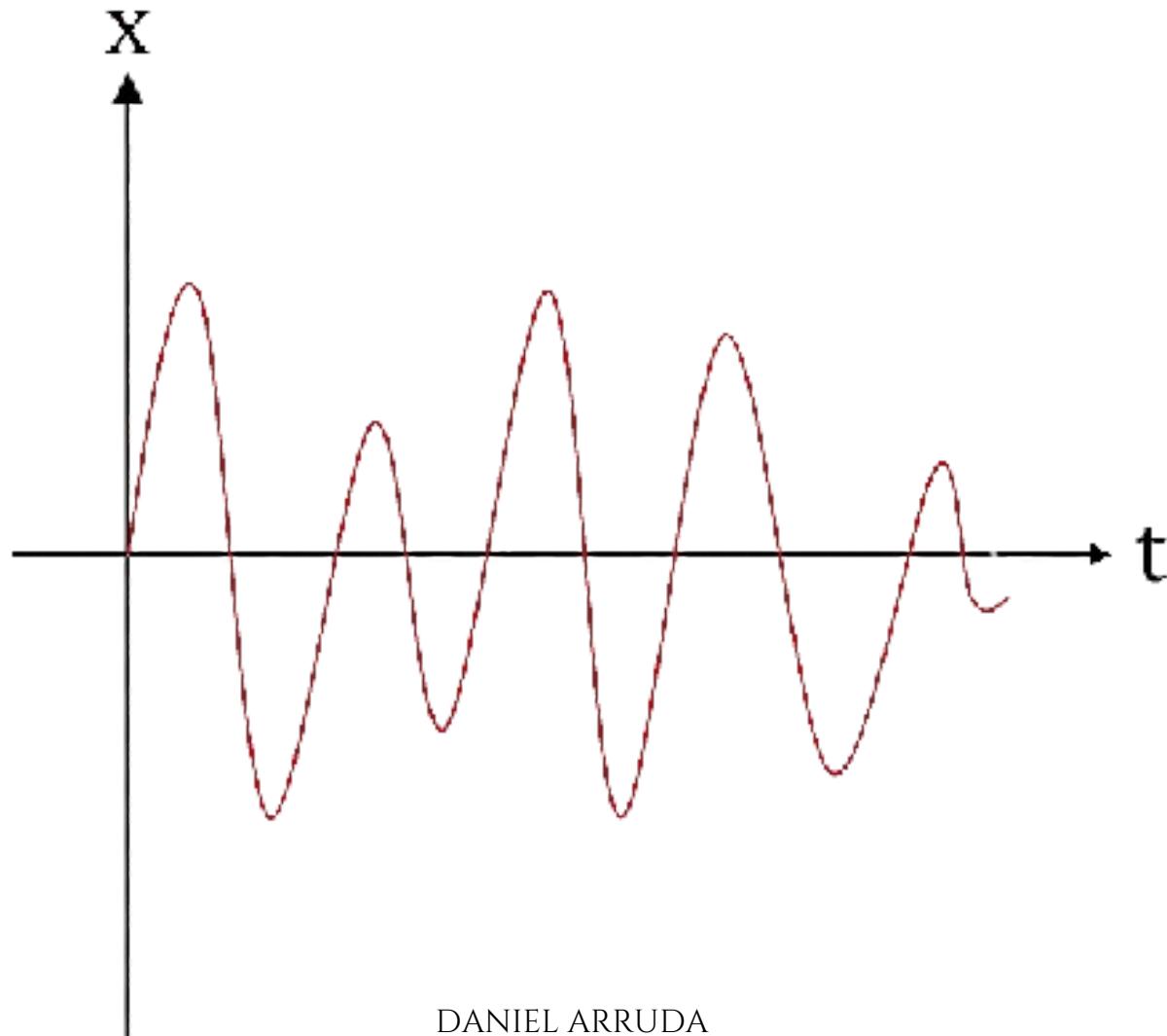


# DECOMPOSIÇÃO EM VALORES SINGULARES APLICADA EM PROCESSAMENTO DE SINAIS

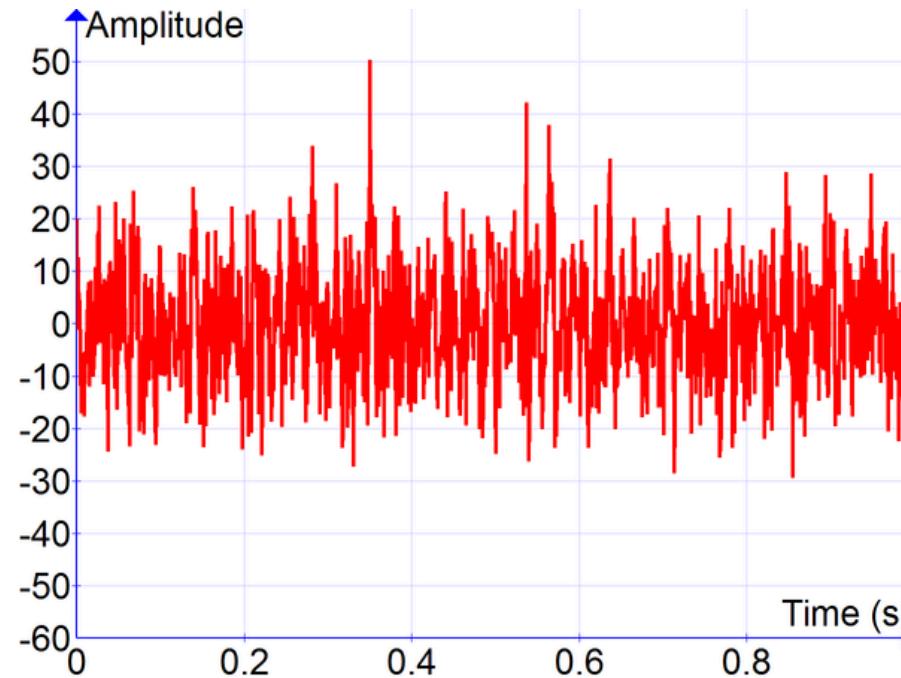


DANIEL ARRUDA  
MANOEL SILVA  
PEDRO JORGE

# SINAIS

Conjunto de dados observados que representam algum fenômeno, geralmente ao longo do tempo:

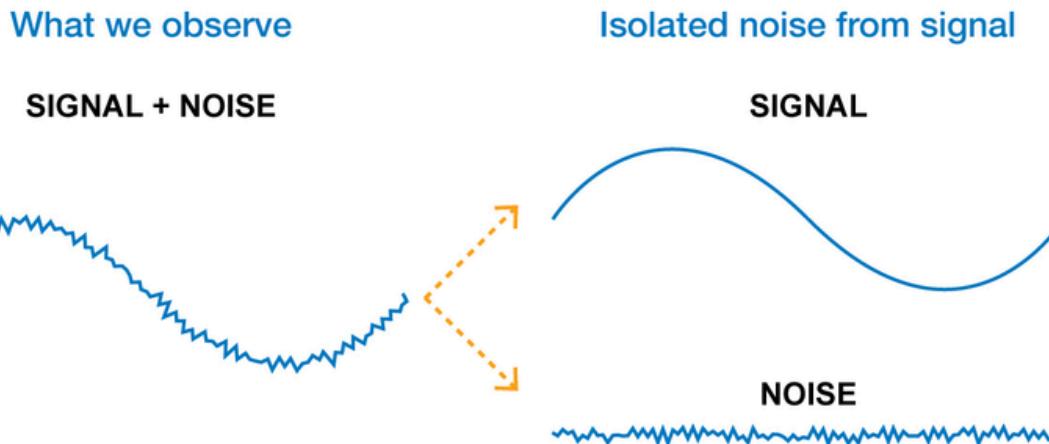
- Áudios
- Imagens
- Vídeos
- Redes sem fio
- Fenômenos físicos



# POR QUE PROCESSAR SINAIS?

Os sinais medidos podem apresentar ruídos e interrupções, ou há o interesse em analisá-los e modificá-los para algum propósito. Alguns exemplos de processamento são:

- Identificar objetos em imagens e vídeos
- Remover ruídos de áudios
- Comprimir áudios, imagens e vídeos

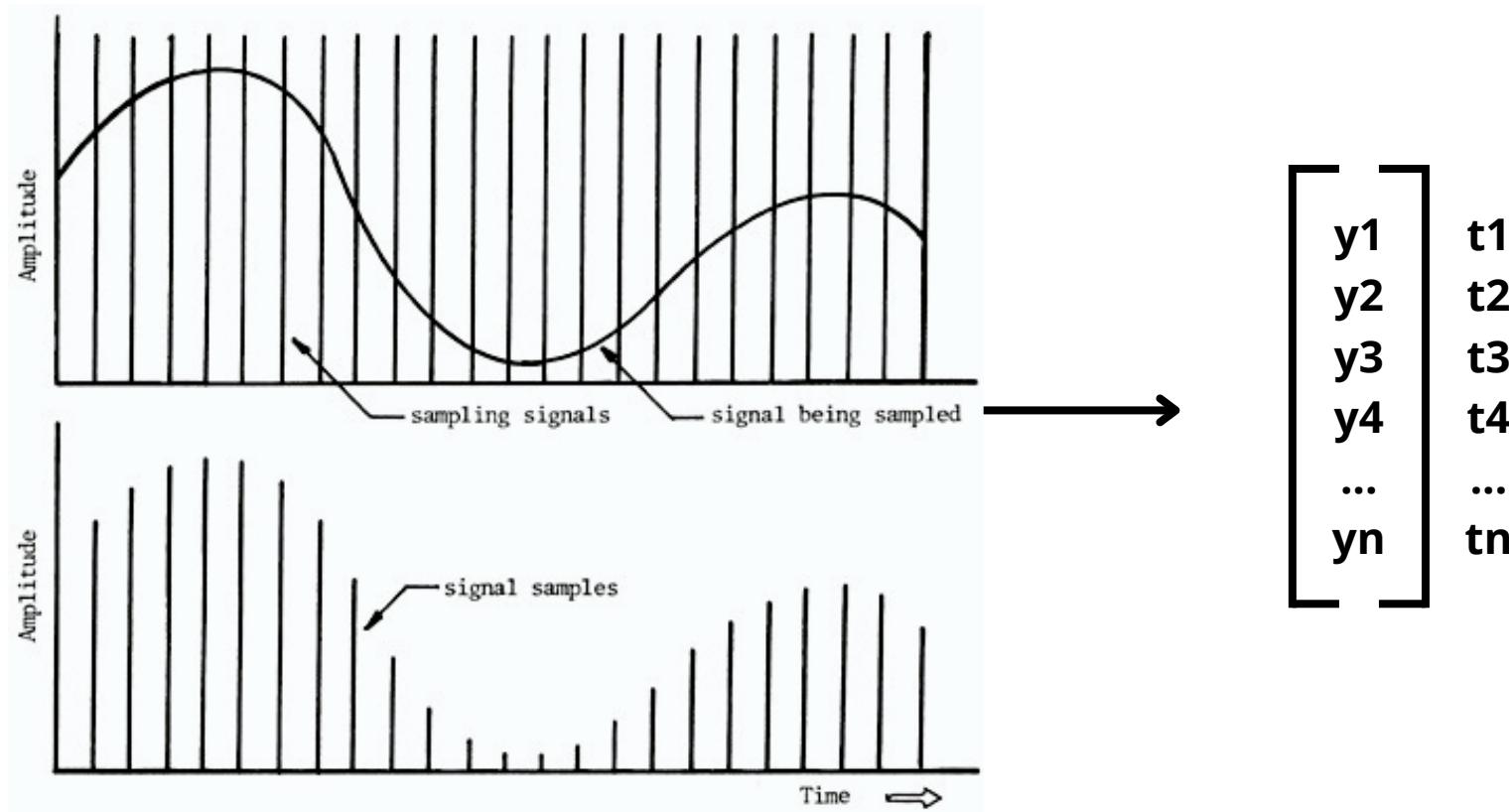


**FIGURE 2. Isolated Noise from Signal**

# COMO PROCESSAR?

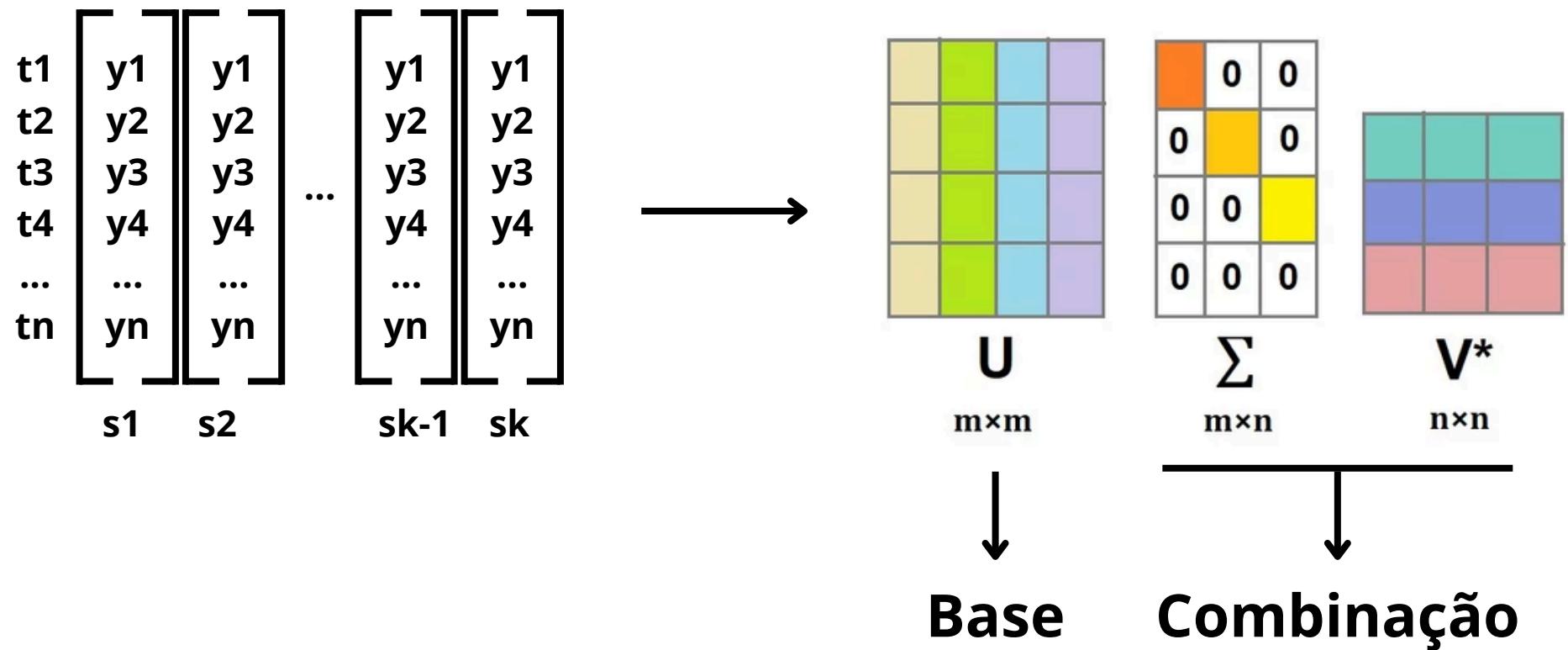
Como sinais são objetos contínuos, que geralmente não sabemos sua função - caso haja, precisamos fazer um sampling deste sinal.

Para isso, basicamente dividimos o sinal em intervalos idênticos de tempo para armazenar, quanto menor o intervalo, mais valores teremos



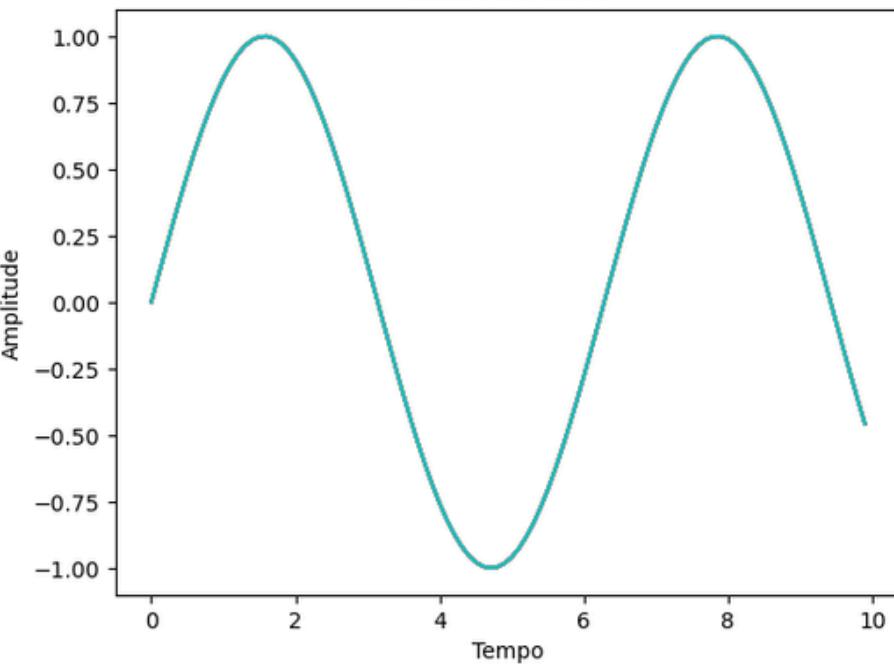
# COMO PROCESSAR?

Com o vetor que representa o sinal, iremos juntar varios sinais em uma matriz e aplicar o SVD.

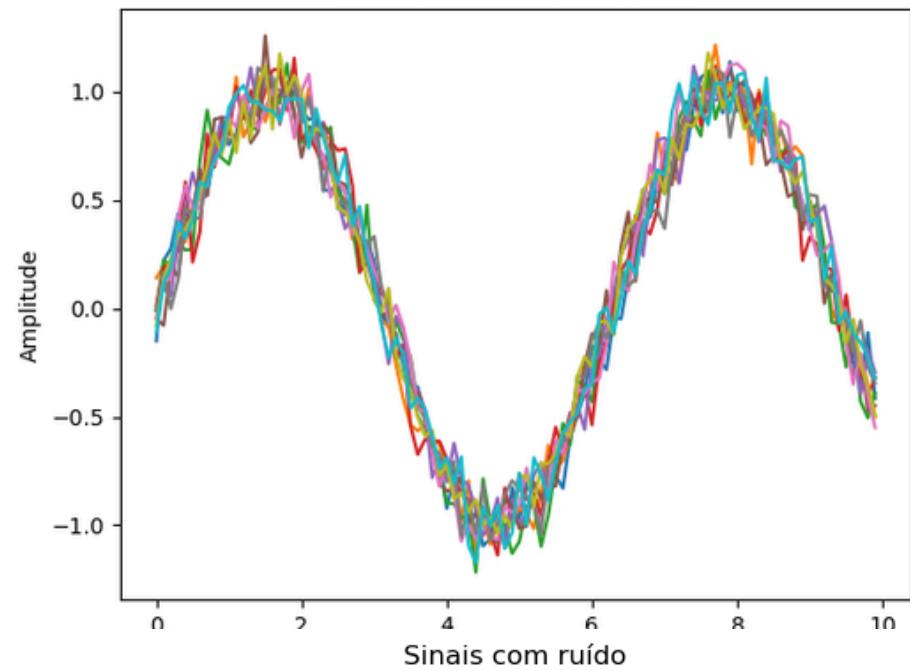


# GERANDO SINAIS COM RUÍDO

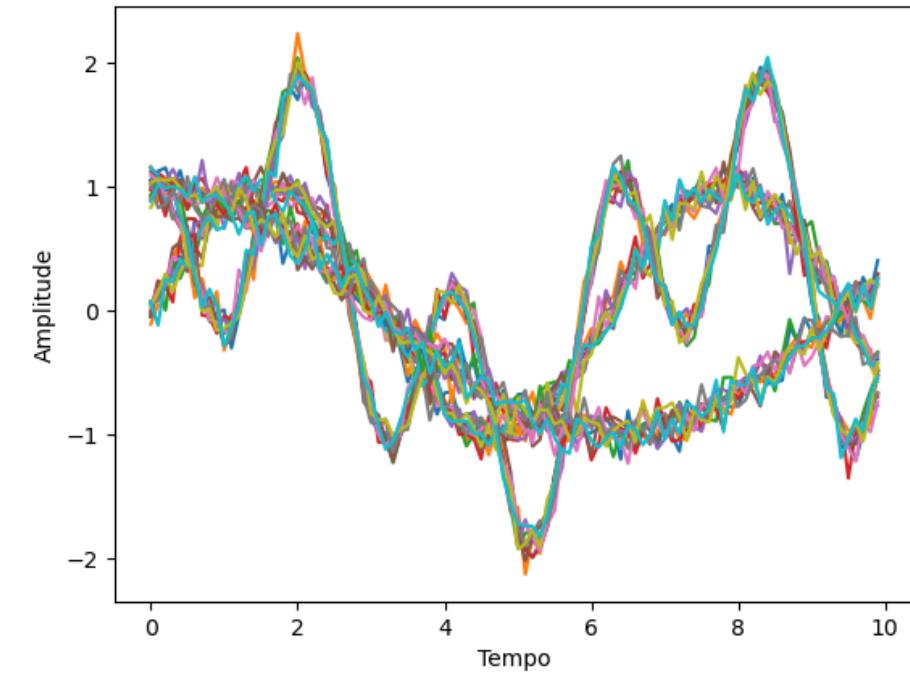
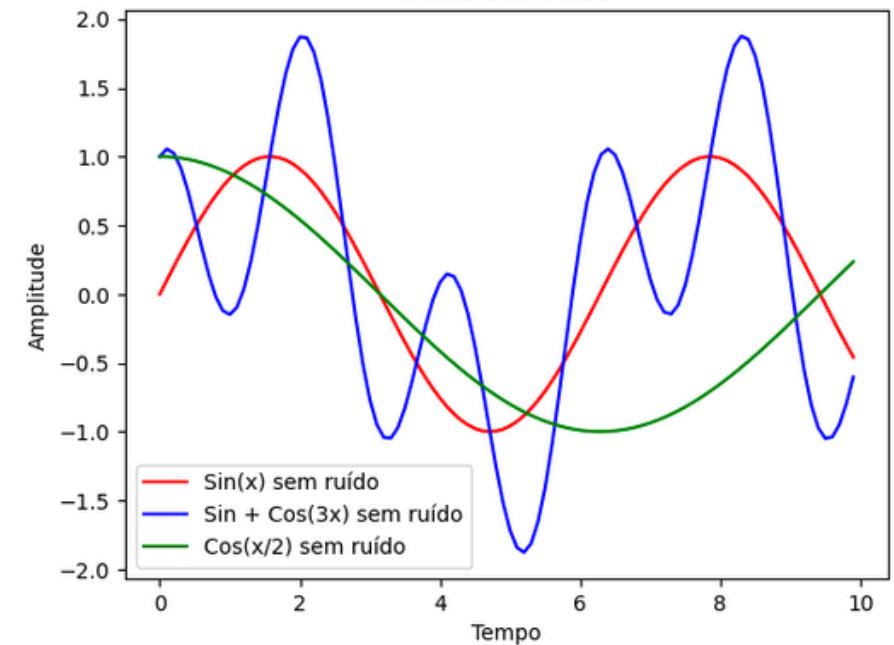
Seno sem ruído



