I've done this exercise several times. © 2023 Beningo Embedded Group, LLC. All Rights Reserved.

PT		
#ifndef USART_H		
#define USART_H		
<pre>#include <stdint.h></stdint.h></pre>		
// USART configuration	struct	
<pre>typedef struct {</pre>		
<pre>uint32_t baudRate;</pre>	// Baud rate for USART communication	
<pre>uint8_t dataBits;</pre>	// Number of data bits (5-9)	
<pre>uint8_t stopBits;</pre>	// Number of stop bits (1 or 2)	
<pre>uint8_t parity;</pre>	<pre>// Parity mode (0: none, 1: odd, 2: even)</pre>	
<pre>} USART_Config;</pre>		
// USART device struct		
<pre>typedef struct {</pre>		
<pre>uint32_t usartId;</pre>	// Identifier for the USART device	
USART_Config config;	// Configuration for USART communication	
<pre>} USART_Device;</pre>		
// Initialize USART de	vice with the given configuration	
<pre>void USART_Init(USART_</pre>	Device* device);	
// Send data over USAR	T	
	<pre>Device* device, const uint8_t* data, uint32_t size);</pre>	
// Receive data from U	SART	
	RT_Device* device, uint8_t* buffer, uint32_t bufferSiz	
// Send a null-termina	ted string over USART	
<pre>void USART_SendString(</pre>	USART_Device* device, const uint8_t* str);	
// Receive a null-term	inated string from USART	
void USART_ReceiveStri	ng(USART_Device* device, uint8_t* buffer, uint32_t buf	1

G Regenerate response

#### #endif // USART\_H







### Generating a USART Interface using ChatGPT

Update the latest version of the interface with the following: 1) remove the string functions from the interface. 2) Remove the comments above each function and structure. 3) USART\_Device is not a useful structure. Remove it. 4) Update USART\_Device to be an enum of usartDevice\_t that lists the available usart interfaces.

### Analysis:

- The interface now looks slim and cleaner!
- We have a typedef list of USARTs to interact with.
- Unfortunately, USART\_Config comments were removed.
- Not a big fan of USART\_COUNT. I prefer USART\_DEVICE\_ID\_MAX.
- Would prefer usartDevice\_t be usartDeviceID\_t.
- There's no considerations for interrupts or DMA through callback functions

Note: You may get different results. I've done this exercise several times. © 2023 Beningo Embedded Group, LLC. All Rights Reserved.









### Generating a USART Interface using ChatGPT

Update the latest interface version with the following changes: 1) change usartDevice\_t to usartDeviceID\_t 2) Change USART\_COUNT to USART\_MAX 3) Change USART\_Cong to usartConfig\_t 4) When passing the usartConfig\_t to USART\_Init, the parameter should be const

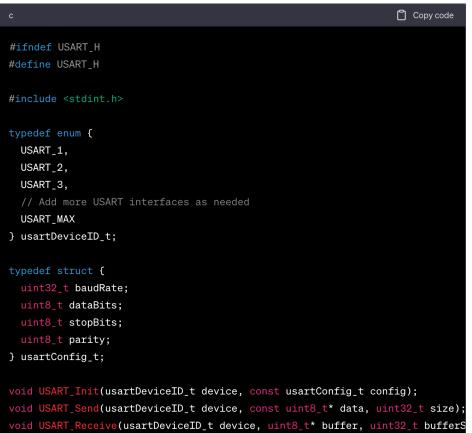
### Analysis:

- We're zeroing in on a reasonable interface!
- Our changes have been implemented.

### What's missing?:

- The functions don't return error codes
- We are ignoring the dependency inversion rule
- There's no considerations for interrupts or DMA through callback functions

Note: You may get different results. I've done this exercise several times. © 2023 Beningo Embedded Group, LLC. All Rights Reserved.



#endif // USART\_H







Update the latest interface with the following changes: 1) Each function in the interface should return an error code of type usartError\_t 2) The functions should be wrapped in a typedef struct where each function of the interface is a function pointer. 3) Add a callback function to the usartConfig\_t structure.

### Analysis:

- At this point, we have a pretty well-defined interface. There are still minor changes that should be fixed by hand:
  - The callback function probably would have void parameters
  - The USART\_Receive function pointer has a bufferSize parameter which should really just be size
  - The header file is USART\_H when it should be HAL\_USART or USART\_INTERFACE
  - The AI decided to define an extern usartInterfact variable that can be removed.

