

# PREDICCIÓN DEL FACTOR DE COMPRESIBILIDAD DE UN GAS NATURAL PARA ISOTÉRMAS USANDO MÉTODOS INTELIGENTES

Desarrollo de un proyecto para predecir el factor de compresibilidad del gas natural con las siguientes composiciones (metano,etano,propano,i-butano,n-butano, i-pentano,n-pentano,n-hexano,nitrogeno y dióxido de carbono) para diversas datas bibliográficas de isotérmicas utilizando Redes Neuronales Artificiales Difusas (ANFIS) y Redes Neuronales Artificiales (ANN) en Python, comparando los resultados con las ecuaciones de estado de Peng-Robinson y Soave-Redlich-Kwong.

Referencias:

- [Prediction of gas compressibility factor using intelligent models](#), Mohamadi(2015)
- [A New Correlation Based on Artificial Neural Networks for Predicting the Natural Gas Compressibility Factor](#), Baniyadi(2012)
- [Predicting the Compressibility Factor of Natural Gas by Using Statistical Modeling and Neural Network](#), Ghanem(2022)

Data de Referencia:

- [Compressibility Isotherms of Simulated Natural Gases](#), Biswas(1990)
- [Isochoric \(P, \$\rho\$ ,T\) measurements for five natural gas mixtures from T \(225 to 350\)K at pressures to 35 MPa](#), Magee(1997)
- [Isothermal pVT measurements on gas hydrocarbon mixtures using a vibrating-tube apparatus](#), Capla(2002)

```
In [81]: #Importando módulos
import sys
import io

#Gradicas y propiedades
import thermo as th
import chemicals as ch
import numpy as np
import pandas as pd
import matplotlib.pyplot as plt
import seaborn as sns
from scipy.stats import linregress

#Predicción
import tensorflow as tf
from sklearn.preprocessing import StandardScaler
```

```
In [82]: #PROPIEDADES
#Tomar datos de constantes y propiedades criticas
N_C=["methane","ethane","propane","i-butane","n-butane","i-pentane","n-pentane",
#Se buscan componentes en base de datos
```

```

v_n=list(range(0,len(N_C)))
v_c=[ch.search_chemical(N_C[k]).InChI_key for k in v_n]
constants,propiedades=th.ChemicalConstantsPackage.from_IDS(v_c)
#Se añaden datos de componentes no disponibles con InChI_key y se utiliza CAS.
N2_CO2_CAS=[ch.CAS_from_any('Nitrogen'),ch.CAS_from_any('Carbon dioxide')]
N2_CO2_Tcs=[ch.Tc(N2_CO2_CAS[0]),ch.Tc(N2_CO2_CAS[1])]
N2_CO2_Pcs=[ch.Pc(N2_CO2_CAS[0]),ch.Pc(N2_CO2_CAS[1])]
N2_CO2_ws=[ch.omega(N2_CO2_CAS[0]),ch.omega(N2_CO2_CAS[1])]
#Se buscan los parametros de interaccion binarias
#Se añaden datos de N2 y CO2, uniendo listas
#Union de lista de CAS
m_kij=th.interaction_parameters.IPDB.get_ip_asymmetric_matrix('ChemSep PR',
                                                                constants.CASs+N2_

#Union interna de propiedades criticas
DATA={'Pcs':constants.Pcs+N2_CO2_Pcs,
      'Tcs':constants.Tcs+N2_CO2_Tcs,
      'omegas':constants.omegas+N2_CO2_ws}

print(DATA)

```

```

{'Pcs': [4599200.0, 4872200.0, 4251200.0, 3629000.0, 3796000.0, 3378000.0, 336750
0.0, 3044100.0, 3395800.0, 7377300.0], 'Tcs': [190.564, 305.322, 369.89, 407.81,
425.125, 460.35, 469.7, 507.82, 126.192, 304.1282], 'omegas': [0.01142, 0.0995,
0.1521, 0.184, 0.201, 0.2274, 0.251, 0.3, 0.0372, 0.22394]}

```

```

In [83]: #IMPORTACIÓN DE BASE DE DATOS (se puede cambiar de acuerdo a la data)
# Leer base de datos
basedatos = pd.read_excel(r'C:\Users\cesar\Desktop\Proyecto-Gas Natural\data_iso
# Lista para almacenar resultados
results = []
# Número de filas
lon = len(basedatos.index)
# Visualizar la base de datos
basedatos.head()

```

```

Out[83]:

```

	T (K)	P(Pa)	CH4	C2H6	C3H8	i- C4H10	n- C4H10	i- C5H12	n- C5H12	n C6H14
0	225.0	3193190.0	0.81299	0.03294	0.00637	0.00101	0.001	0.0	0.0	0.0
1	225.0	4512100.0	0.81299	0.03294	0.00637	0.00101	0.001	0.0	0.0	0.0
2	225.0	14818200.0	0.81299	0.03294	0.00637	0.00101	0.001	0.0	0.0	0.0
3	225.0	19712390.0	0.81299	0.03294	0.00637	0.00101	0.001	0.0	0.0	0.0
4	250.0	1996080.0	0.81299	0.03294	0.00637	0.00101	0.001	0.0	0.0	0.0

```

In [84]: basedatos.info()

```

```
<class 'pandas.core.frame.DataFrame'>
RangeIndex: 426 entries, 0 to 425
Data columns (total 14 columns):
#   Column                Non-Null Count  Dtype
---  -
0   T (K)                  426 non-null    float64
1   P(Pa)                  426 non-null    float64
2   CH4                    426 non-null    float64
3   C2H6                   426 non-null    float64
4   C3H8                   426 non-null    float64
5   i-C4H10                426 non-null    float64
6   n-C4H10                426 non-null    float64
7   i-C5H12                426 non-null    float64
8   n-C5H12                426 non-null    float64
9   n-C6H14                426 non-null    float64
10  N2                     426 non-null    float64
11  CO2                    426 non-null    float64
12  ρ exp (mol/dm3)        426 non-null    float64
13  Z exp                  426 non-null    float64
dtypes: float64(14)
memory usage: 46.7 KB
```

```
In [85]: basedatos.describe()
```

```
Out[85]:
```

	T (K)	P(Pa)	CH4	C2H6	C3H8	i-C4H10	n-C
<b>count</b>	426.000000	4.260000e+02	426.000000	426.000000	426.000000	426.000000	426.00
<b>mean</b>	289.187775	1.107037e+07	0.867847	0.051115	0.014873	0.001657	0.00
<b>std</b>	32.663720	8.462415e+06	0.056640	0.028207	0.016227	0.001747	0.00
<b>min</b>	225.000000	1.208300e+05	0.800780	0.018150	0.004050	0.000000	0.00
<b>25%</b>	263.152000	4.222648e+06	0.812990	0.032940	0.006370	0.000990	0.00
<b>50%</b>	280.000000	8.986855e+06	0.858980	0.043060	0.008940	0.001010	0.00
<b>75%</b>	323.148000	1.596908e+07	0.906440	0.061150	0.015130	0.001480	0.00
<b>max</b>	349.981000	3.464920e+07	0.965800	0.116420	0.065300	0.007550	0.00

## Ecuaciones de Peng-Robinson(PR) y Soaver-Redlich-Kwong(SRK)

Se utiliza los módulos [thermo](#) y [chemicals](#) para el calculo de las propiedades termodinámicas para gases reales con respectos a las Ecuaciones de Estado de Peng-Robinson(PR) y Soaver-Redlich-Kwong(SRK), asi como el cálculo de las propiedades pseudoreducidas( $P_{pr}$ ,  $T_{pr}$ ) y un coeficiente  $X$  que relaciona a estas dos, estos valores del gas natural estudiado permitirá tener valores en rangos pequeños para poder utilizar nuestro modelo de Predicción.

```
In [86]: #CALCULOS
for i in range(0, lon):
    # Datos del data frame
```

```

R=8.3145
T = basedatos.iloc[i, 0]
P = basedatos.iloc[i, 1]
X = basedatos.iloc[i, 2:12].tolist() # Obtener las composiciones desde la c
rho_exp = basedatos.iloc[i, 12]
Z_exp= basedatos.iloc[i, 13]
#CALCULOS DE VALORES PSEUDOREDUCIDOS
# Calculando Las presiones y temperaturas pseudocríticas
Ppc = sum([X[j] * DATA['Pcs'][j] for j in range(len(X))])
Tpc = sum([X[j] * DATA['Tcs'][j] for j in range(len(X))])

# Calculando Las presiones y temperaturas pseudoreducidas
Ppr = P / Ppc
Tpr = T / Tpc
equis= Ppr/Tpr

#CALCULOS DE DENSIDADES POR EC.DE ESTADOS
# Definición de ecuaciones de estado
EOS_PRmix = th.PRMIX(Tcs=DATA['Tcs'], Pcs=DATA['Pcs'], omegas=DATA['omegas'],
                    zs=X, kijs=m_kij, T=T, P=P)
EOS_SRKmix = th.SRK MIX(Tcs=DATA['Tcs'], Pcs=DATA['Pcs'], omegas=DATA['omegas'],
                    zs=X, kijs=m_kij, T=T, P=P)

try:
    # Verifica si existen métodos para obtener el volumen molar
    if hasattr(EOS_PRmix, 'Z_g'):
        Z_PR = EOS_PRmix.to(T=T, P=P).Z_g
    else:
        Z_PR = EOS_PRmix.to(T=T, P=P).Z_l # Usa Z_l como alternativa si no

    if hasattr(EOS_SRKmix, 'Z_g'):
        Z_SRK = EOS_SRKmix.to(T=T, P=P).Z_g
    else:
        Z_SRK = EOS_SRKmix.to(T=T, P=P).Z_l # Usa Z_l como alternativa si n

except AttributeError as e:
    print(f"Error al acceder a atributos: {e}")
# Almacenar Los resultados
results.append([Ppr, Tpr, equis, Z_exp, Z_PR, Z_SRK])

# Crear un DataFrame con Los resultados
columns = ['Ppr', 'Tpr', 'X', 'Z(exp)', 'Z(PR)', 'Z(SRK)']
data = pd.DataFrame(results, columns=columns)
data.head()