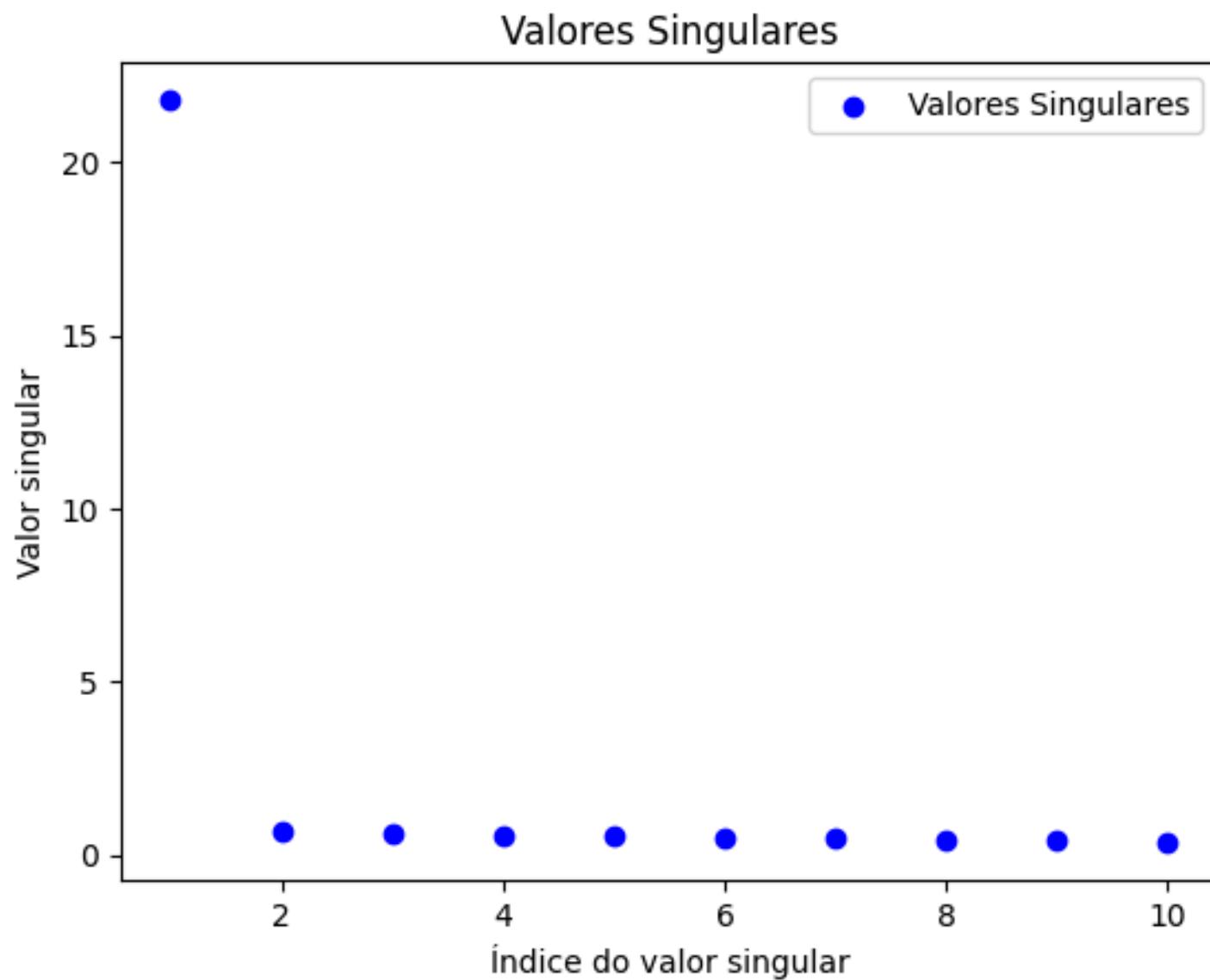
Sinais senoidais com ruído



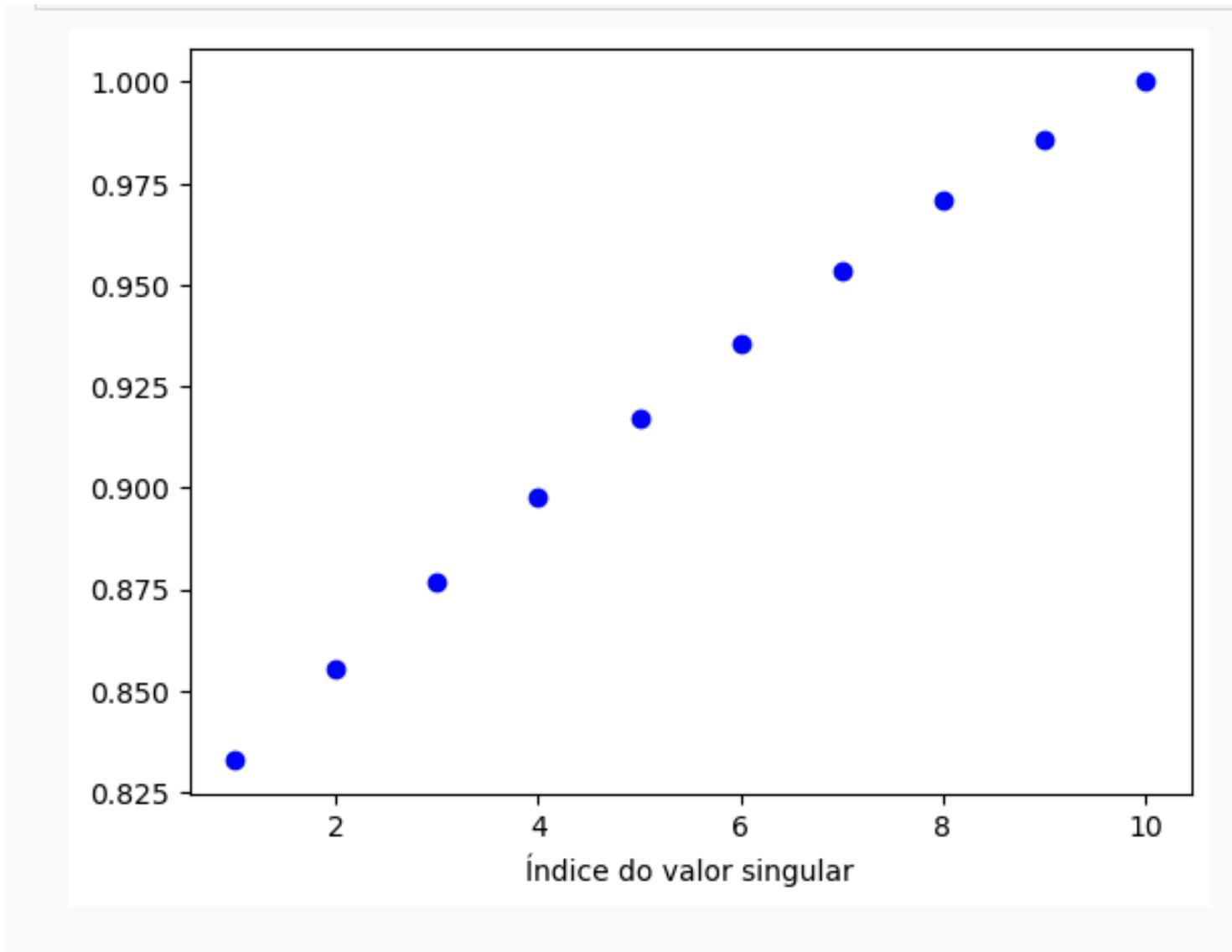
Sinais sem ruído



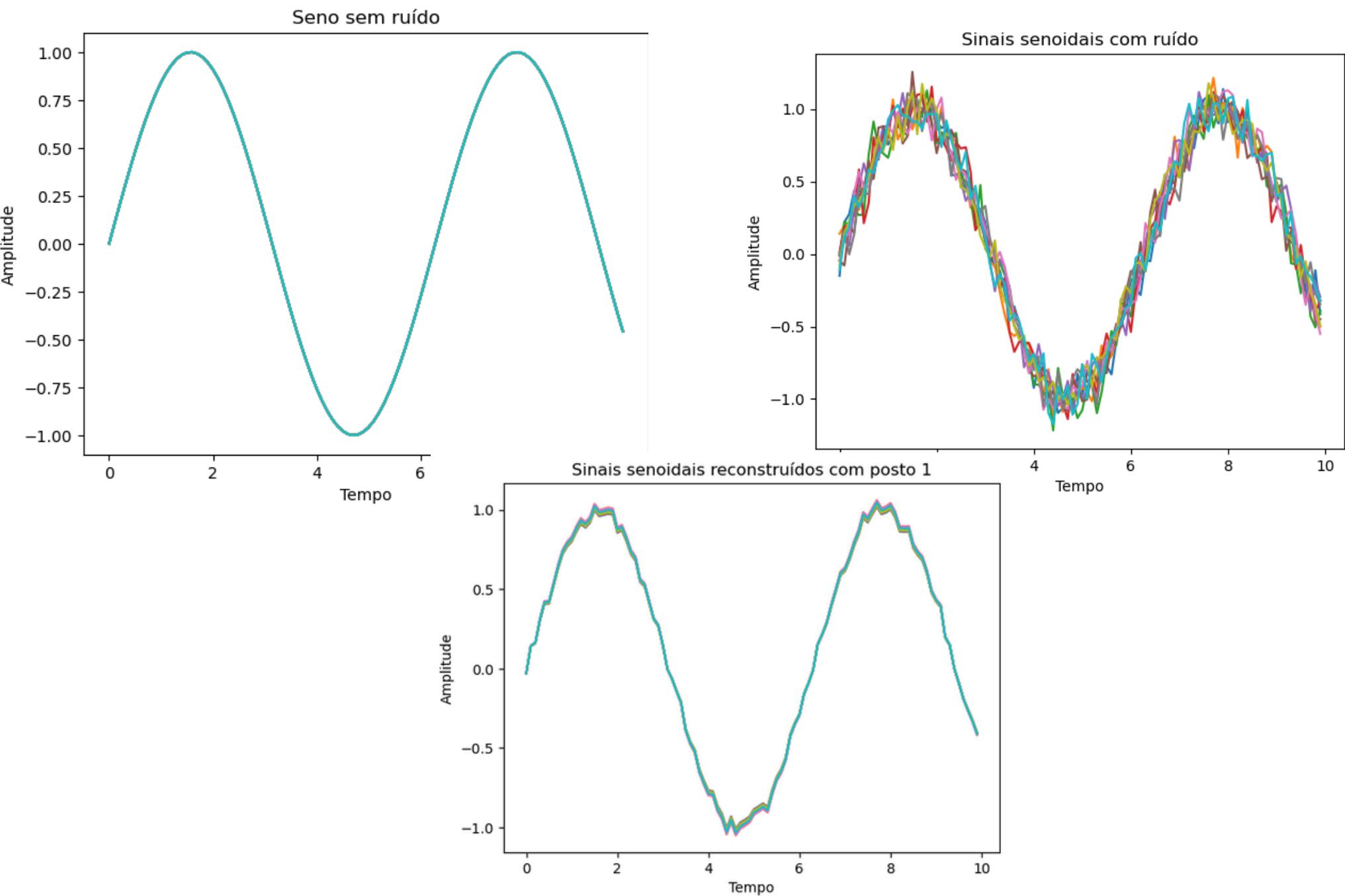
# VALORES SINGULARES DE SIN(X) RUIDOSO



# VALORES SINGULARES DE SIN(X) RUIDOSO

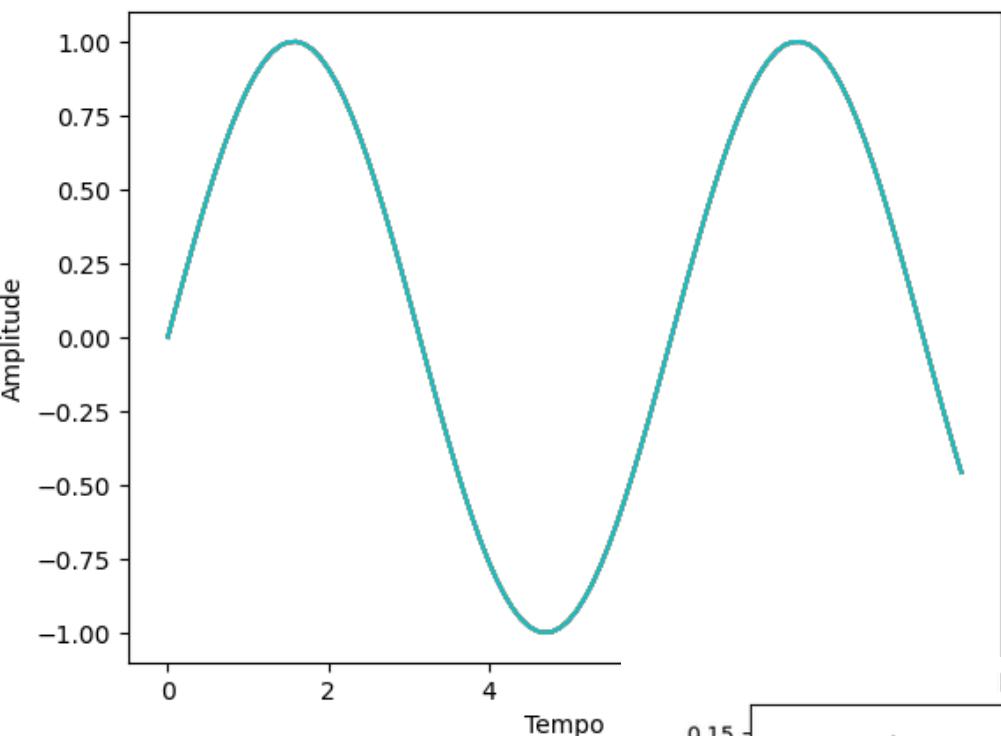


# RECONSTRUINDO O SINAL

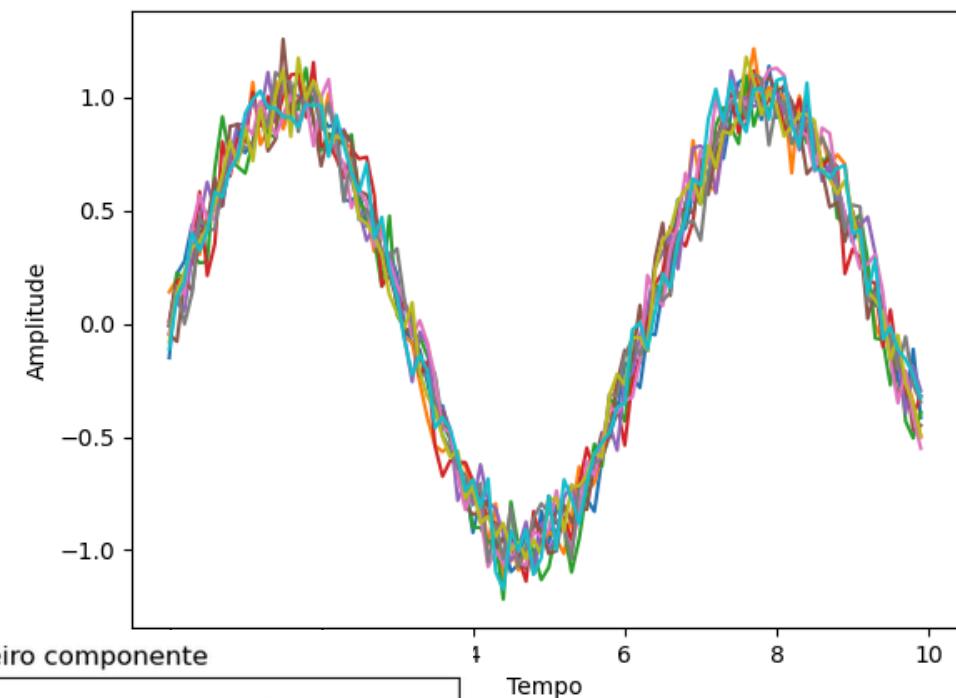


# RECONSTRUINDO O SINAL

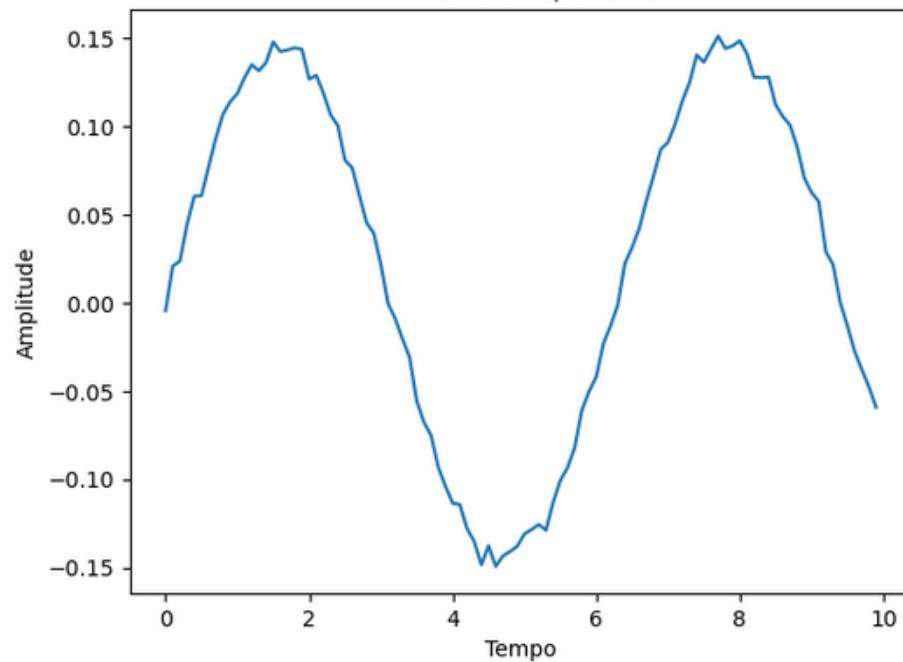
Seno sem ruído



Sinais senoidais com ruído

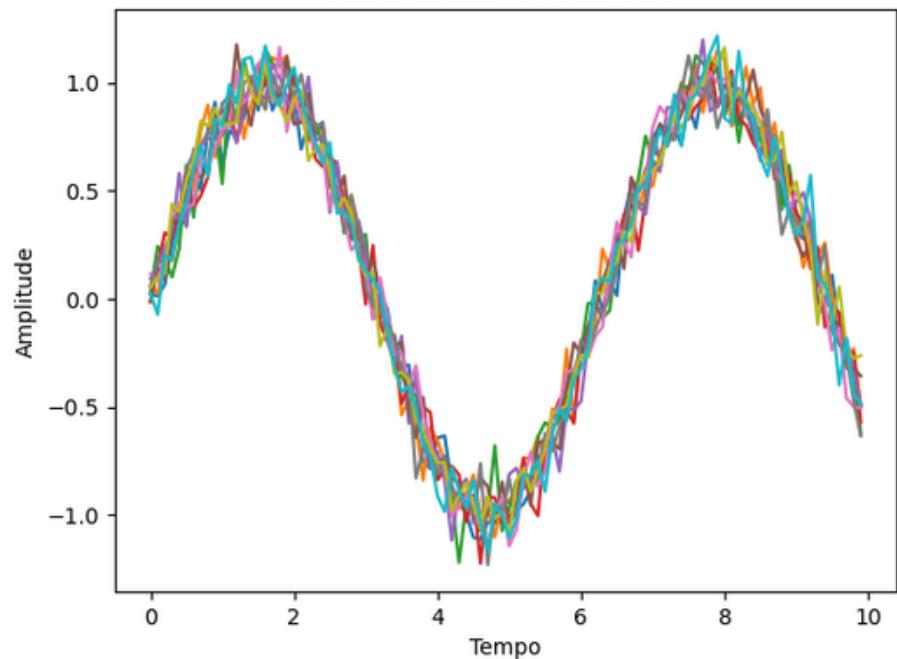


Primeiro componente

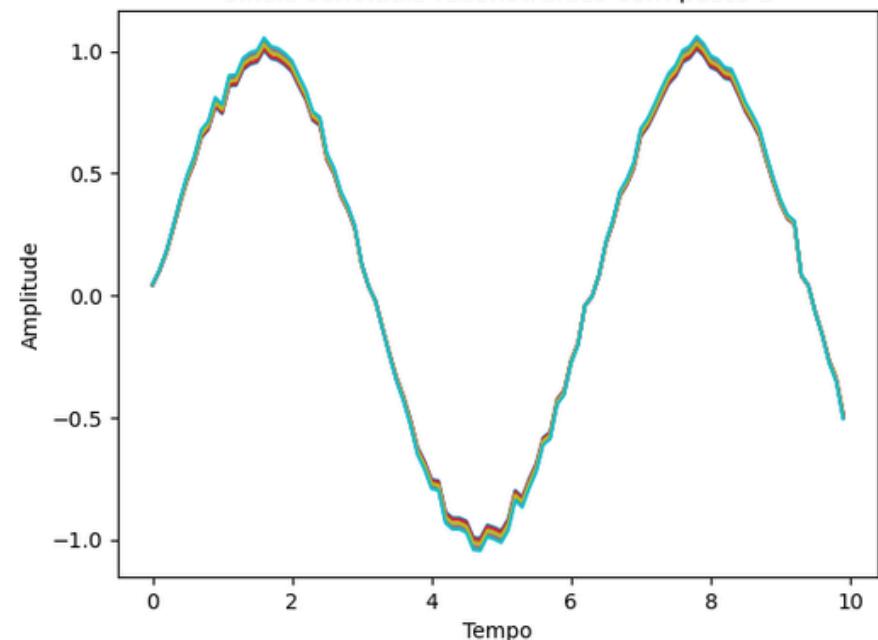


# RECONSTRUINDO O SINAL

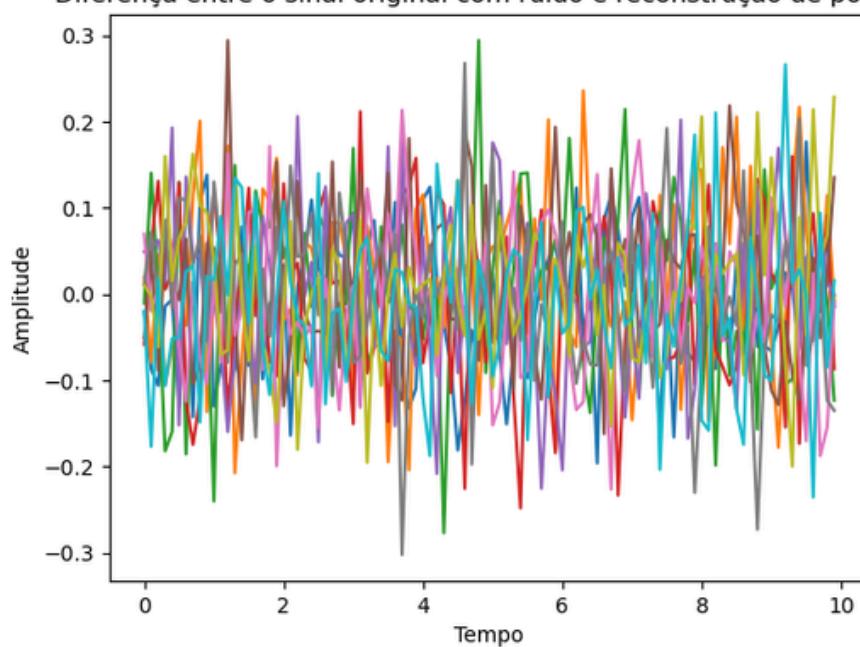
Sinais senoidais com ruído



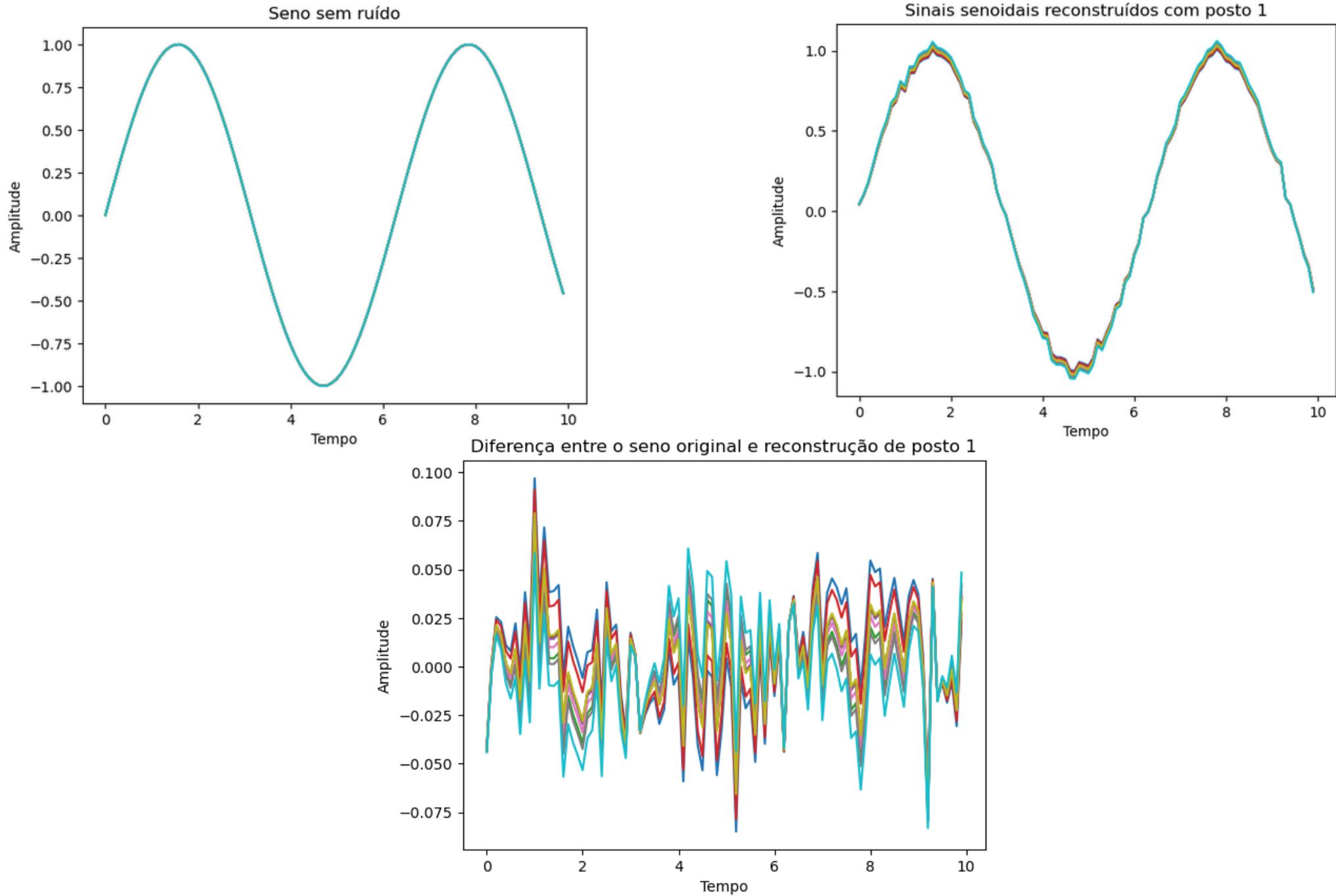
Sinais senoidais reconstruídos com posto 1