Note: You may get different results. I've done this exercise several times. © 2023 Beningo Embedded Group, LLC. All Rights Reserved.

#### #ifndef USART\_H

#define USART\_H

#### #include <stdint.h>

cypedef enum {
 USART\_1,
 USART\_2,
 USART\_3,
 // Add more USART interfaces as needed
 USART\_MAX
 usartDeviceID\_t;
}

#### ypedef enum {

USART\_OK, USART\_ERROR } usartError\_t;

#### ypedef struct {

uint32\_t baudRate; uint8\_t dataBits; uint8\_t stopBits; uint8\_t parity; void (\*callback)(usartError\_t error); // Callback function for error hand usartConfig\_t;

#### typedef struct {

usartError\_t (\*USART\_Init)(usartDeviceID\_t device, const usartConfig\_t\* cd usartError\_t (\*USART\_Send)(usartDeviceID\_t device, const uint8\_t\* data, usartError\_t (\*USART\_Receive)(usartDeviceID\_t device, uint8\_t\* buffer, uin usartInterface\_t;

Ġ Regenerate response

extern const usartInterface\_t USART\_Interface;





What do you think about using ChatGPT in this manner?

- Worthless, I can do it faster by hand
- An interesting experiment, but would still do it myself
- Fascinating, I can see and would use this to accelerate my own development
- I'm all in! The AI Overlord can now write all my code!
   Other









# Generating SPI and I2C Interfaces using ChatGPT







### Generating SPI and I2C Interfaces using ChatGPT

Best Practices for generating code:

- Be very specific one what you want. The more information you feed it, the closer it will get on the first try.
- 2) Use iterative feedback to get to the results you want
- 3) Feed in examples to more closely get the results that you want.





## Generating SPI and I2C Interfaces using ChatGPT

Based on the usart interface design and coding style, can you create an interface for a SPI peripheral?

#### Analysis:

- With an example, it generated a pretty decent Spi interface!
- There may be a few tweaks needed, (I'd just simplify the interface to SPI\_Transfer), but it could be used as is!

### © 2023 Beningo Embedded Group, LLC. All Rights Reserved.

#### #ifndef SPI\_INTERFACE\_H

#define SPI\_INTERFACE\_H

#### #include <stdint.h>

#### typedef enum {

SPI\_1, SPI\_2, SPI\_3, // Add more SPI interfaces as needed SPI\_MAX spiDeviceID\_t;

#### ypedef enum {

SPI\_OK,
SPI\_ERROR
} spiError\_t;

#### typedef struct {

uint32\_t clockSpeed; uint8\_t dataMode; uint8\_t bitOrder; void (\*callback)(void); } spiConfig\_t;

#### typedef struct {

spiError\_t (\*SPI\_Init)(spiDeviceID\_t device, const spiConfig\_t\* config); spiError\_t (\*SPI\_Transmit)(spiDeviceID\_t device, const uint8\_t\* data, uint spiError\_t (\*SPI\_Receive)(spiDeviceID\_t device, uint8\_t\* buffer, uint32\_t spiError\_t (\*SPI\_TransmitReceive)(spiDeviceID\_t device, const uint8\_t\* txC } spiInterface\_t;





### Generating SPI and I2C Interfaces using ChatGPT

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based on the spi interface design and coding style, can you create an interface for a I2C peripheral?

### Analysis:

- With an example, it generated a pretty decent I2C interface!
- There may be some small adjustments needed, but once I fed in an example, it took ~5 seconds to get the results.

#### #ifndef I2C\_INTERFACE\_H

#define I2C\_INTERFACE\_H

#### #include <stdint.h>

#### typedef enum {

I2C\_1, I2C\_2, I2C\_3, // Add more I2C interfaces as needed I2C\_MAX i2cDeviceID\_t;

#### typedef enum {

I2C\_OK, I2C\_ERROR } i2cError\_t;

#### typedef struct {

uint32\_t clockSpeed; uint8\_t address; void (\*callback)(void); i2cConfig\_t;

#### typedef struct {

i2cError\_t (\*I2C\_Init)(i2cDeviceID\_t device, const i2cConfig\_t\* config); i2cError\_t (\*I2C\_Write)(i2cDeviceID\_t device, const uint8\_t\* data, uint32\_ i2cError\_t (\*I2C\_Read)(i2cDeviceID\_t device, uint8\_t\* buffer, uint32\_t siz i2cError\_t (\*I2C\_WriteRead)(i2cDeviceID\_t device, const uint8\_t\* txData, u i2cInterface\_t;

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#### #endif // I2C\_INTERFACE\_H





How appealing is using a generative AI tool to you to augment your design and development?