```

Out[86]:

	Ppr	Tpr	X	Z(exp)	Z(PR)	Z(SRK)
0	0.714609	1.194707	0.598146	0.85127	0.831137	0.851514
1	1.009769	1.194707	0.845203	0.78334	0.758910	0.785745
2	3.316187	1.194707	2.775733	0.56427	0.553238	0.600779
3	4.411465	1.194707	3.692509	0.65462	0.626810	0.685755
4	0.446706	1.327452	0.336514	0.93835	0.925536	0.937494

In [87]: `## Normalizando Los valores de Ppr, Tpr y X para usar en Los modelos de predicción`  
`scaler = StandardScaler()`

```
data[['Ppr', 'Tpr', 'X']] = scaler.fit_transform(data[['Ppr', 'Tpr', 'X']])
data.head()
```

Out[87]:

	Ppr	Tpr	X	Z(exp)	Z(PR)	Z(SRK)
0	-0.918927	-1.514769	-0.845877	0.85127	0.831137	0.851514
1	-0.758450	-1.514769	-0.651715	0.78334	0.758910	0.785745
2	0.495533	-1.514769	0.865487	0.56427	0.553238	0.600779
3	1.091028	-1.514769	1.585981	0.65462	0.626810	0.685755
4	-1.064584	-0.714518	-1.051493	0.93835	0.925536	0.937494

## Redes Neuronales Artificiales (ANN)

En este caso luego de tener los datos normalizados empleamos la librería [tensorflow](#) usando el método de predicción realizado por el modelo de Adam para entrenar la red neuronal debido a su eficiencia y velocidad de convergencia. Adam combina las ventajas de los optimizadores AdaGrad y RMSProp, permitiendo una adaptación dinámica de las tasas de aprendizaje para cada parámetro, lo que resulta en un ajuste más efectivo, especialmente en problemas con datos ruidosos y complejos. Su capacidad para manejar momentos acumulados y su robustez lo convierten en una opción confiable para la regresión, facilitando un entrenamiento eficaz en el predicción del factor de compresibilidad  $Z$ . Además, su configuración predeterminada permite iniciar el proceso de entrenamiento sin la necesidad de un ajuste exhaustivo de hiperparámetros, lo que optimiza el flujo de trabajo en el análisis de datos experimentales.

In [88]:

```
# RED NEURONAL ARTIFICIAL(ANN) con el modelo de ADAM
np.random.seed(42)
tf.random.set_seed(42)


# Asumir que el dataset tiene columnas ['Ppr', 'Tpr', 'X', 'Z(exp)']
x = data[['Ppr', 'Tpr', 'X']].values
y = data['Z(exp)'].values # Verifica que el nombre de la columna sea correcto


# Definir la red neuronal
model = tf.keras.Sequential([
    tf.keras.layers.Input(shape=(3,)),
    tf.keras.layers.Dense(10, activation='relu'),
    tf.keras.layers.Dense(10, activation='relu'),
    tf.keras.layers.Dense(1) # Una salida para predecir Z
])


# Compilar el modelo con el optimizador ADAM
model.compile(
    optimizer=tf.keras.optimizers.Adam(learning_rate=0.01), # Usamos el modelo
    loss='mean_squared_error', # Usamos MSE porque es una regresión
    metrics=['mean_absolute_error']
)


# Crear un dataset de TensorFlow
train_dataset = tf.data.Dataset.from_tensor_slices((x, y))
train_dataset = train_dataset.batch(256) # Ajustar el tamaño del batch según se
```


```
# Entrenar el modelo
model.fit(train_dataset, epochs=1000)
# Hacer predicciones
predictions = model.predict(x)
print('Predicciones finalizadas')
# Agregar predicciones al DataFrame
data['Z(ANN)'] = predictions
```