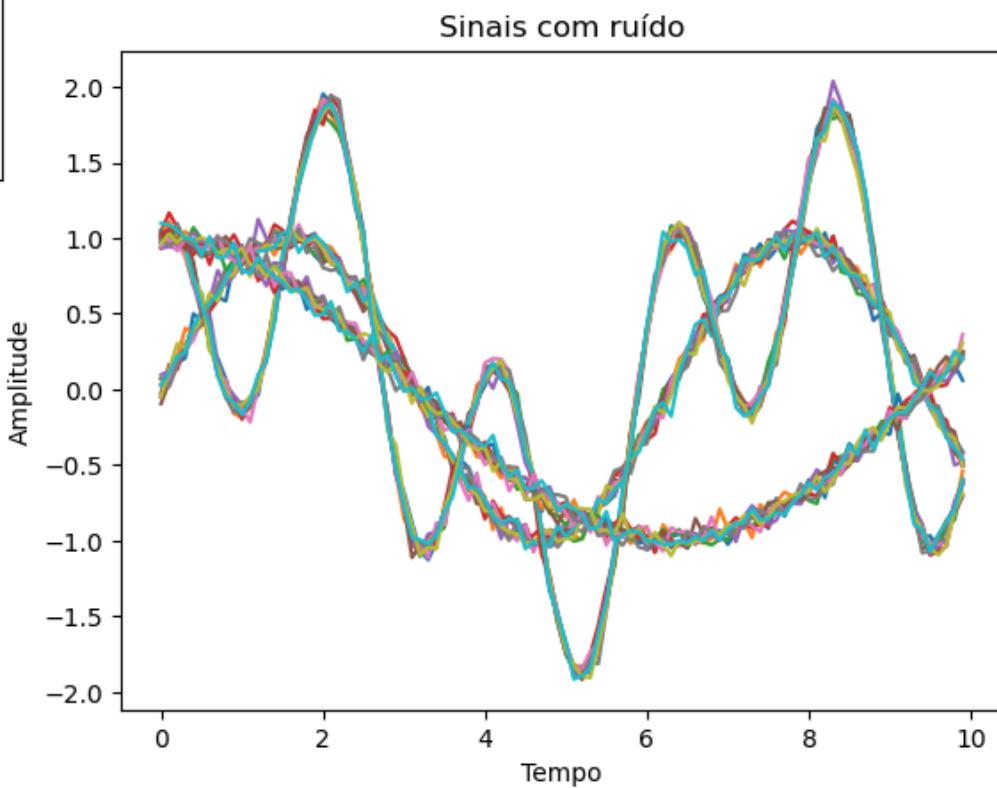
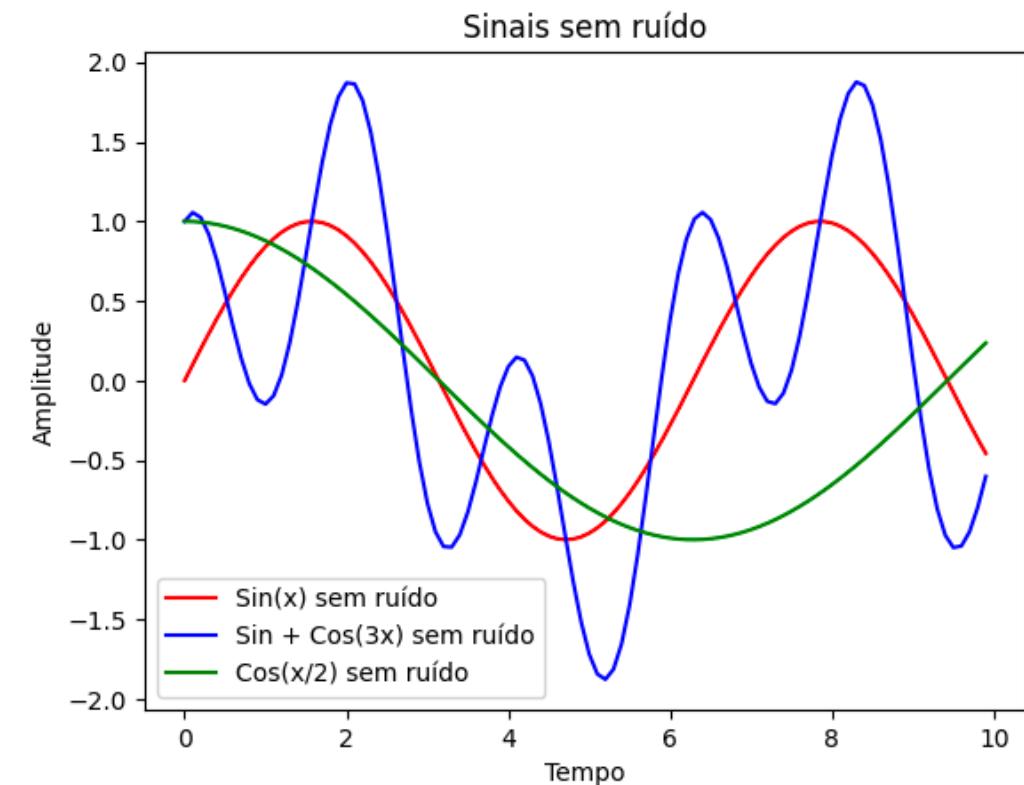
Diferença entre o sinal original com ruído e reconstrução de posto 1



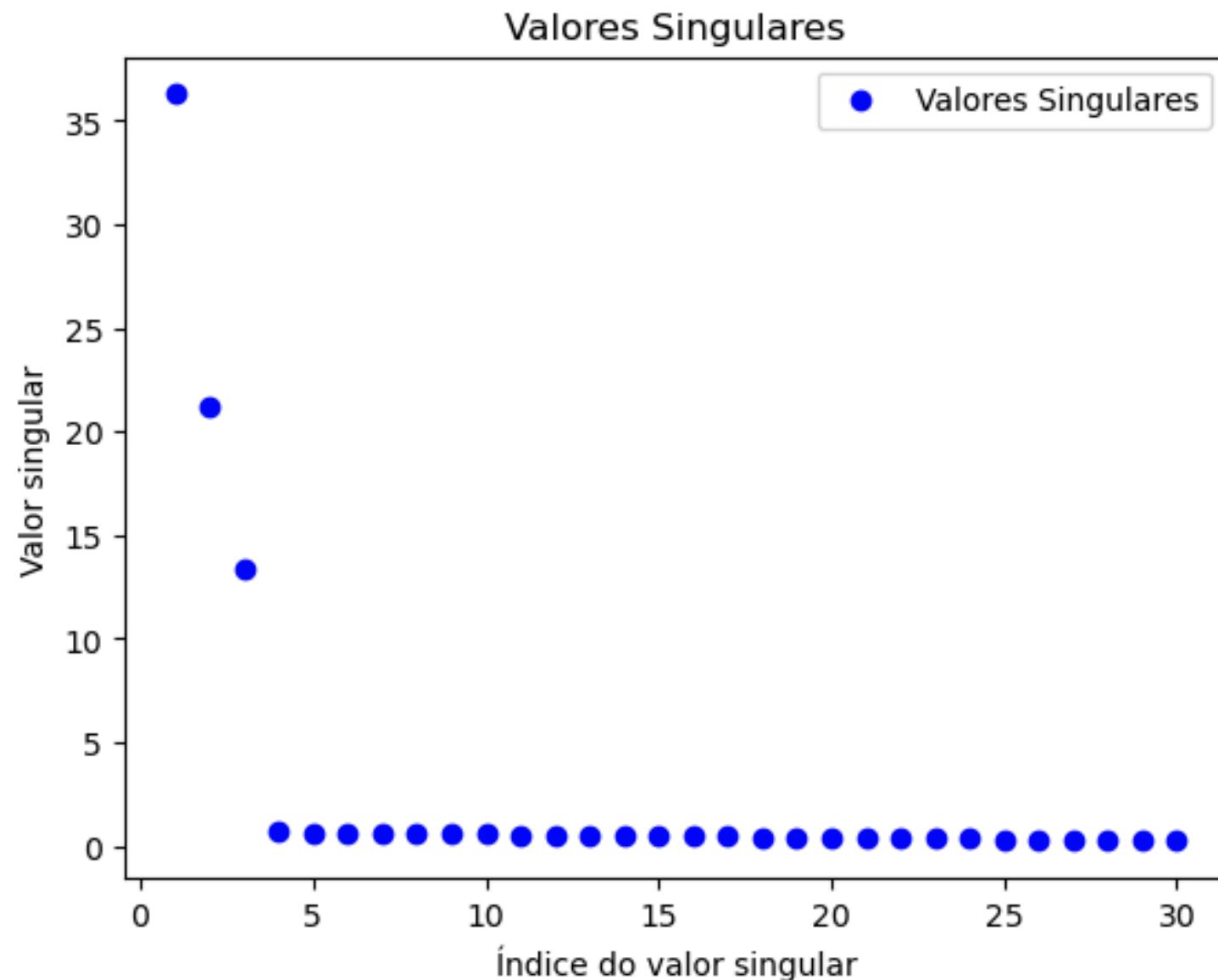
# RECONSTRUINDO O SINAL



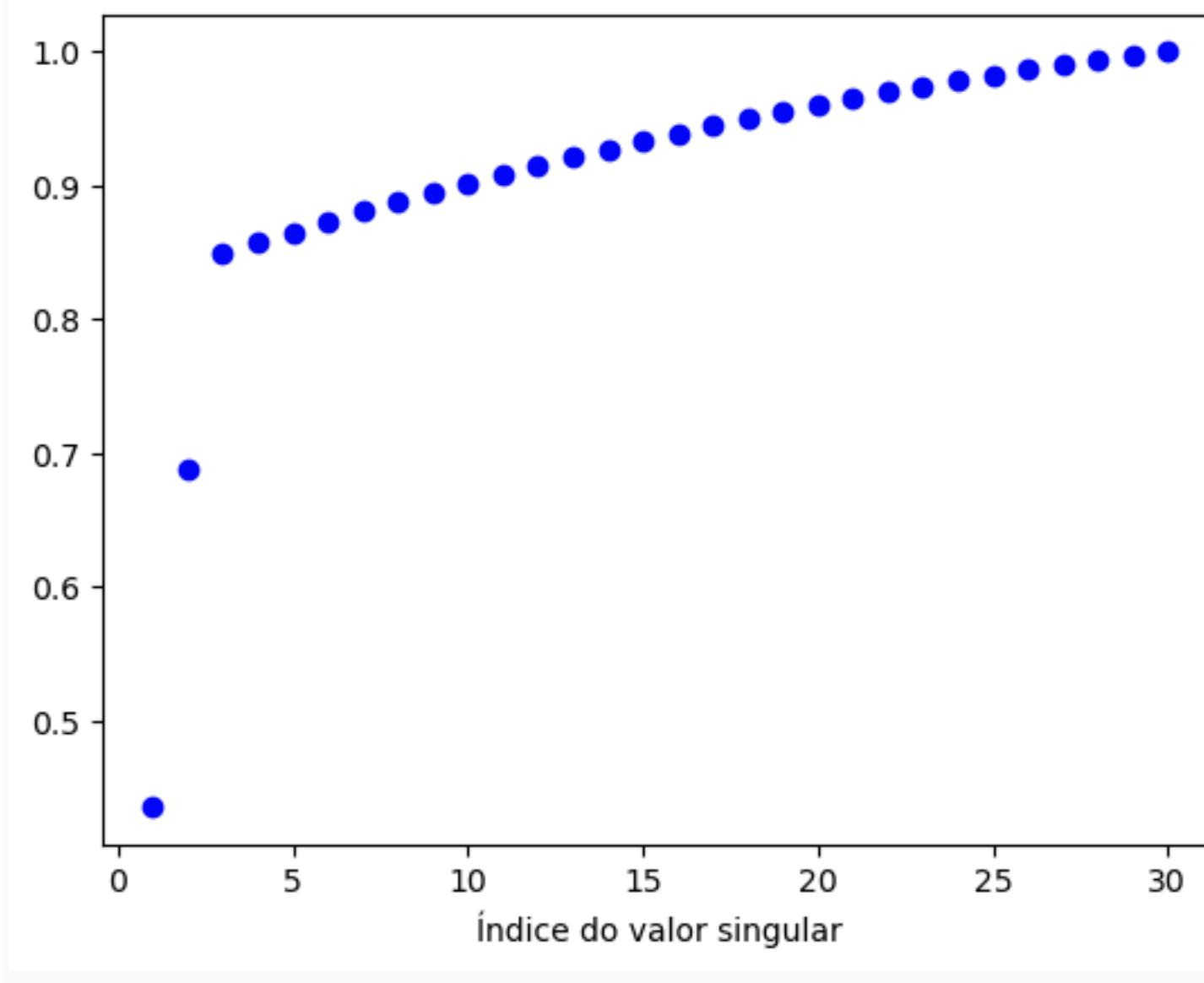
# SINAIS RUIDOSOS COMBINADOS



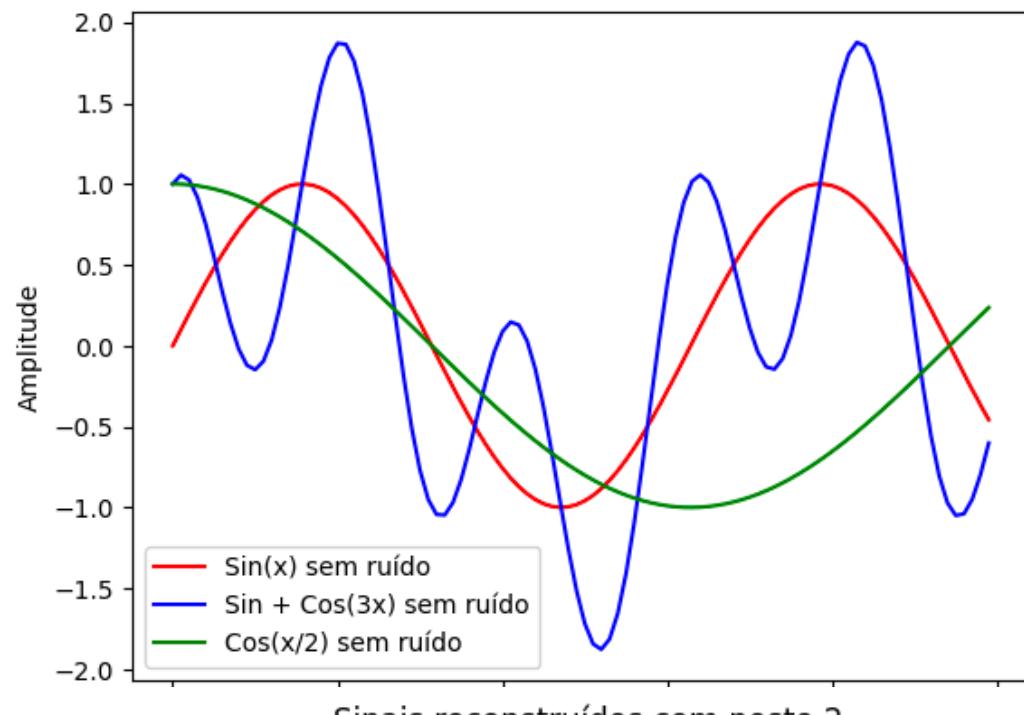
# VALORES SINGULARES DOS SINAIS RUIDOSOS COMBINADOS



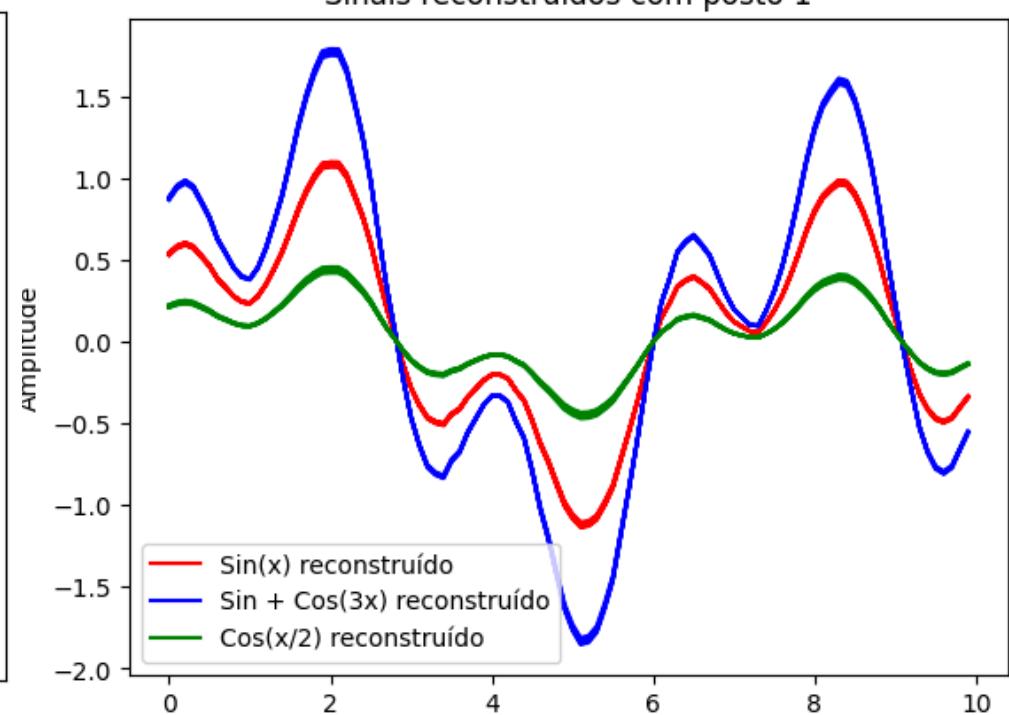
# VALORES SINGULARES DOS SINAIS RUIDOSOS COMBINADOS