- Not at all
- It's interesting, and I may try it
- I'll definitely be using AI to help accelerate my development
- Other









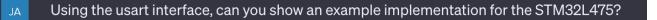
# Implementing the USART Interface







### Implementing the USART Interface (for STM32L475)



#### Analysis:

- Dang! It took about 20 seconds and I received 190 lines of code.
- It's not a full implementation. There are comments throughout where the developer can add implementation details such as in an interrupt.
- A quick glance through the code, and most of it seems reasonable . .

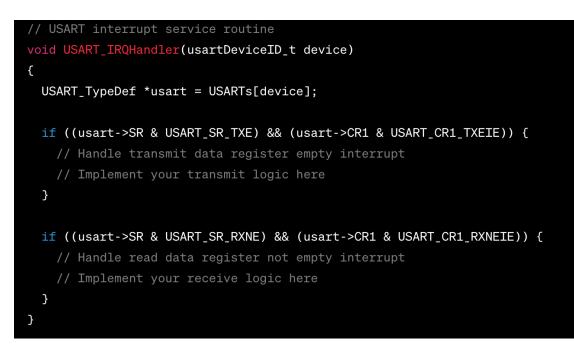
<pre>#include "usart_interface.h"</pre>	
<pre>#include "stm321475xx.h"</pre>	
// 110107	
// USART registers	
#define USART1_BASE_ADDR	(USART1_BASE)
<pre>#define USART2_BASE_ADDR</pre>	(USART2_BASE)
<pre>#define USART3_BASE_ADDR</pre>	(USART3_BASE)
// USART control register (C	R1) bits
<pre>#define USART_CR1_TE</pre>	(USART_CR1_TE_Msk) // Transmitter enable
#define USART_CR1_RE	(USART_CR1_RE_Msk) // Receiver enable
#define USART_CR1_UE	(USART_CR1_UE_Msk) // USART enable
#deline OSAKI_CKI_OL	(USART_CRI_DE_MSR) // USART enable
// USART status register (SR	) bits
<pre>#define USART_SR_TXE</pre>	(USART_SR_TXE_Msk) // Transmit data register
<pre>#define USART_SR_RXNE</pre>	(USART_SR_RXNE_Msk) // Read data register not
// USART interrupt enable re	gister (CR1) bits
<pre>#define USART_CR1_TXEIE</pre>	(USART_CR1_TXEIE_Msk) // Transmit data register
<pre>#define USART_CR1_RXNEIE</pre>	(USART_CR1_RXNEIE_Msk) // Read data register no
// USART interrupt flag regi	ster (SR) bits
<pre>#define USART_SR_TXE</pre>	(USART_SR_TXE_Msk) // Transmit data register
#define USART_SR_RXNE	(USART_SR_RXNE_Msk) // Read data register not
// USART IRQ numbers	
<pre>#define USART1_IRQ</pre>	(USART1_IRQn)
#define USART2_IRQ	(USART2_IRQn)
#define USART3_IRQ	(USART3_IRQn)
// USART IRQ handlers	
<pre>#define USART1_IRQHandler</pre>	USART1_IRQHandler
<pre>#define USART2_IRQHandler</pre>	USART2_IRQHandler
#define USART3_IRQHandler	USART3_IRQHandler
G Regenerate	response 🛛 🕅 Continue generating





### Implementing the USART Interface (for STM32L475)









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```
usartError_t USART_Init(usartDeviceID_t device, const usartConfig_t* config)
 if (device >= USART_MAX || config == NULL) {
   return USART_ERROR;
 }
  // Enable USART clock
 if (device == USART_1) {
   RCC->APB2ENR |= RCC_APB2ENR_USART1EN;
 } else if (device == USART_2) {
   RCC->APB1ENR1 |= RCC_APB1ENR1_USART2EN;
 } else if (device == USART_3) {
   RCC->APB1ENR1 |= RCC_APB1ENR1_USART3EN;
 }
 USART_TypeDef *usart = USARTs[device];
 // Configure USART CR1 register
 usart -> CR1 = 0;
 usart->CR1 |= (config->baudRate << 4);</pre>
  usart->CR1 |= (config->
```