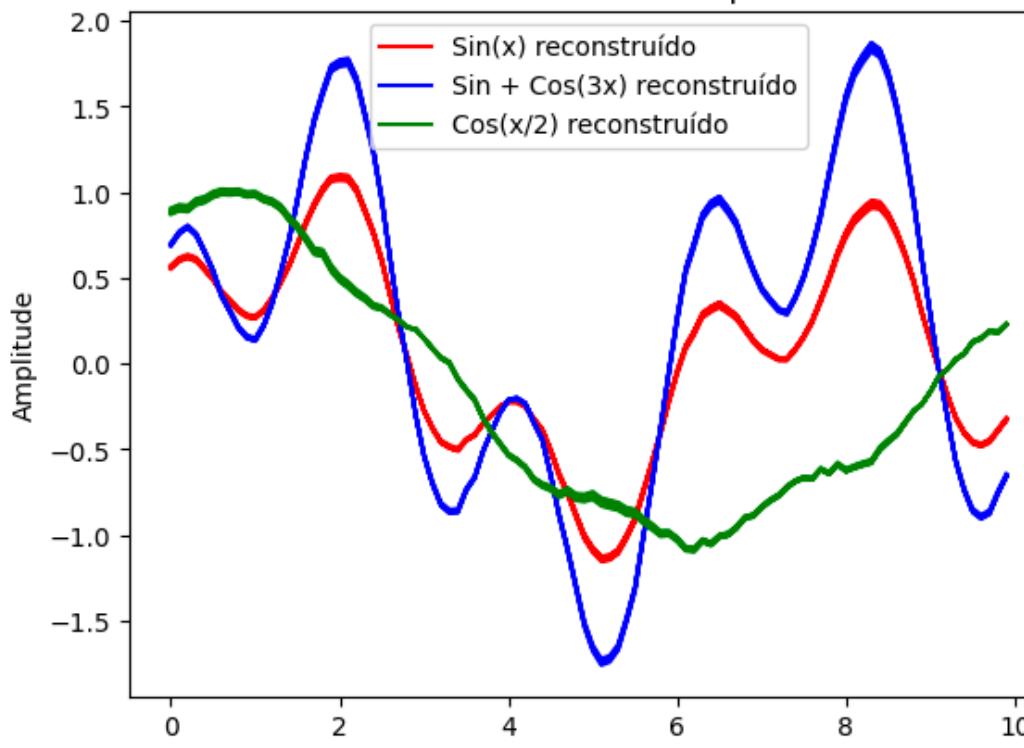
Sinais sem ruído



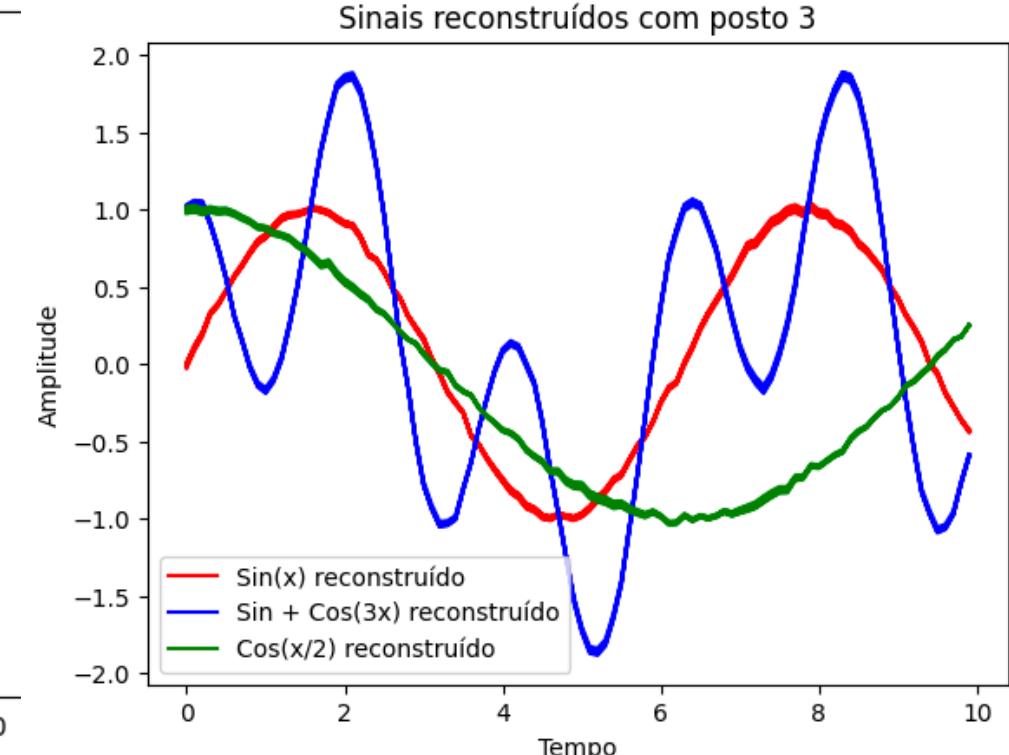
Sinais reconstruídos com posto 1



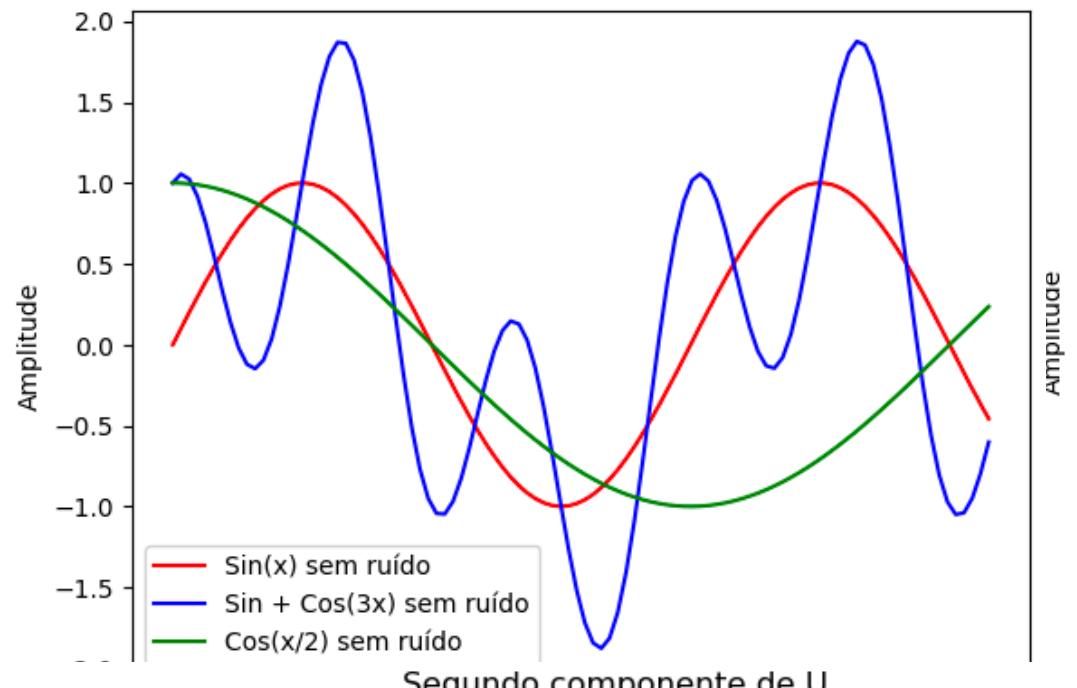
Sinais reconstruídos com posto 2



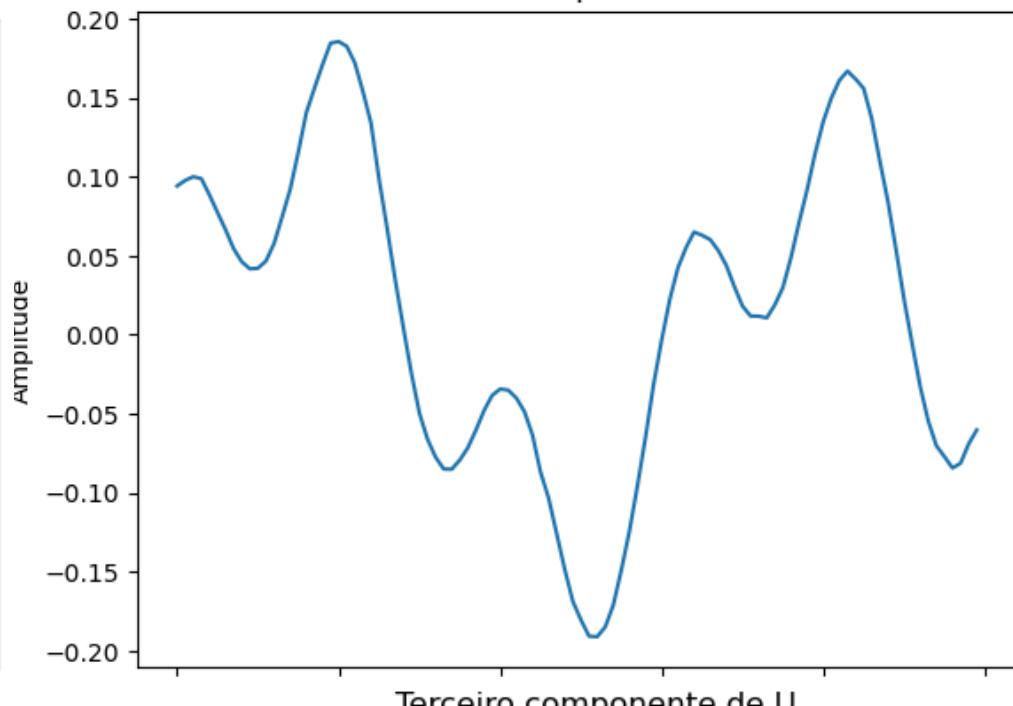
Sinais reconstruídos com posto 3



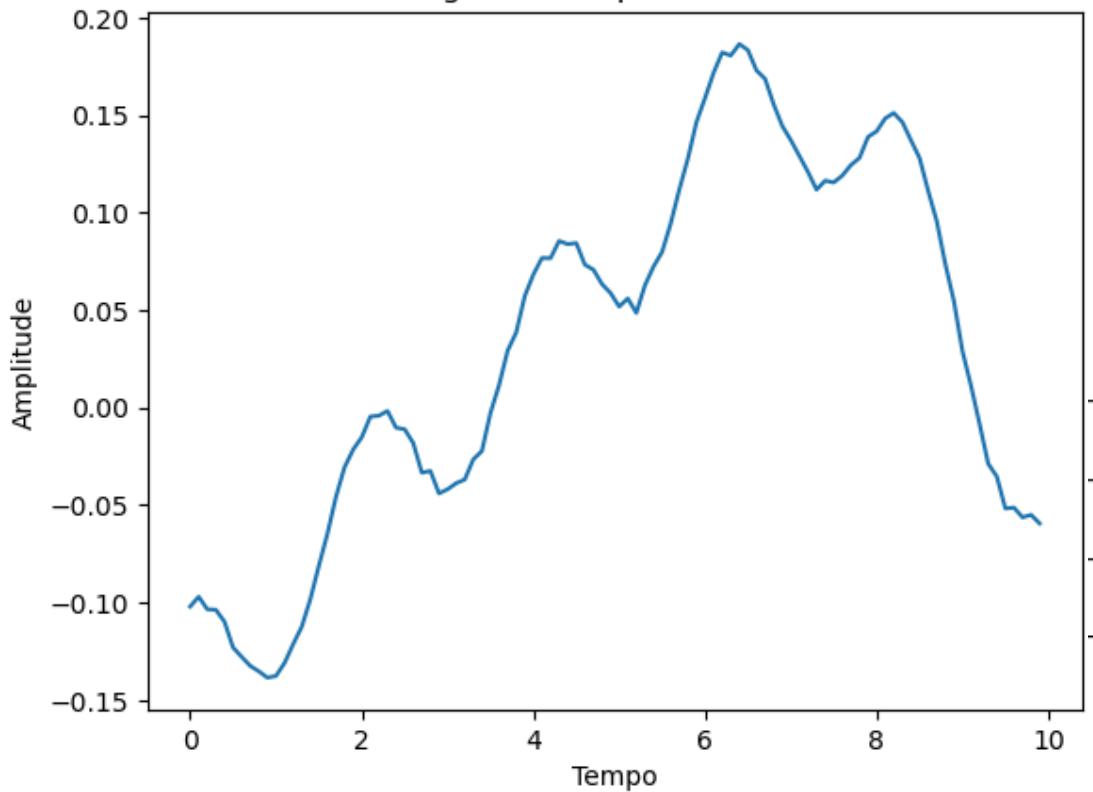
Sinais sem ruído



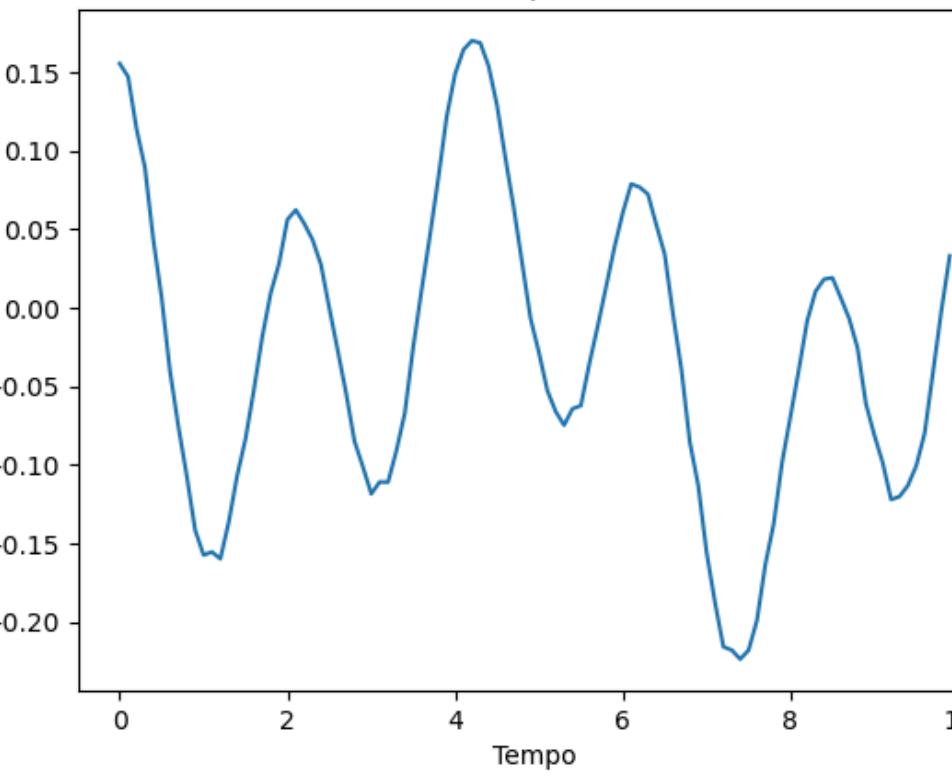
Primeiro componente de U



Segundo componente de U

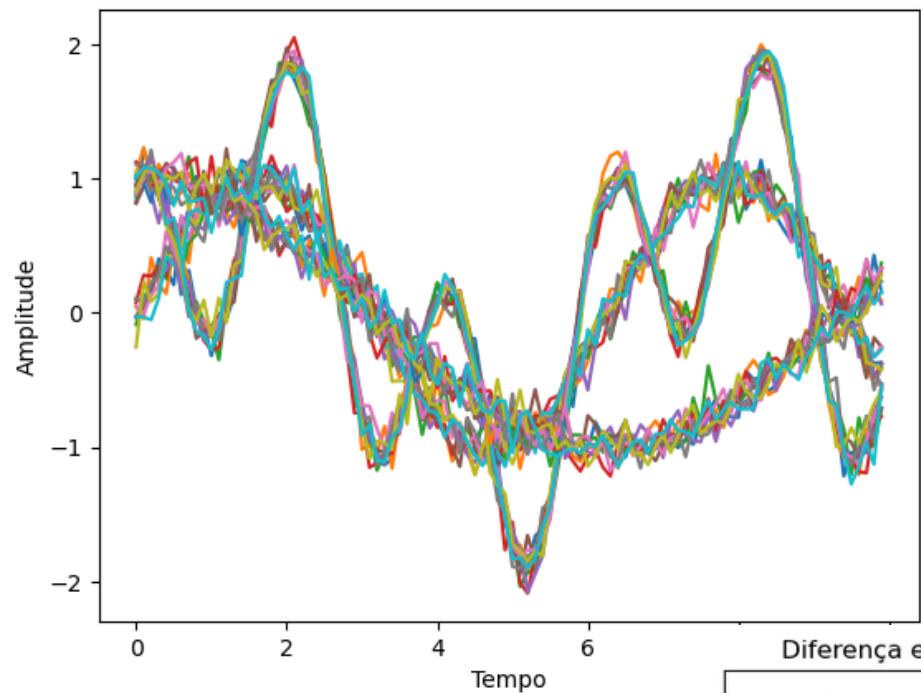


Terceiro componente de U

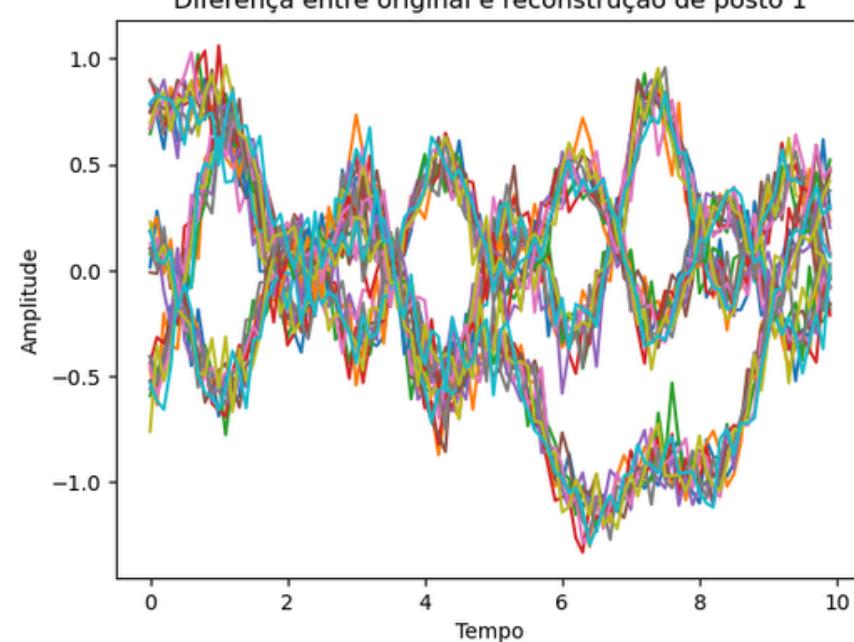
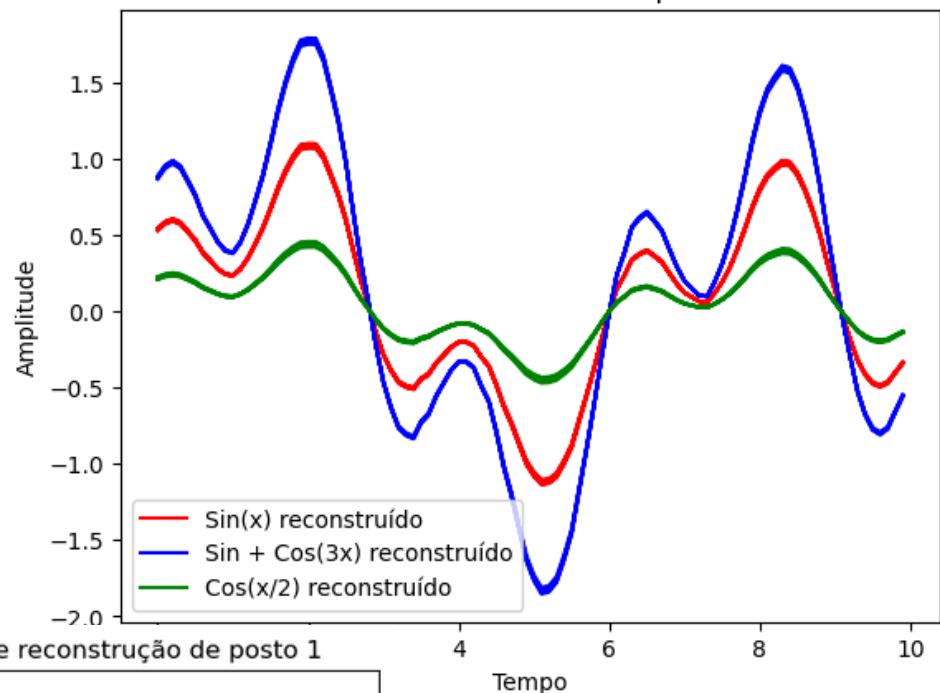


# SINAIS RUIDOSOS COMBINADOS

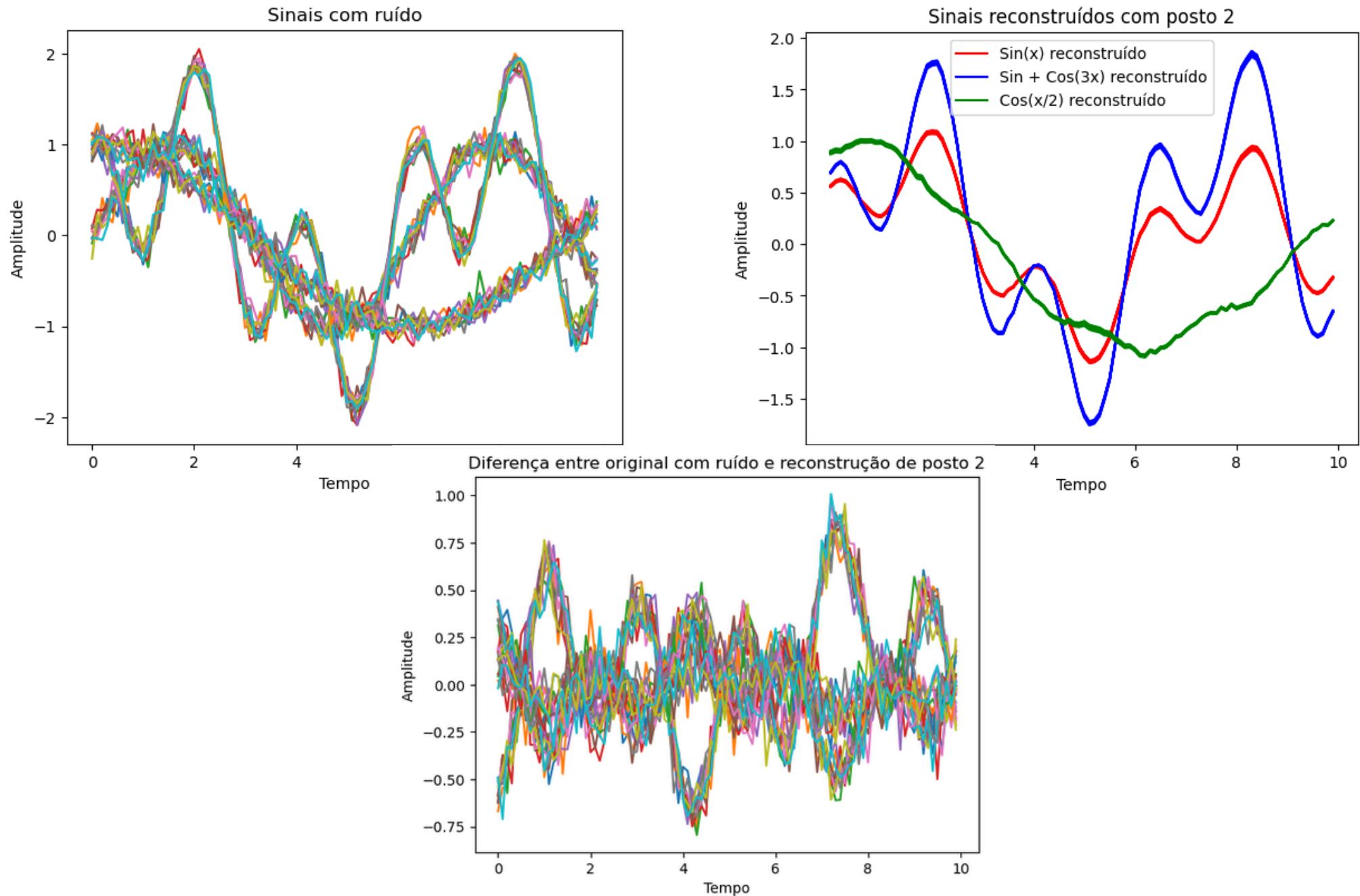
Sinais com ruído



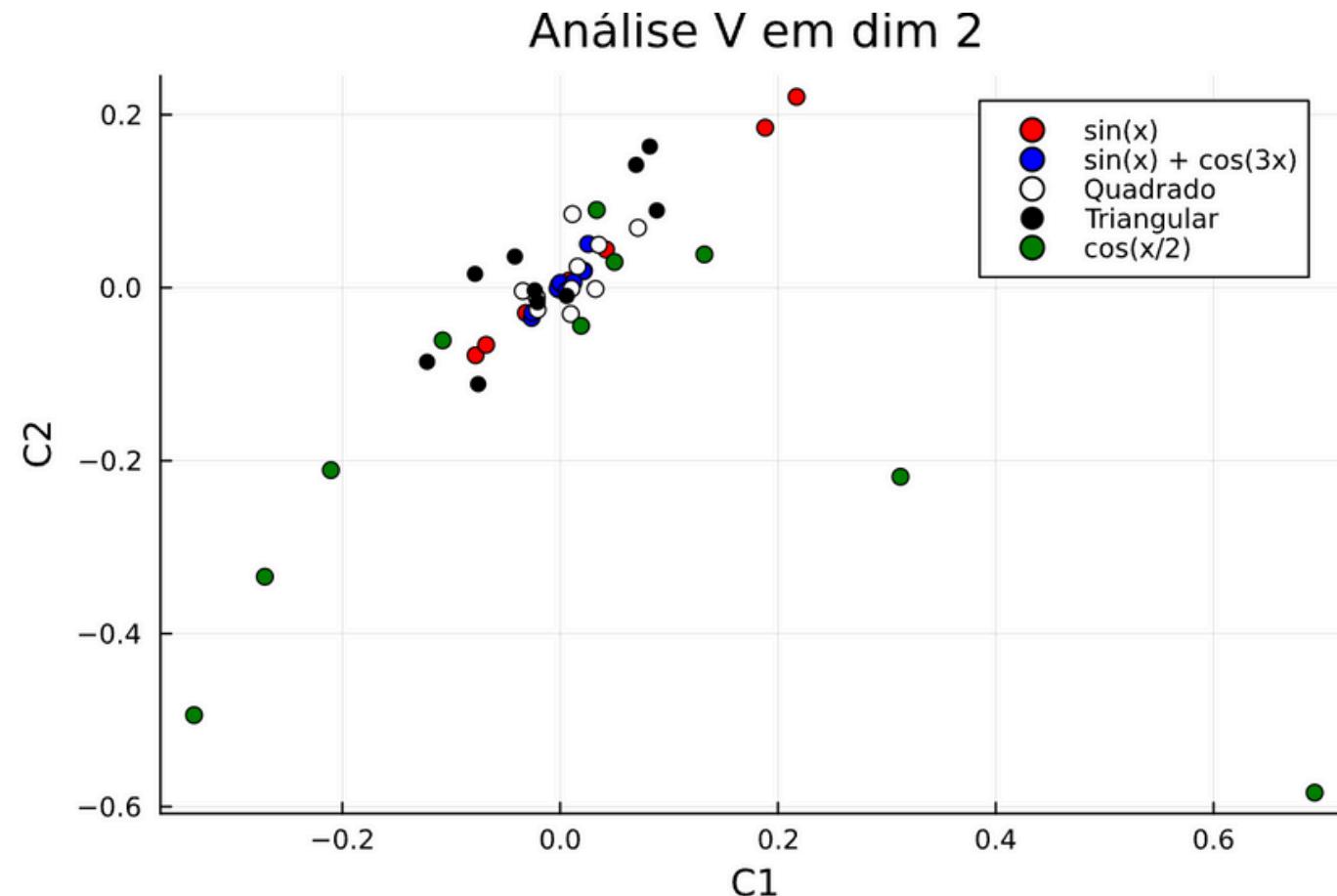
Sinais reconstruídos com posto 1



# SINAIS RUIDOSOS COMBINADOS

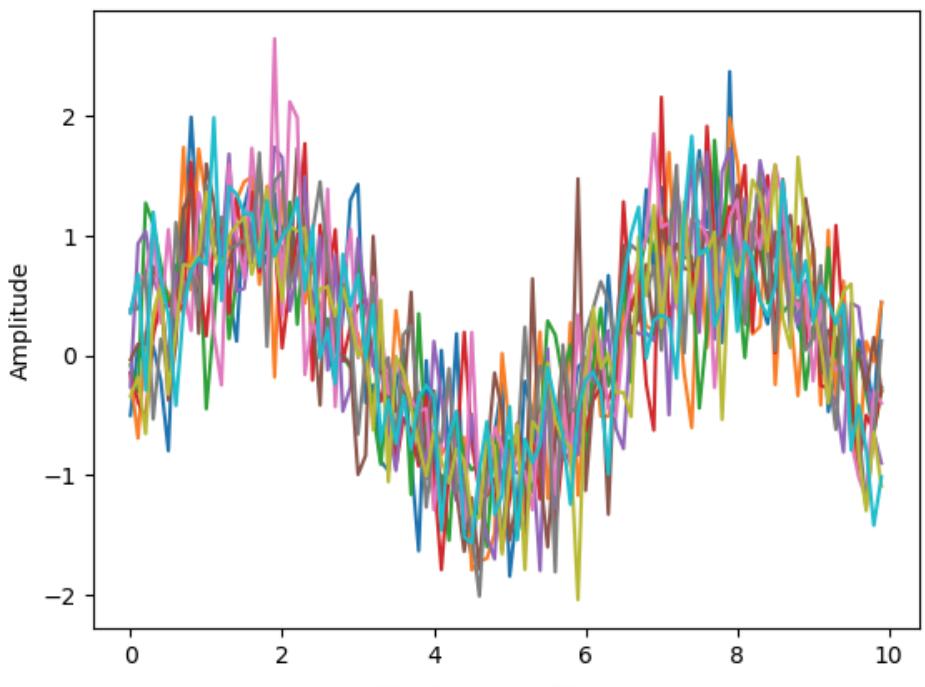


# SINAIS RUIDOSOS COMBINADOS

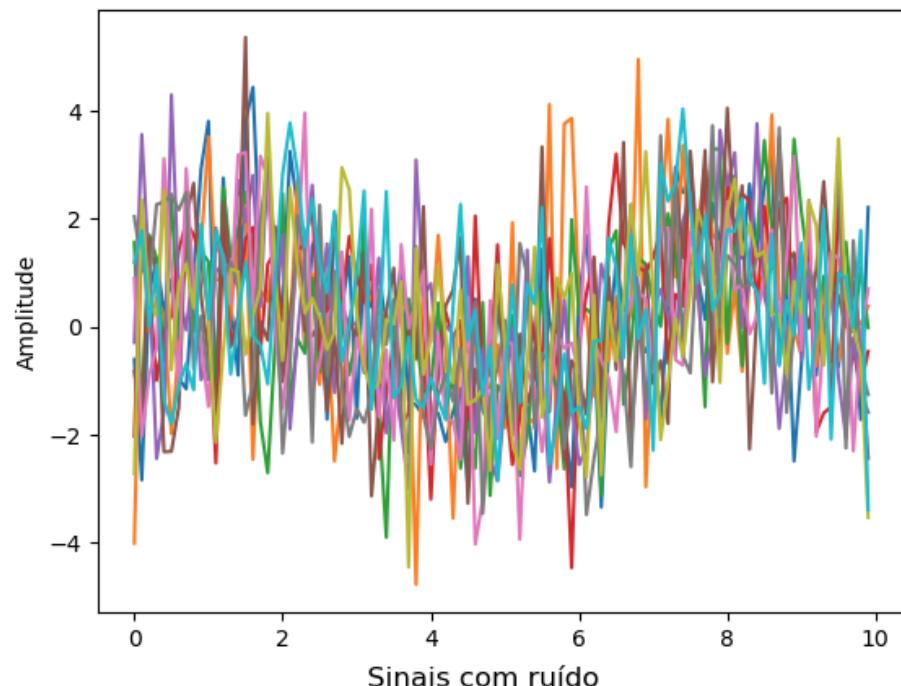


# SINAIS MUITO RUIDOSOS

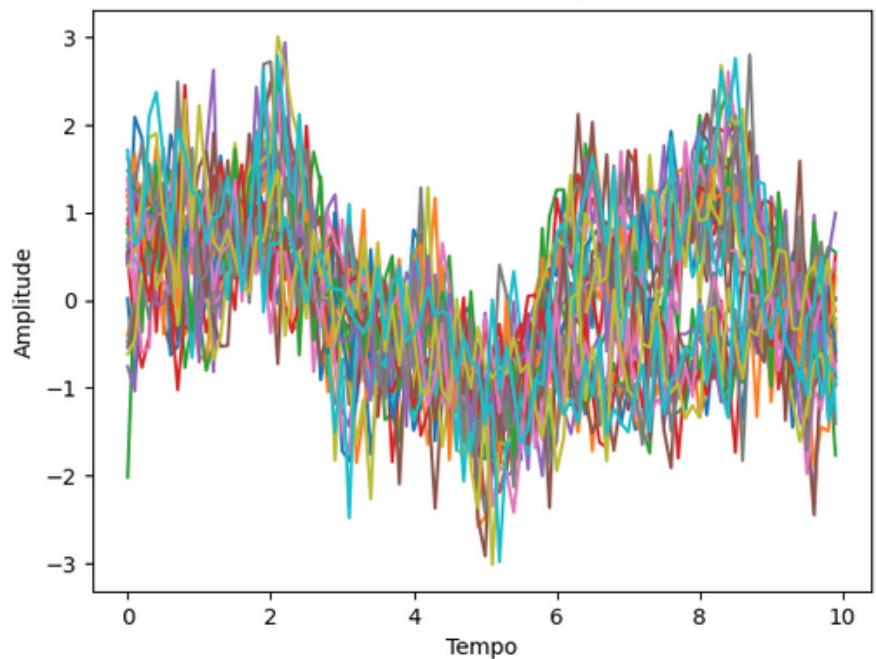
Sinais senoidais com ruído



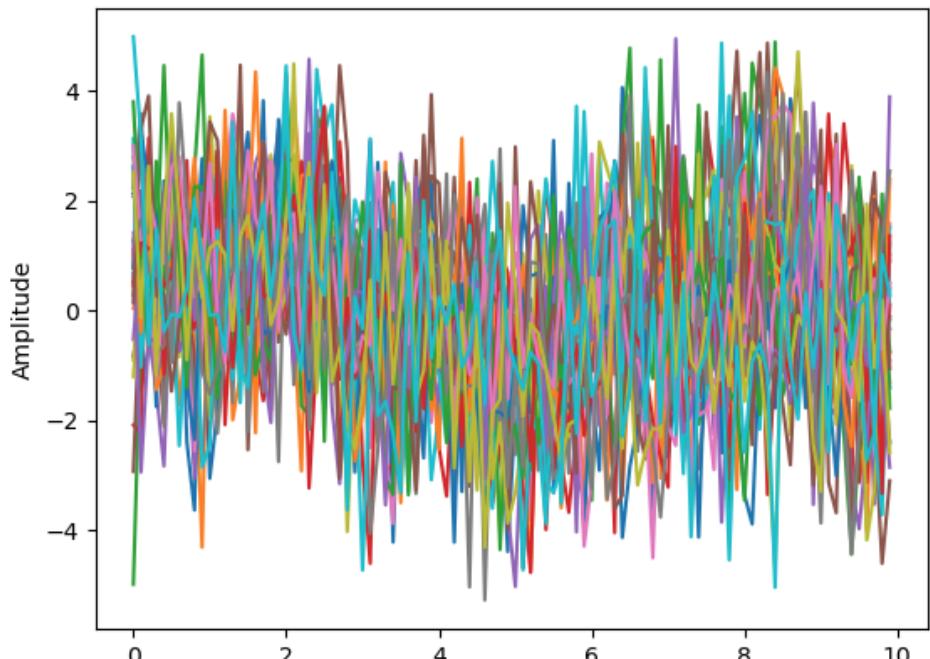
Sinais senoidais com ruído



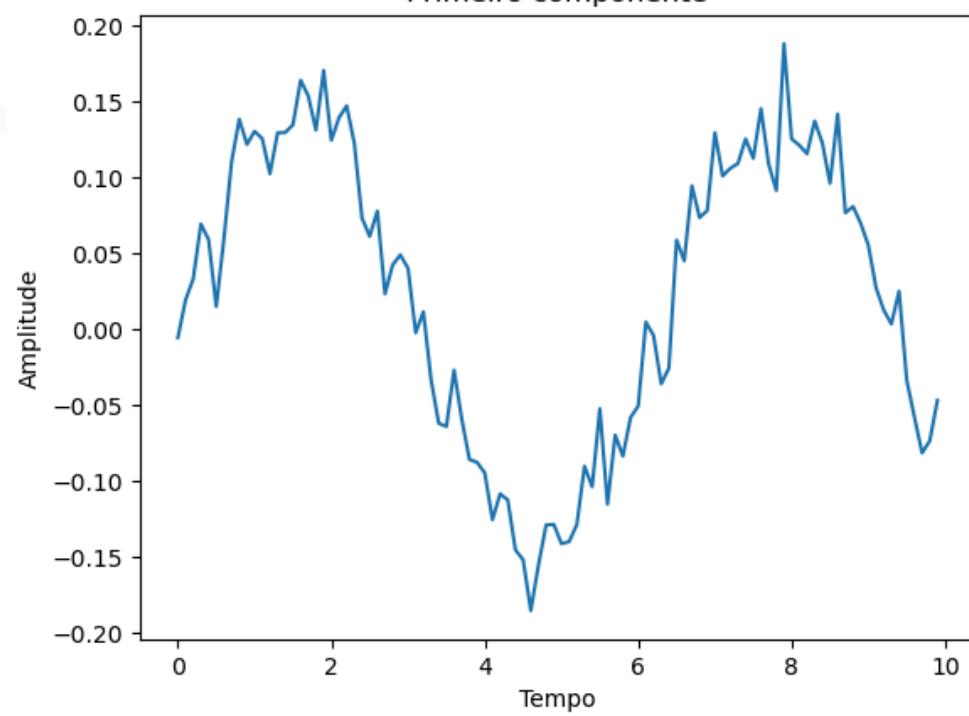
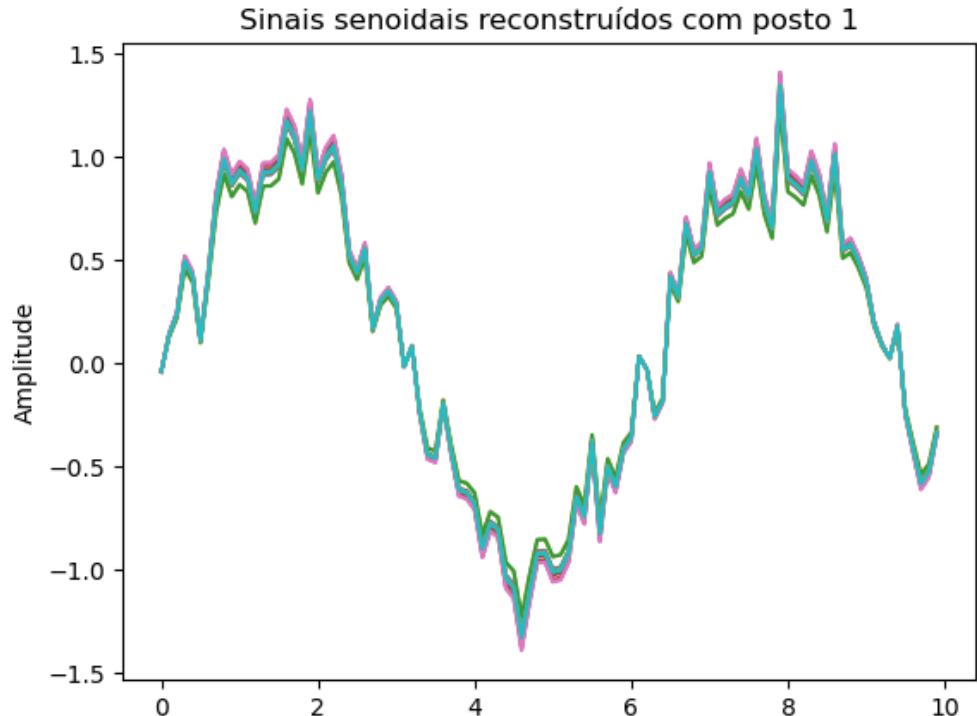
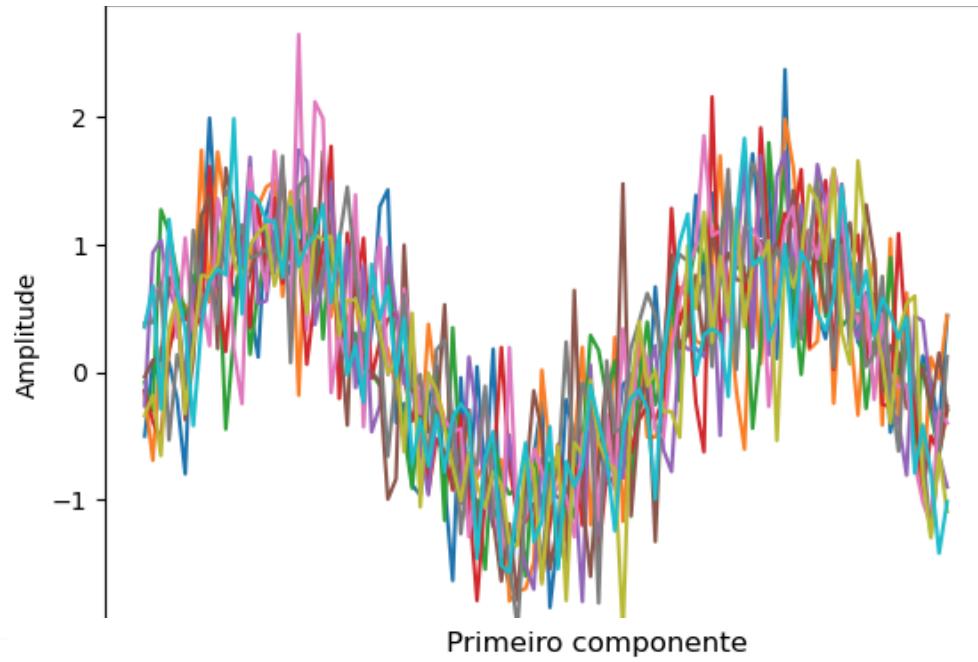
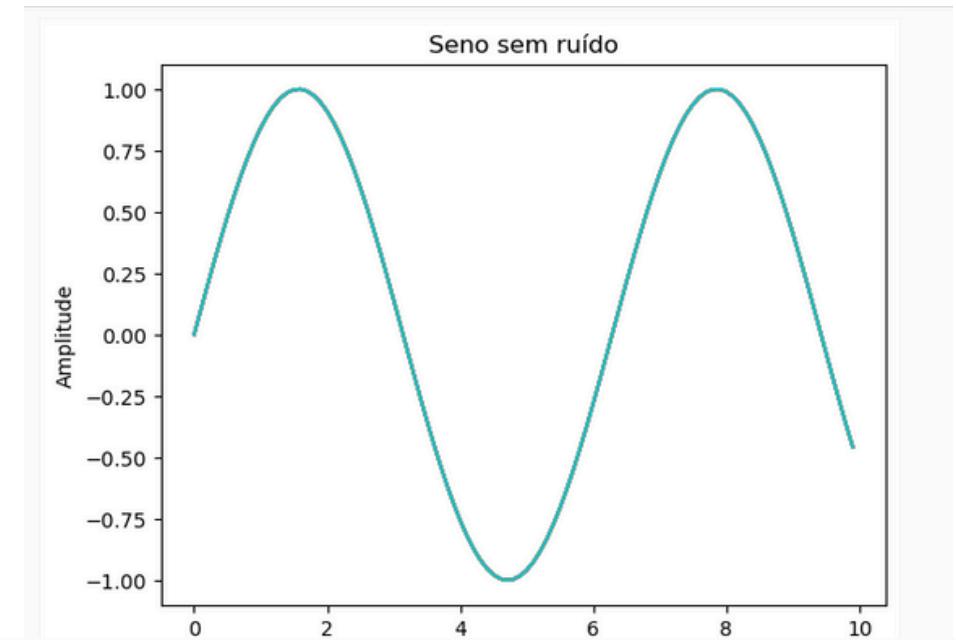
Sinais com ruído



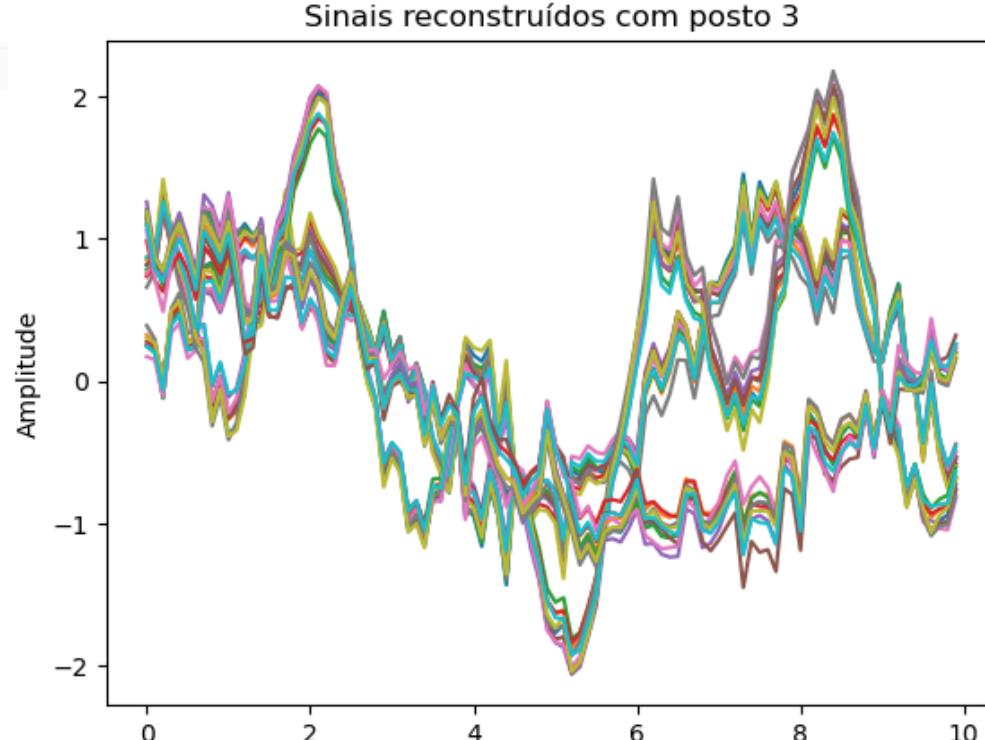
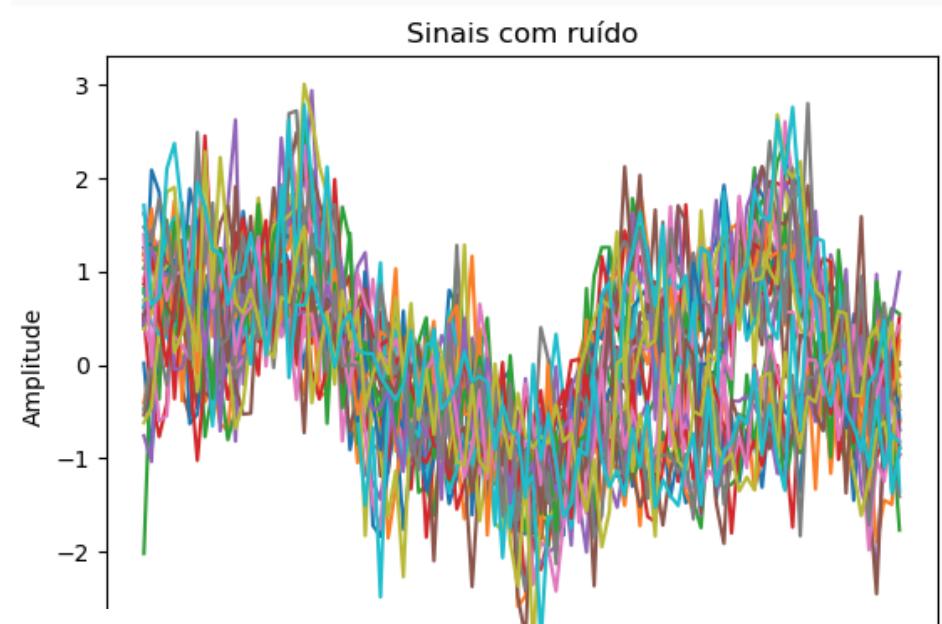
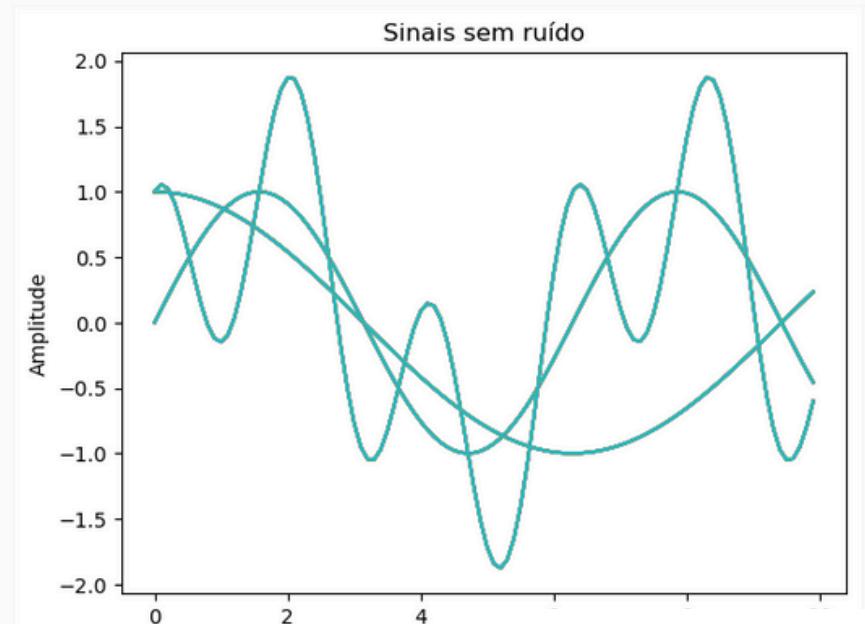
Sinais com ruído