```
// Configure USART CR1 register
usart->CR1 = 0;
usart->CR1 |= (config->baudRate << 4);
usart->CR1 |= (config->dataBits << 12);
usart->CR1 |= (config->stopBits << 12);
usart->CR1 |= (config->parity << 9);</pre>
```

// Enable transmitter and receiver
usart->CR1 |= USART\_CR1\_TE | USART\_CR1\_RE;

```
// Enable USART
usart->CR1 |= USART_CR1_UE;
```

return USART\_OK;







### Implementing the USART Interface (for STM32L475)

```
usartError_t USART_Send(usartDeviceID_t device, const uint8_t* data, uint32
 if (device >= USART_MAX || data == NULL || size == 0) {
   return USART_ERROR;
 }
 USART_TypeDef *usart = USARTs[device];
 for (uint32_t i = 0; i < size; i++) {</pre>
   // Wait until transmit data register is empty
   while (!(usart->SR & USART_SR_TXE)) {}
   // Write data to transmit data register
    usart->DR = data[i];
 }
 return USART_OK;
```

#### usartError\_t USART\_Receive(usartDeviceID\_t device, uint8\_t\* buffer, uint32\_\*

```
if (device >= USART_MAX || buffer == NULL || size == 0) {
  return USART_ERROR;
}
```

```
USART_TypeDef *usart = USARTs[device];
```

```
for (uint32_t i = 0; i < size; i++) {
    // Wait until read data register is not empty
    while (!(usart->SR & USART_SR_RXNE)) {}
```

```
// Read data from read data register
buffer[i] = usart->DR;
```

```
return USART_OK;
```

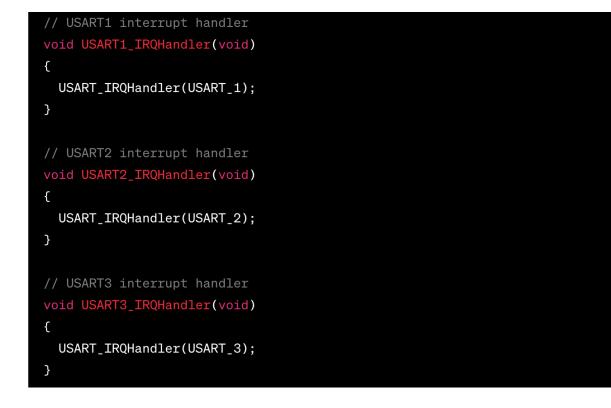
}







### Implementing the USART Interface (for STM32L475)

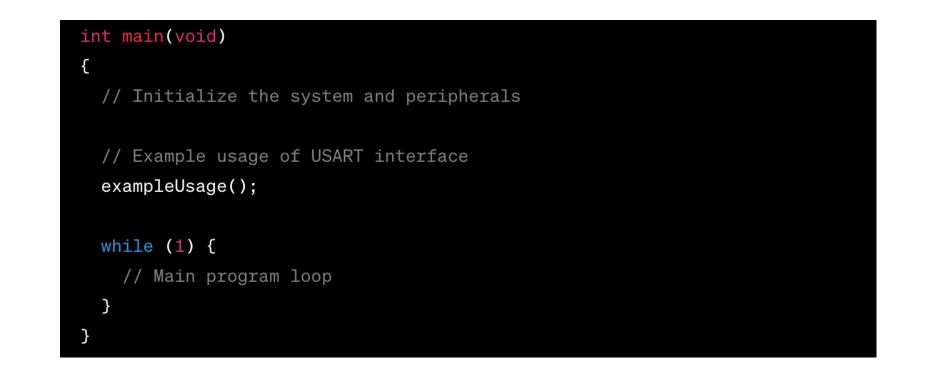


#### void exampleUsage(void) // Configure USART1 with desired settings usartConfig\_t config = { .baudRate = 115200, .dataBits = 8, .stopBits = 1,.parity = 0,.callback = NULL // Add your callback function here if needed }; USART\_Init(USART\_1, &config); // Example transmit data uint8\_t txData[] = "Hello, USART!"; USART\_Send(USART\_1, txData, sizeof(txData)); // Example receive data uint8\_t rxBuffer[16]; USART\_Receive(USART\_1, rxBuffer, sizeof(rxBuffer));





### Implementing the USART Interface (for STM32L475)



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# Going Further

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# AI and ML Resources

- Jacob's Al Blogs
- Jacob's CEC courses
- Jacob's ML Blogs
- Embedded Bytes Newsletter
  - <u>http://bit.ly/1BAHYXm</u>

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