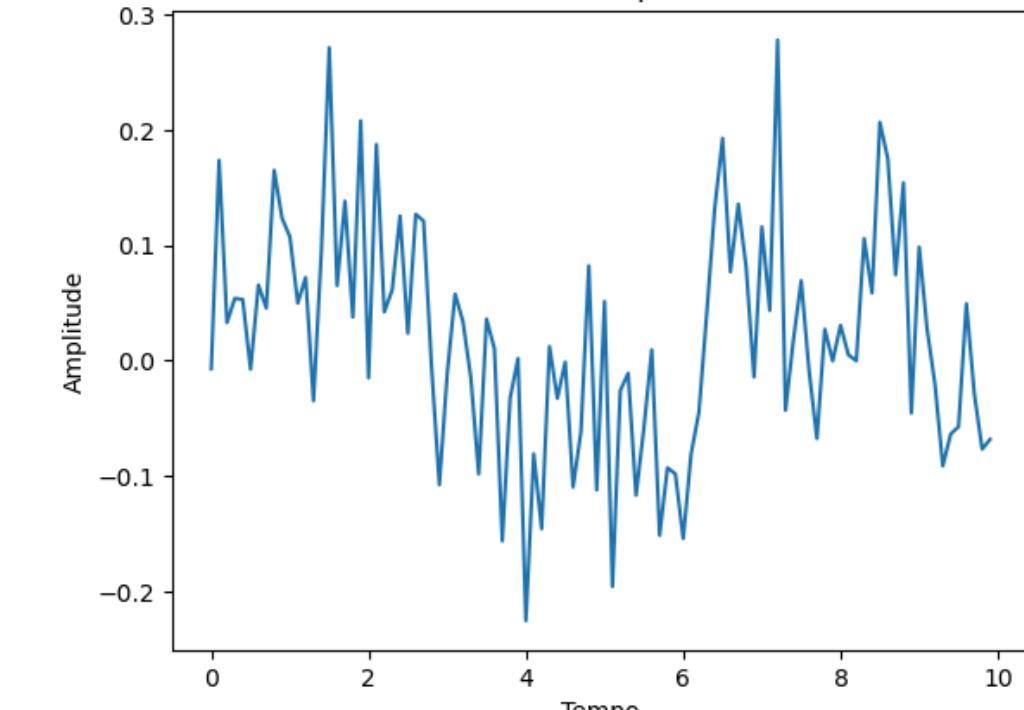
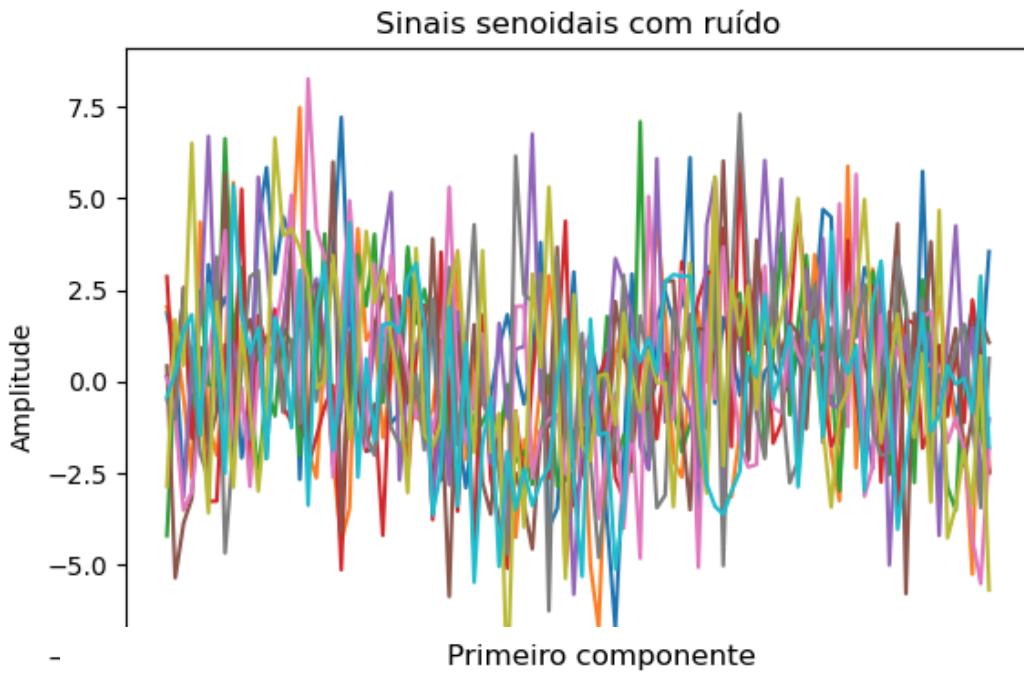
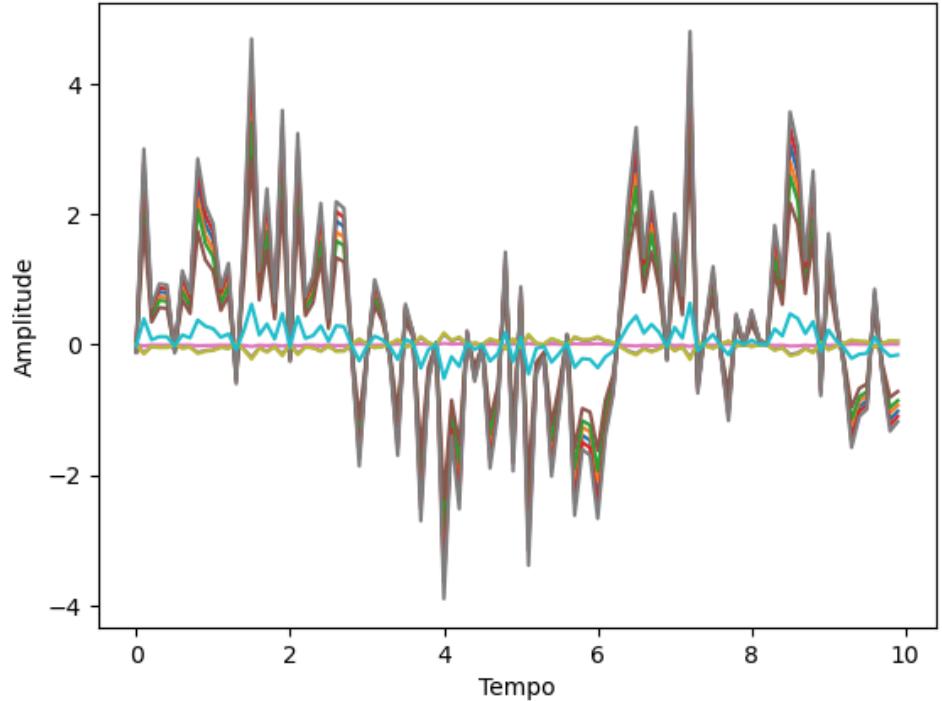
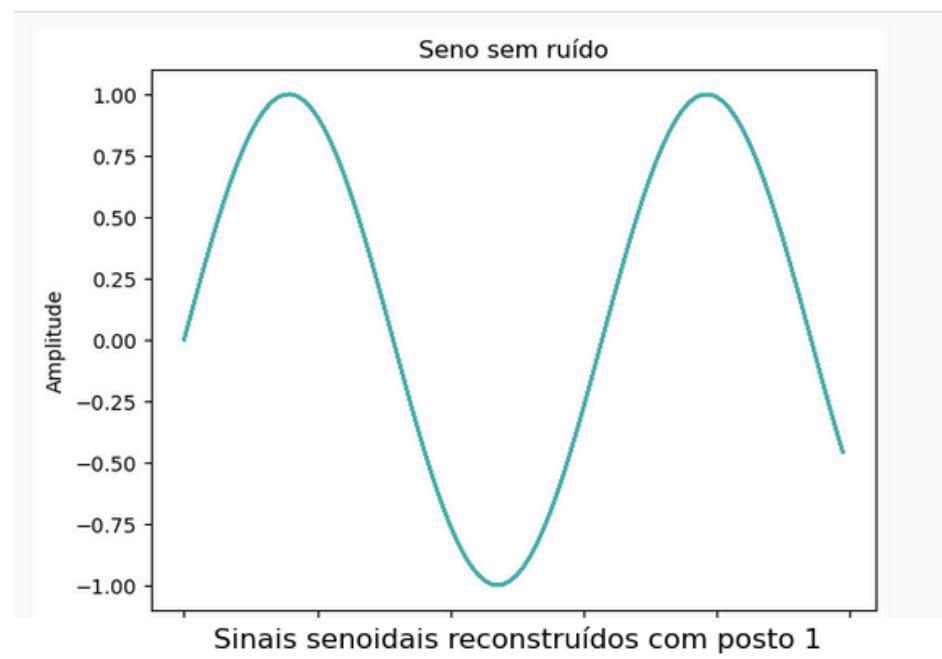
# NÍVEL DE RUÍDO BAIXO E VARIÂNCIA ALTA



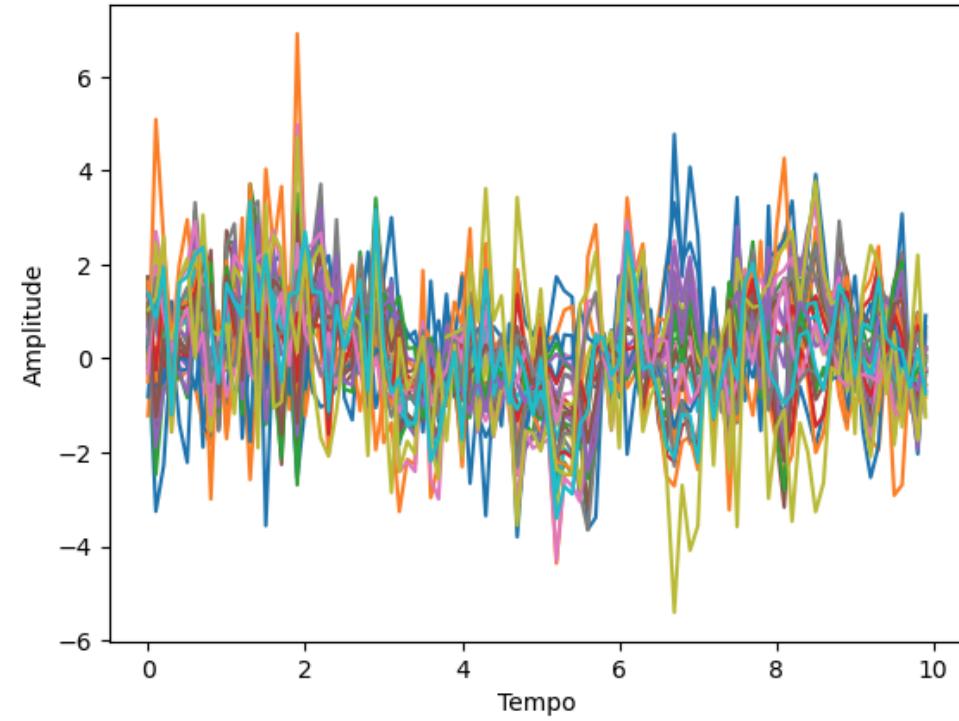
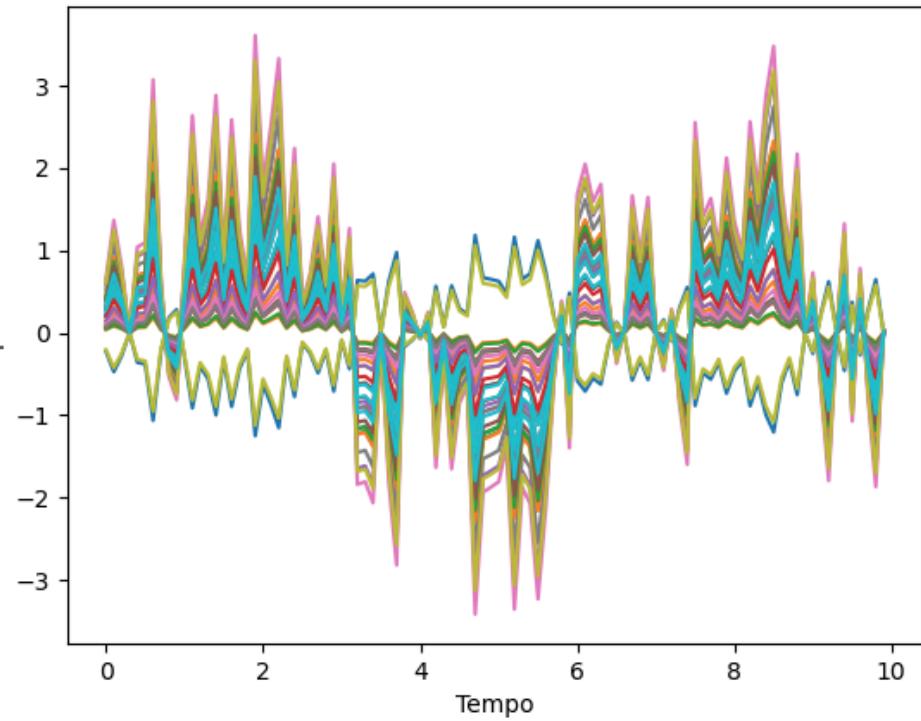
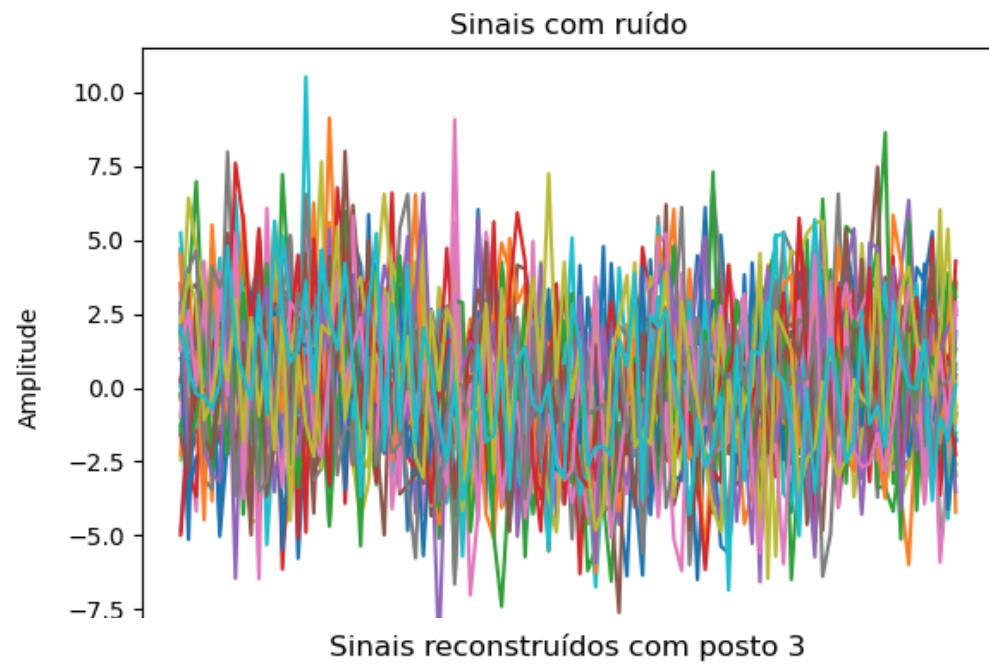
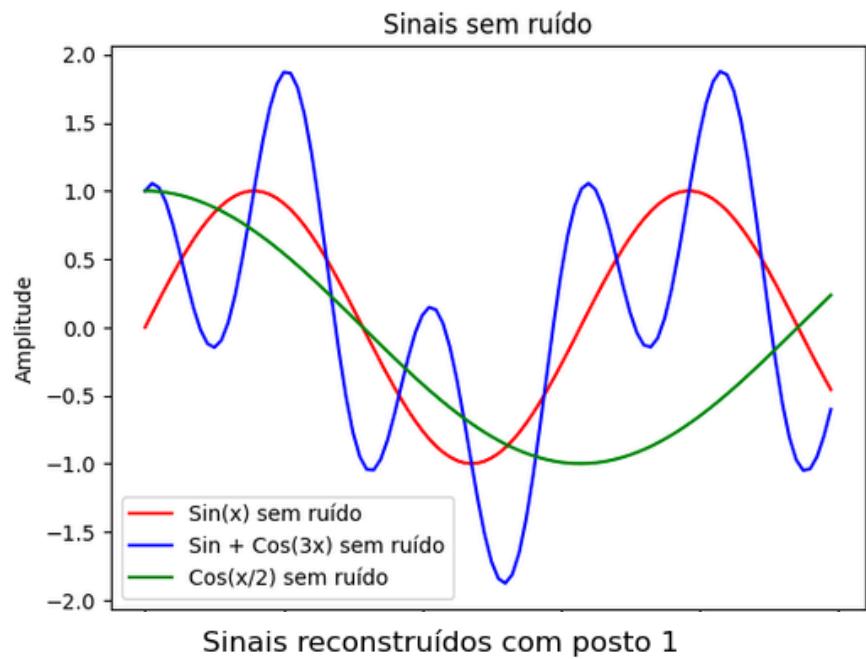
# NÍVEL DE RUÍDO BAIXO E VARIÂNCIA ALTA



# NÍVEL DE RUÍDO ALTO E VARIÂNCIA ALTA

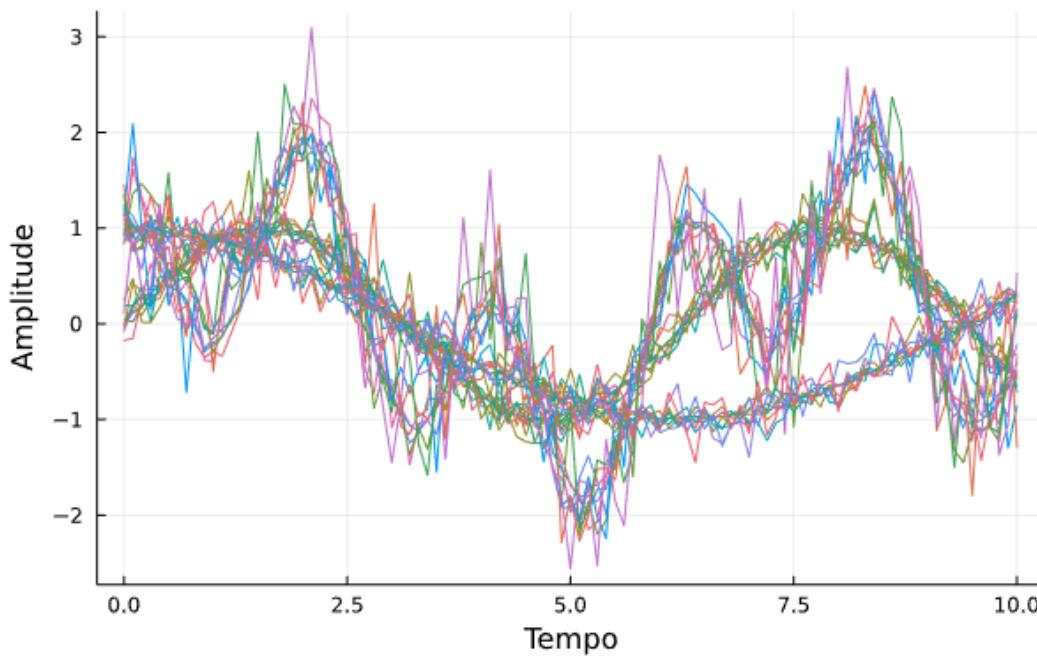


# NÍVEL DE RUÍDO BAIXO E VARIÂNCIA ALTA

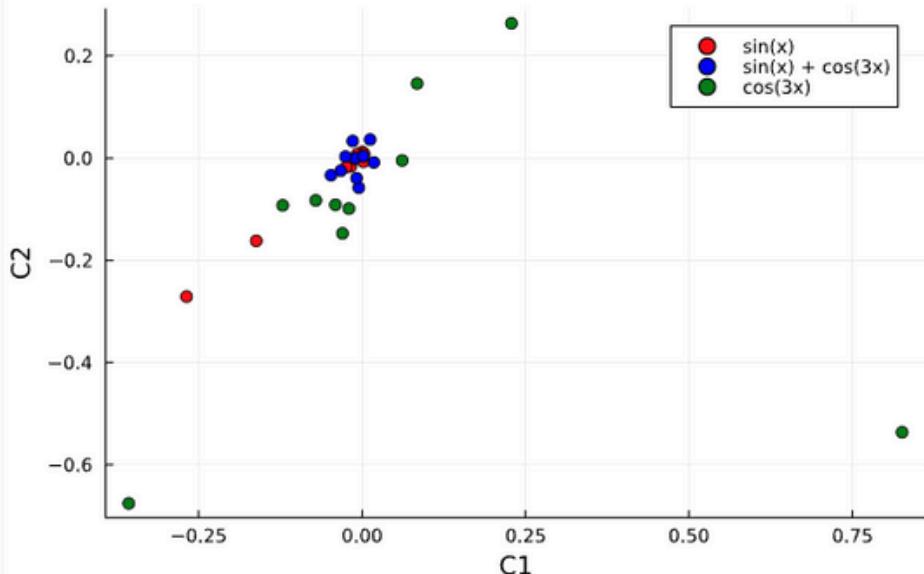


# REDUZINDO A DIMENSÃO

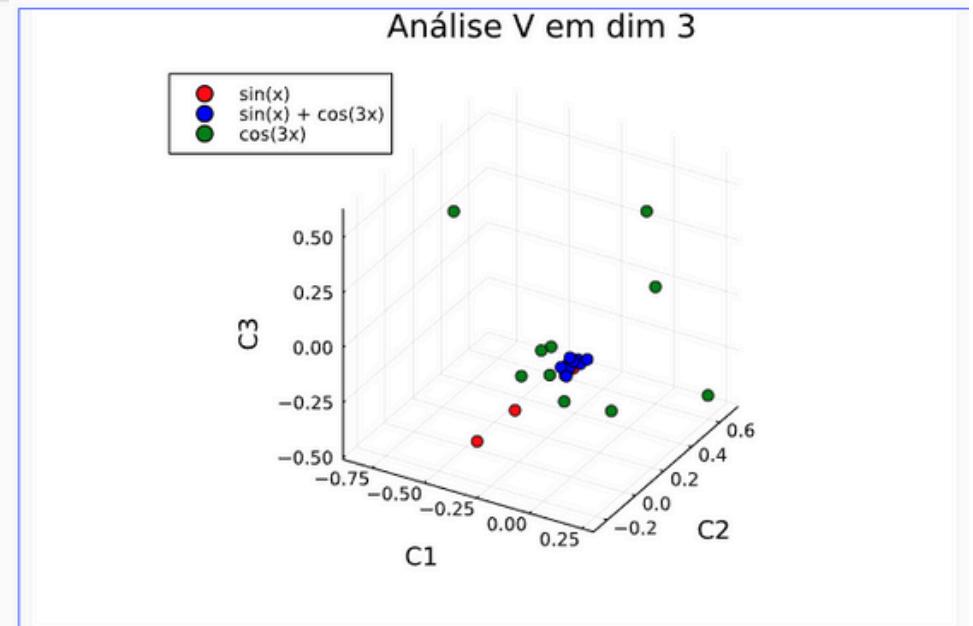
Sinais com ruído



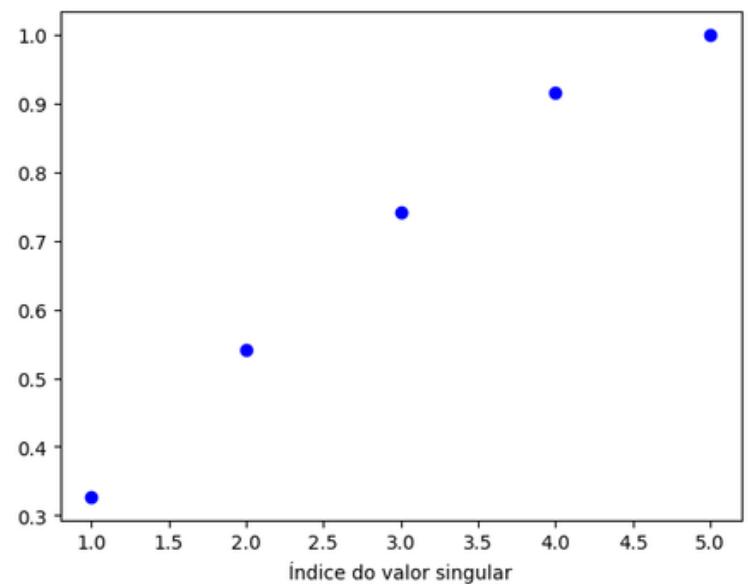
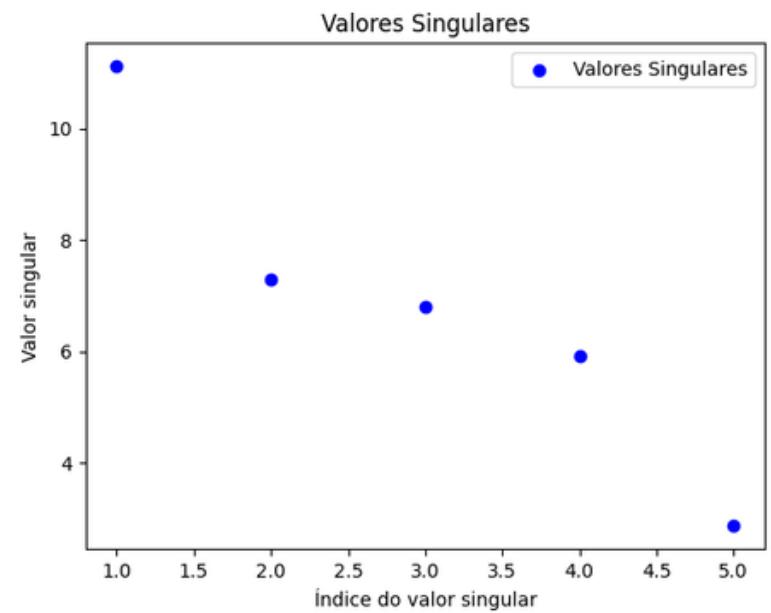
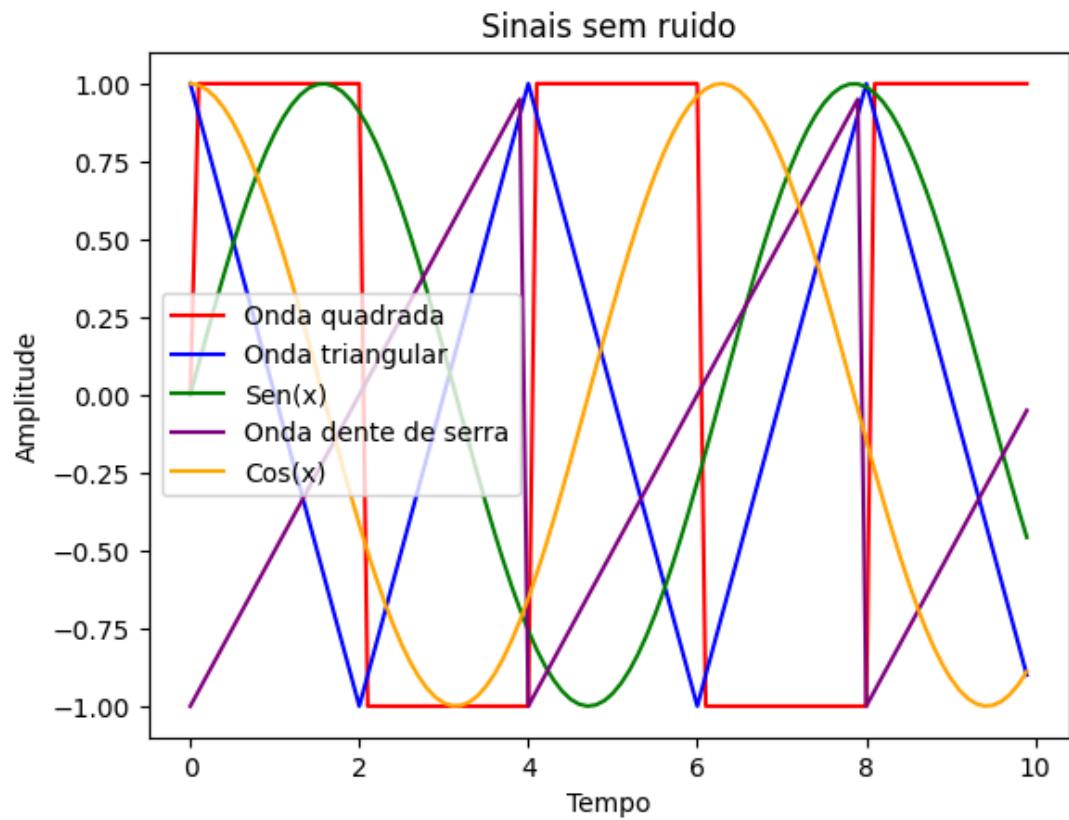
Análise V em dim 2



Análise V em dim 3

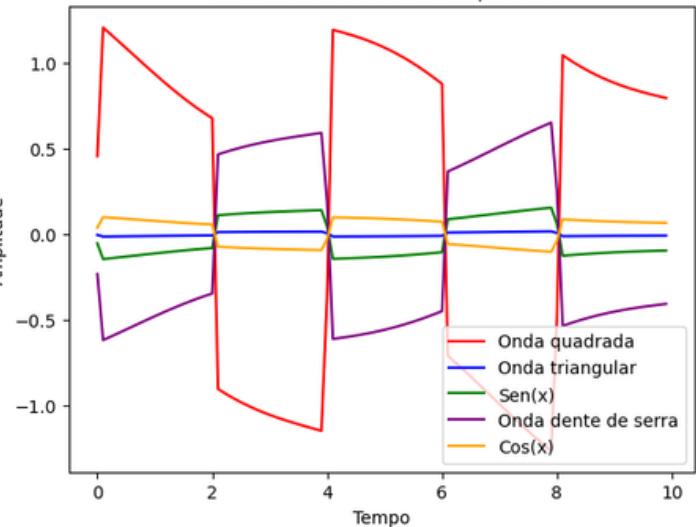


# VARIOS SINAIS SEM RUIDO

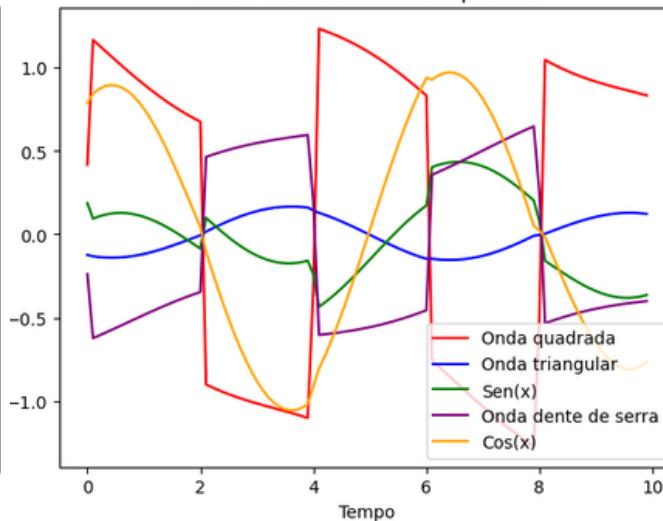


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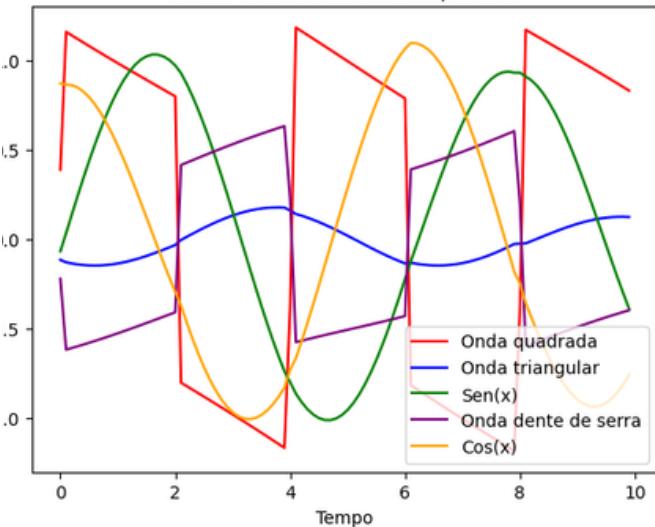
Sinais reconstruídos com posto 1



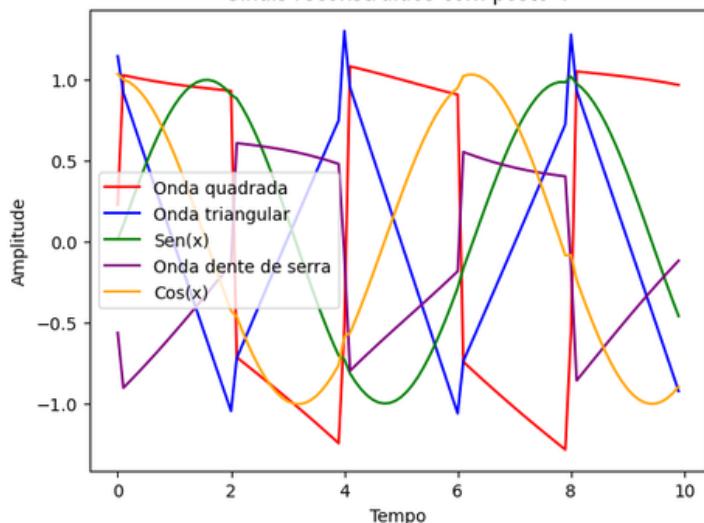
Sinais reconstruídos com posto 2



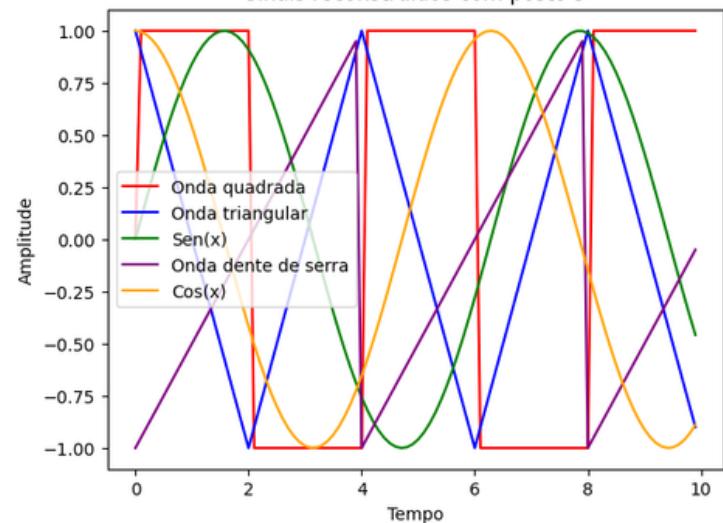
Sinais reconstruídos com posto 3



Sinais reconstruídos com posto 4



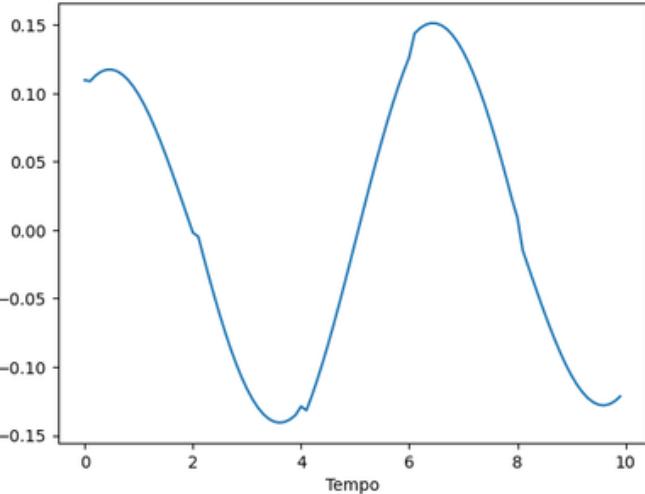
Sinais reconstruídos com posto 5



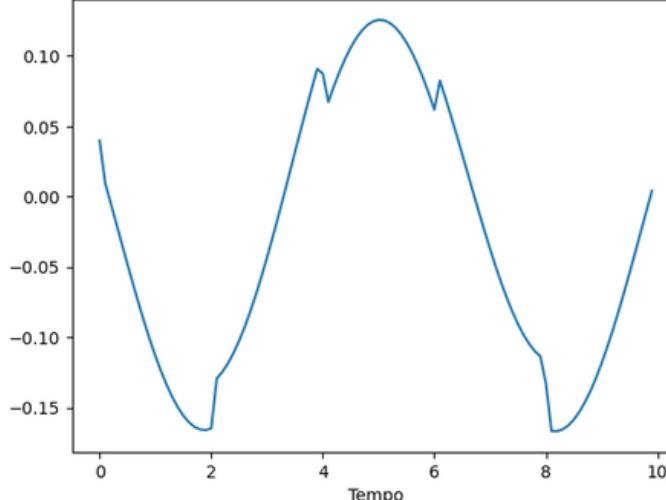
# VARIOS SINAIS SEM RUIDO

Primeiro componente de  $U$

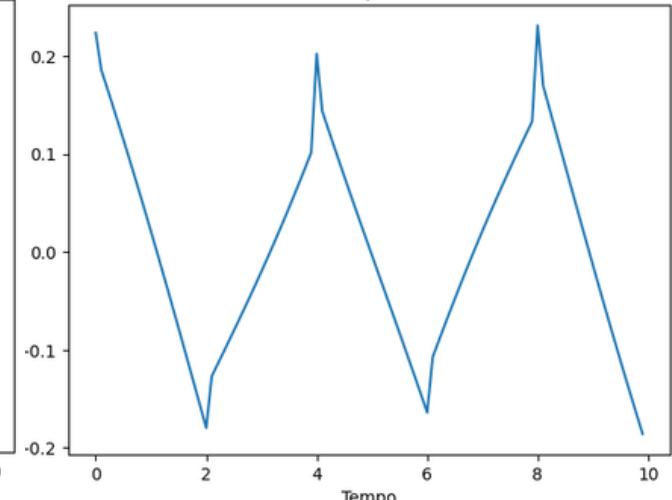
Amplitude



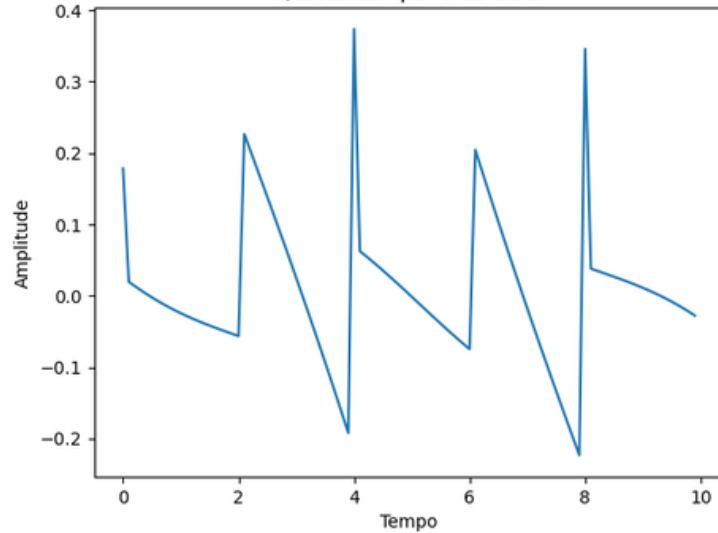
Segundo componente de  $U$



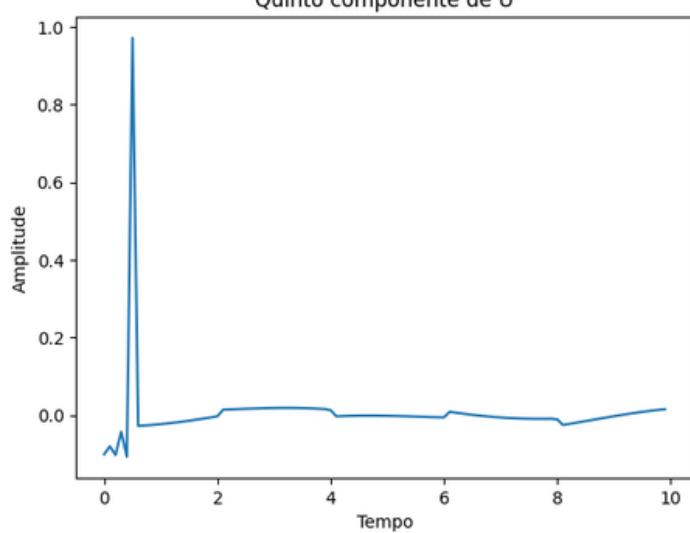
Terceiro componente de  $U$



Quarto componente de  $U$

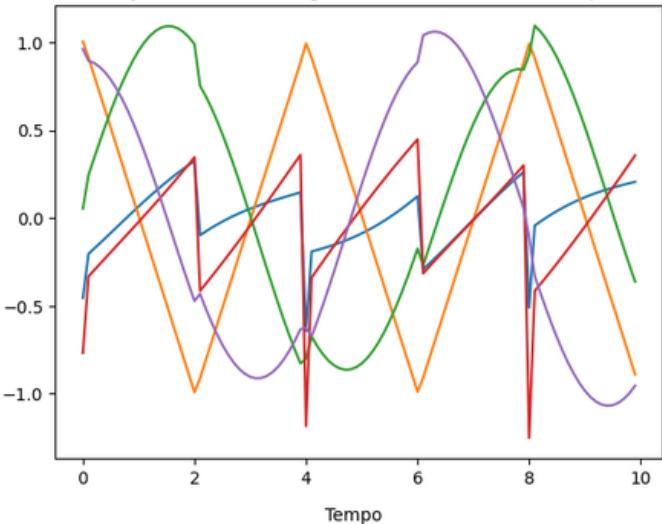


Quinto componente de  $U$

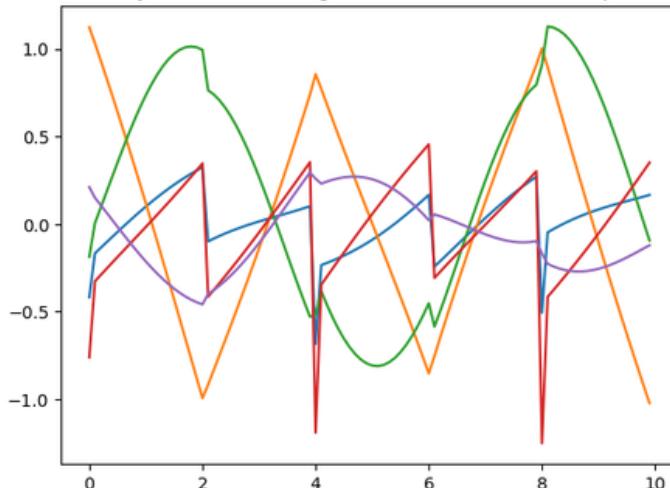


# VARIOS SINAIS SEM RUIDO

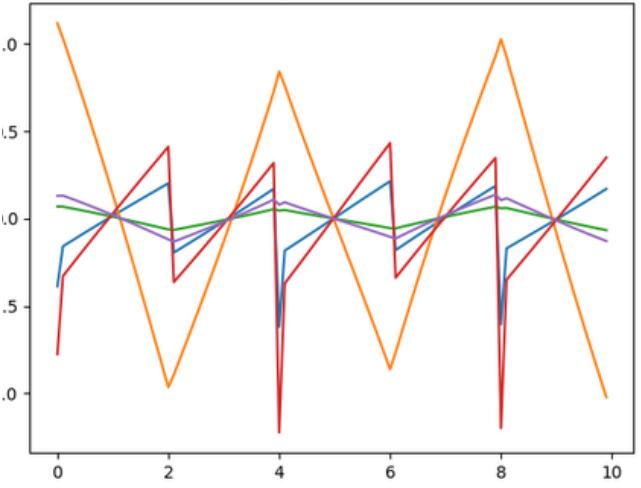
Diferença entre sinais originais e reconstruídos com posto 1



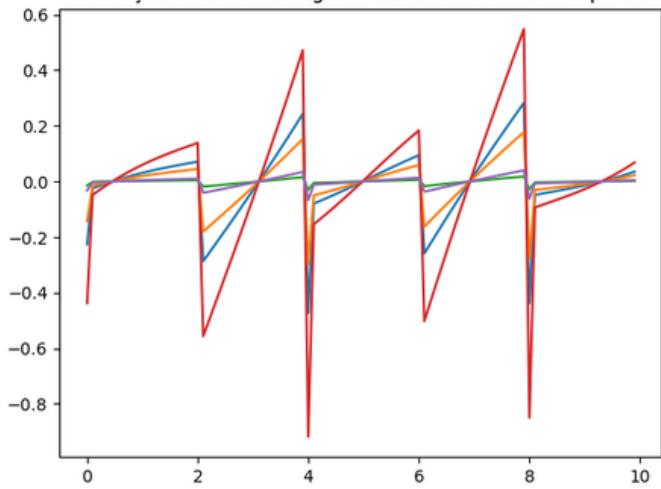
Diferença entre sinais originais e reconstruídos com posto 2



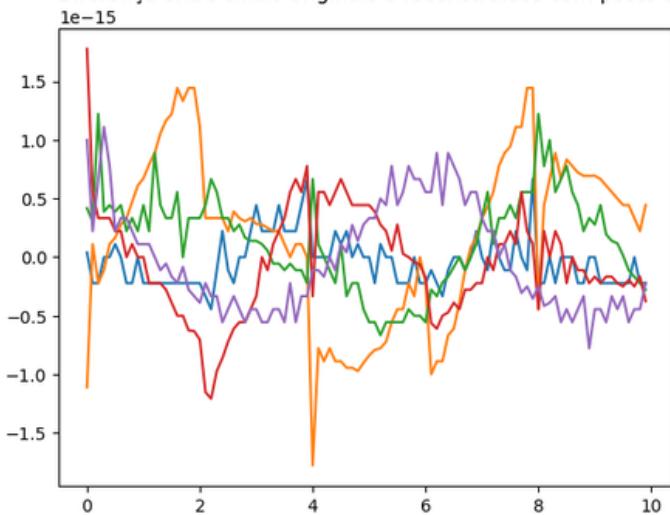
Diferença entre sinais originais e reconstruídos com posto 3



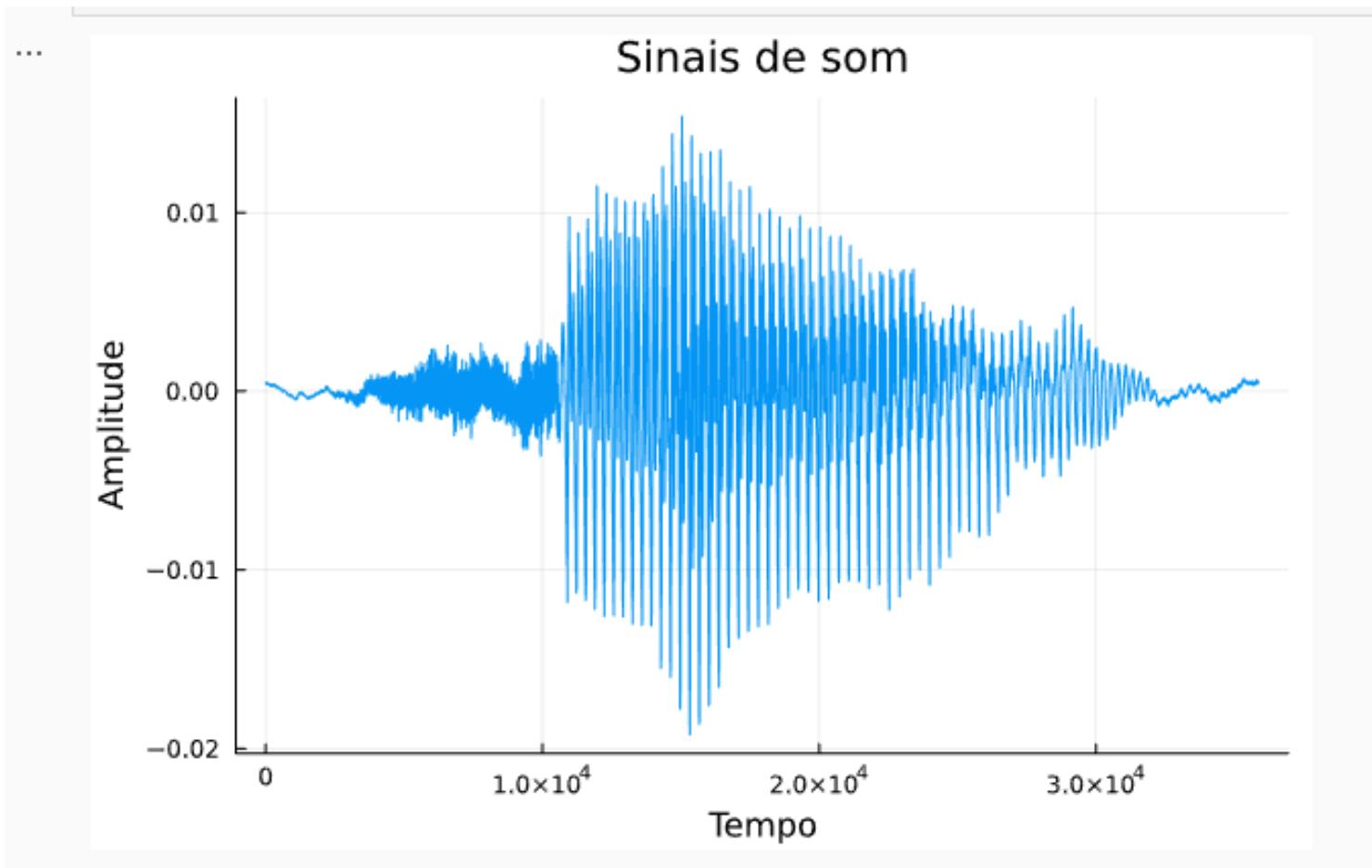
Diferença entre sinais originais e reconstruídos com posto 4



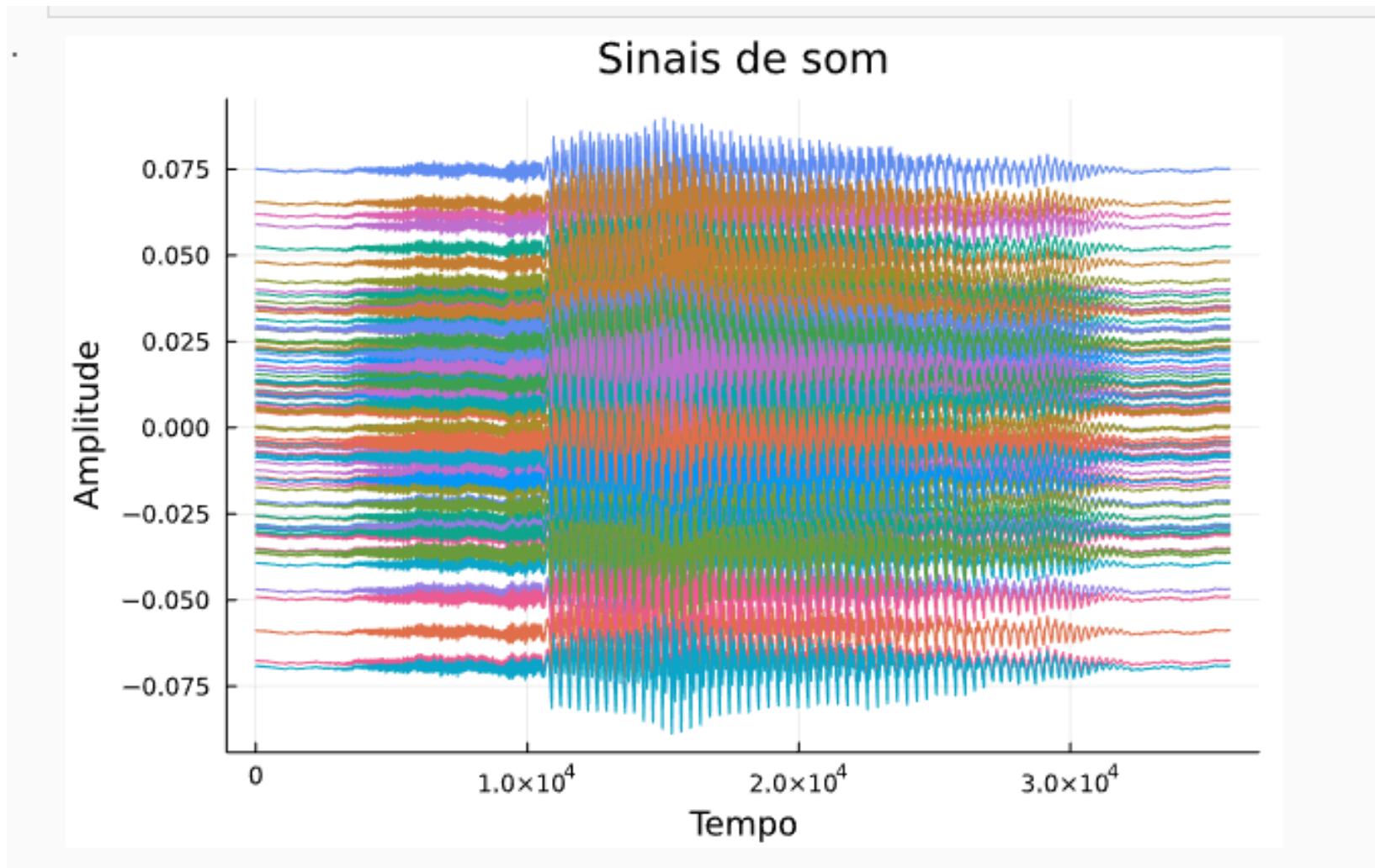
Diferença entre sinais originais e reconstruídos com posto 5



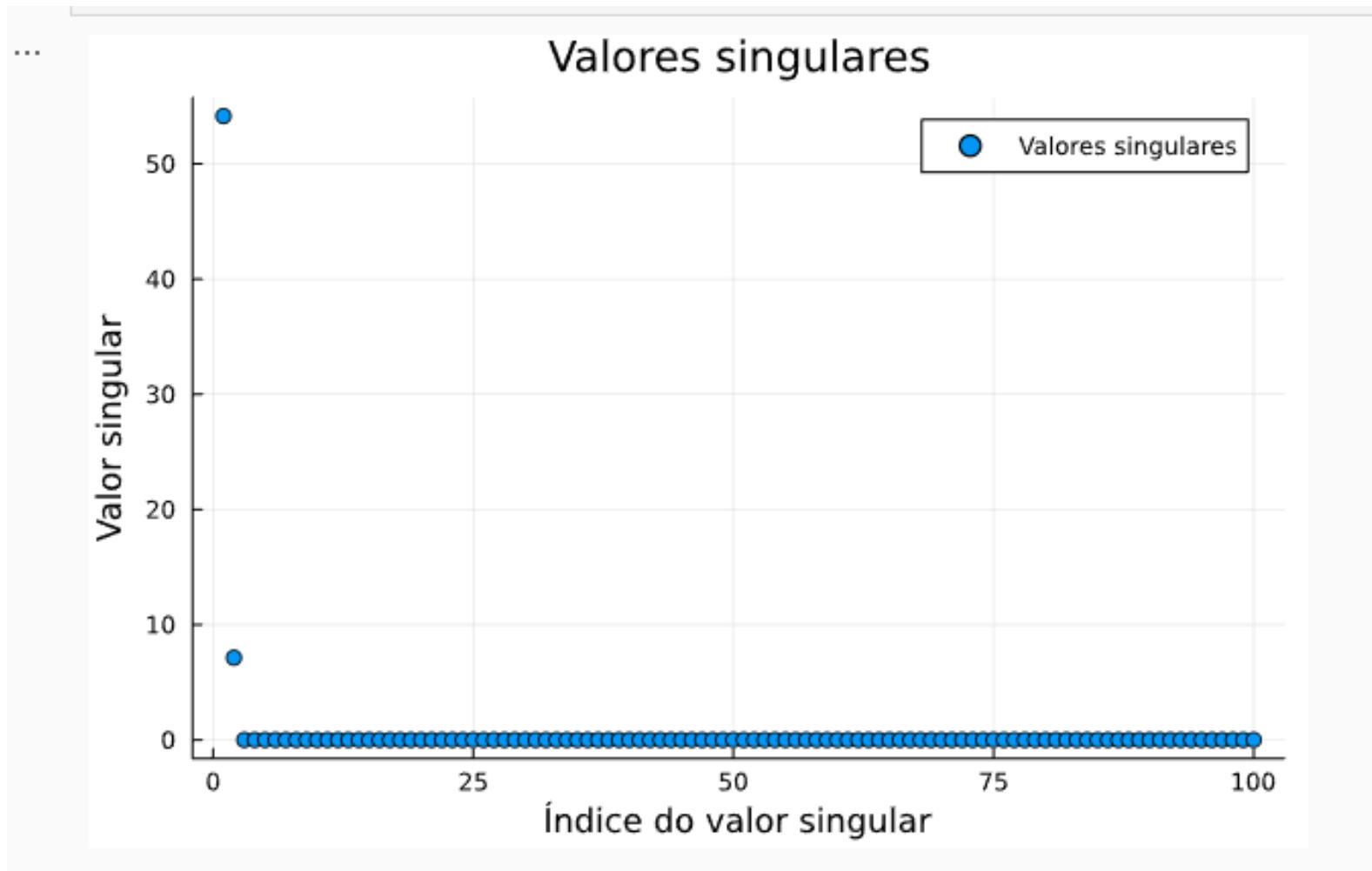
# SVD PARA REMOÇÃO DE RUÍDOS



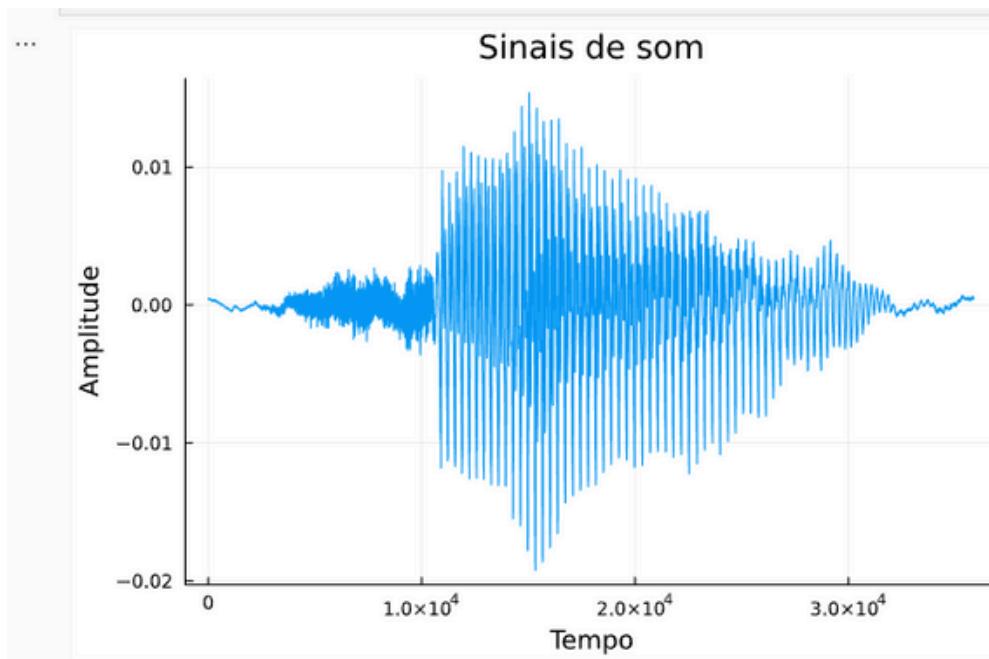
# SVD PARA REMOÇÃO DE RUÍDOS



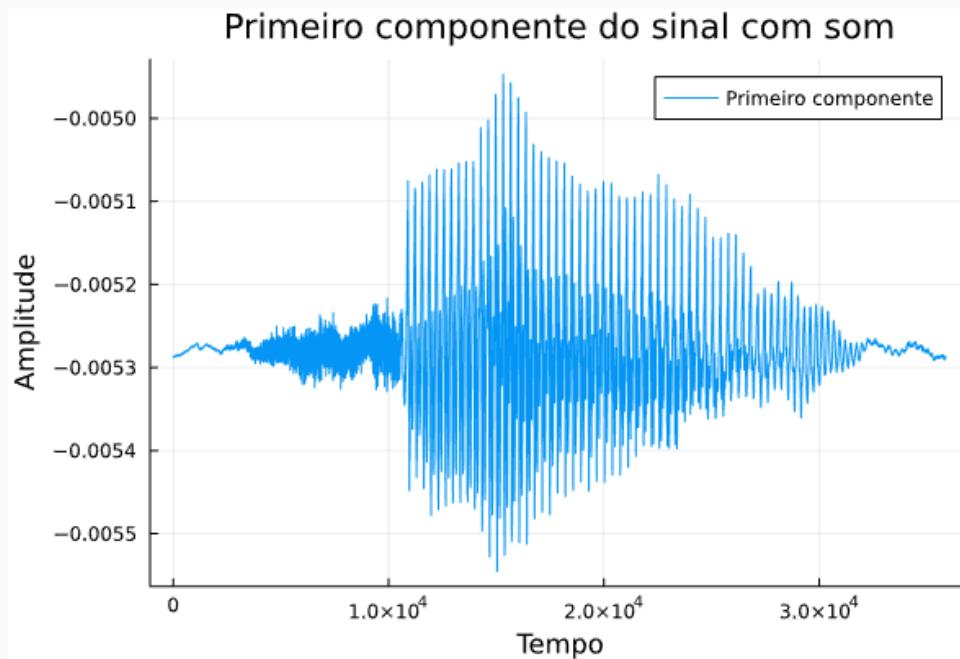
# SVD PARA REMOÇÃO DE RUÍDOS



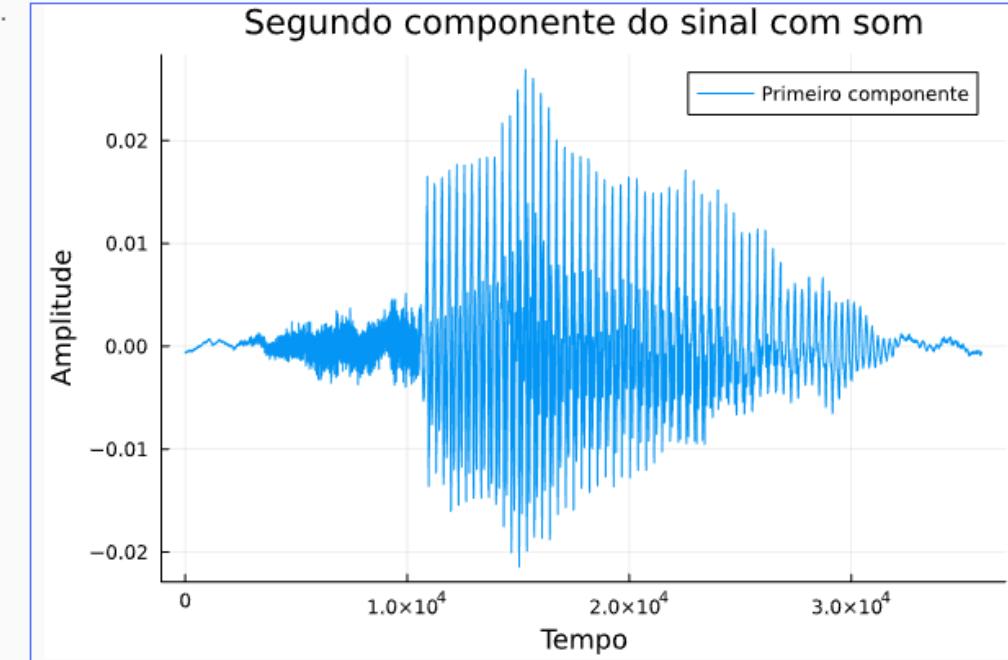
# SVD PARA REMOÇÃO DE RUÍDOS



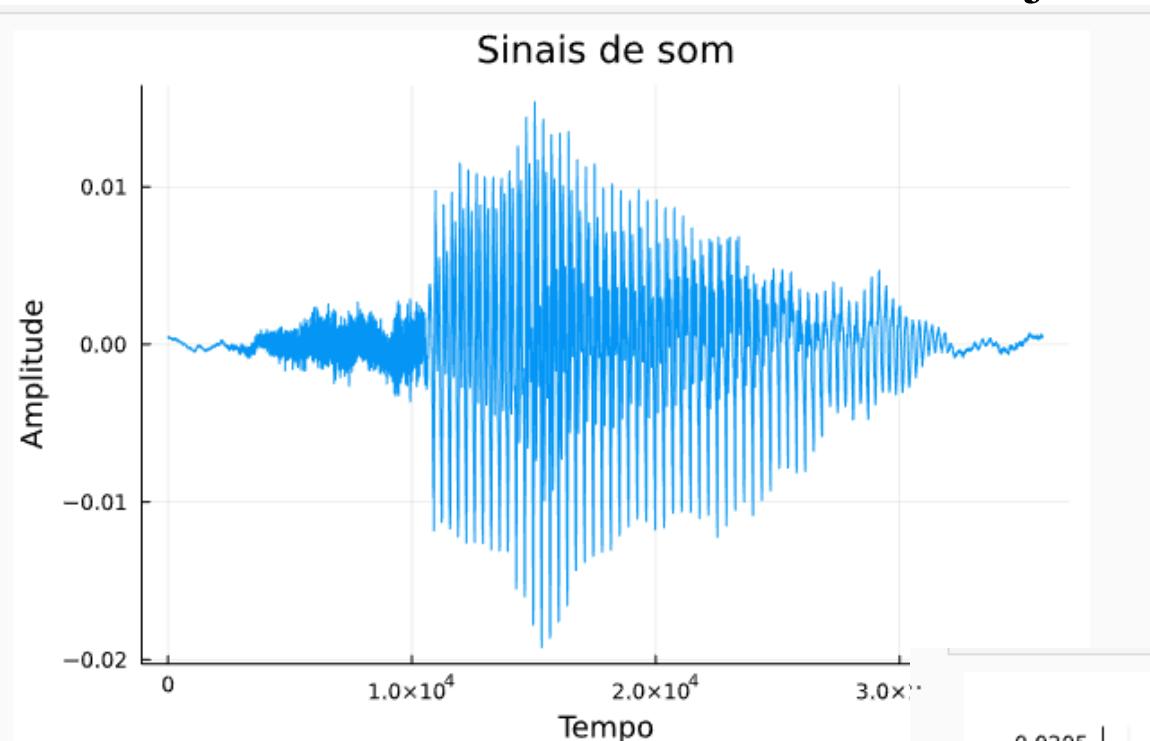
Primeiro componente do sinal com som



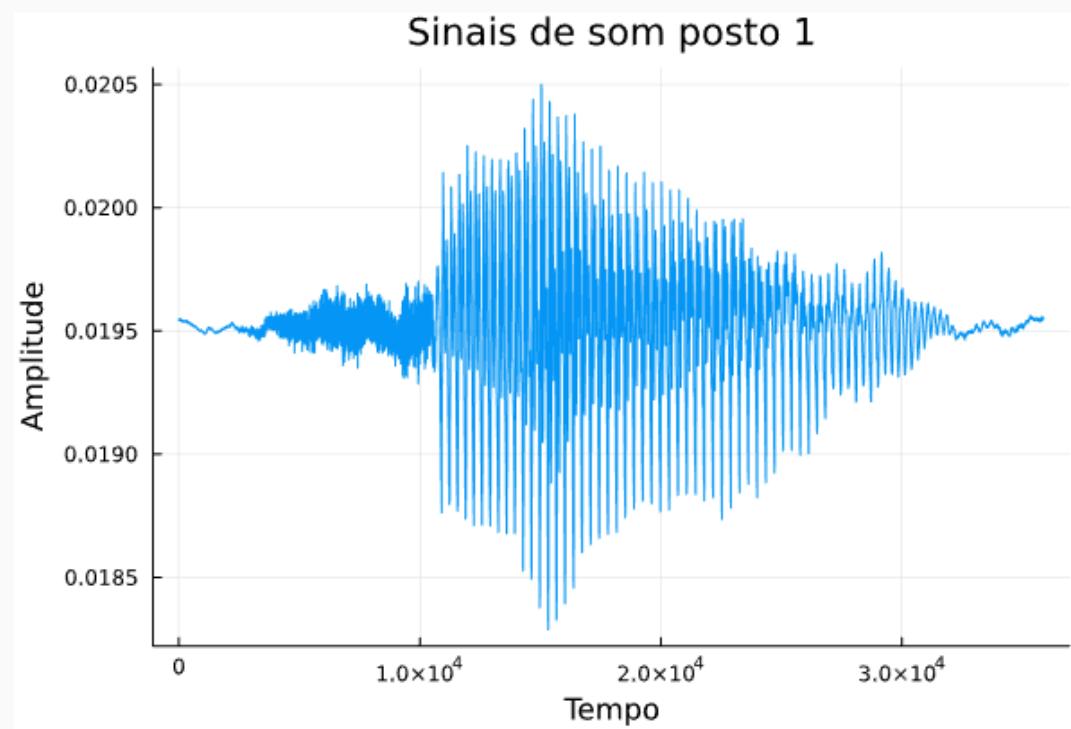
Segundo componente do sinal com som



# SVD PARA REMOÇÃO DE RUÍDOS

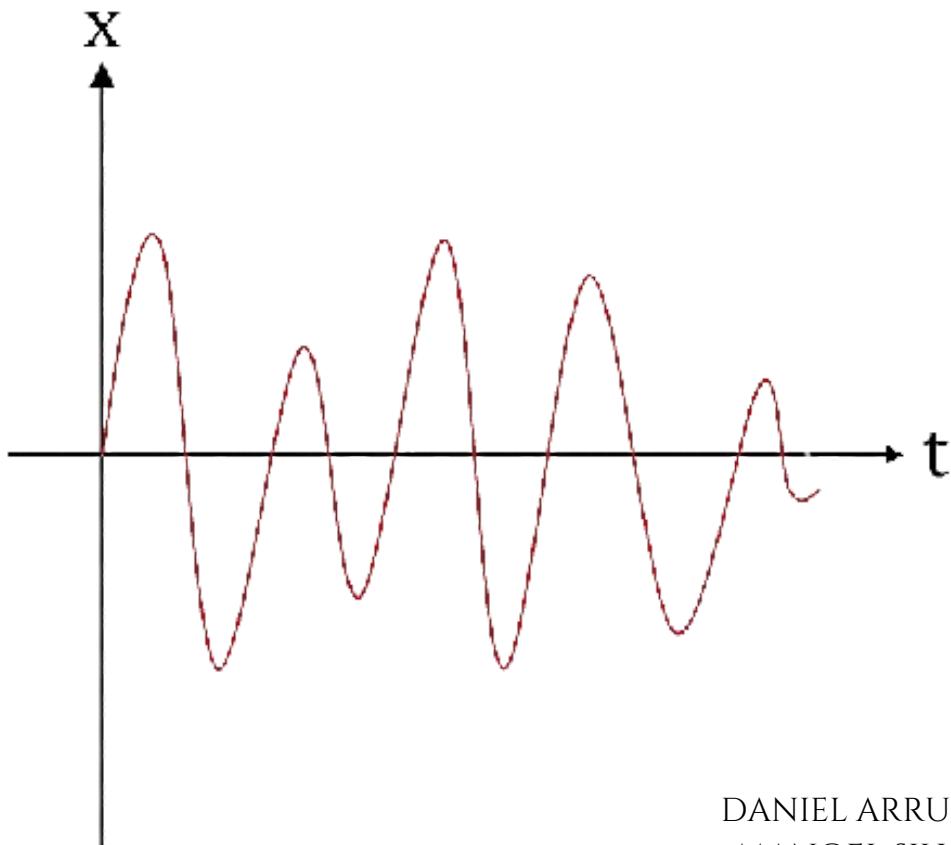


ERRO: 3.7



# OBRIGADO!

DECOMPOSIÇÃO EM VALORES SINGULARES  
APLICADA EM PROCESSAMENTO DE SINAIS



VEJA O NOSSO CÓDIGO!

DANIEL ARRUDA  
MANOEL SILVA  
PEDRO JORGE