Epoch 1/1000  
2/2  3s 68ms/step - loss: 0.4472 - mean\_absolute\_error: 0.656  
1


Epoch 2/1000  
2/2  0s 23ms/step - loss: 0.2069 - mean\_absolute\_error: 0.423  
1


Epoch 3/1000  
2/2  0s 12ms/step - loss: 0.1159 - mean\_absolute\_error: 0.296  
3


Epoch 4/1000  
2/2  0s 15ms/step - loss: 0.0987 - mean\_absolute\_error: 0.234  
6


Epoch 5/1000  
2/2  0s 13ms/step - loss: 0.0966 - mean\_absolute\_error: 0.235  
0


Epoch 6/1000  
2/2  0s 15ms/step - loss: 0.0844 - mean\_absolute\_error: 0.231  
0


Epoch 7/1000  
2/2  0s 12ms/step - loss: 0.0613 - mean\_absolute\_error: 0.199  
6


Epoch 8/1000  
2/2  0s 13ms/step - loss: 0.0456 - mean\_absolute\_error: 0.170  
0


Epoch 9/1000  
2/2  0s 38ms/step - loss: 0.0432 - mean\_absolute\_error: 0.171  
3


Epoch 10/1000  
2/2  0s 12ms/step - loss: 0.0450 - mean\_absolute\_error: 0.178  
9


Epoch 11/1000  
2/2  0s 12ms/step - loss: 0.0420 - mean\_absolute\_error: 0.175  
2


Epoch 12/1000  
2/2  0s 9ms/step - loss: 0.0335 - mean\_absolute\_error: 0.1552


Epoch 13/1000  
2/2  0s 12ms/step - loss: 0.0246 - mean\_absolute\_error: 0.129  
2


Epoch 14/1000  
2/2  0s 11ms/step - loss: 0.0200 - mean\_absolute\_error: 0.116  
3


Epoch 15/1000  
2/2  0s 10ms/step - loss: 0.0202 - mean\_absolute\_error: 0.114  
0


Epoch 16/1000  
2/2  0s 13ms/step - loss: 0.0211 - mean\_absolute\_error: 0.112  
8






















Epoch 17/1000  
2/2  0s 20ms/step - loss: 0.0187 - mean\_absolute\_error: 0.105  
3

Epoch 18/1000  
2/2  0s 14ms/step - loss: 0.0140 - mean\_absolute\_error: 0.089  
9

Epoch 19/1000  
2/2  0s 7ms/step - loss: 0.0102 - mean\_absolute\_error: 0.0752
























Epoch 20/1000  
2/2  0s 19ms/step - loss: 0.0090 - mean\_absolute\_error: 0.074  
5


Epoch 21/1000  
2/2  0s 10ms/step - loss: 0.0090 - mean\_absolute\_error: 0.077


7  
Epoch 22/1000  
2/2  0s 11ms/step - loss: 0.0085 - mean\_absolute\_error: 0.075  
0  
Epoch 23/1000  
2/2  0s 12ms/step - loss: 0.0069 - mean\_absolute\_error: 0.065  
3  
Epoch 24/1000  
2/2  0s 21ms/step - loss: 0.0061 - mean\_absolute\_error: 0.061  
7  
Epoch 25/1000  
2/2  0s 10ms/step - loss: 0.0065 - mean\_absolute\_error: 0.063  
8  
Epoch 26/1000  
2/2  0s 21ms/step - loss: 0.0061 - mean\_absolute\_error: 0.061  
8  
Epoch 27/1000  
2/2  0s 23ms/step - loss: 0.0053 - mean\_absolute\_error: 0.057  
1  
Epoch 28/1000  
2/2  0s 12ms/step - loss: 0.0050 - mean\_absolute\_error: 0.055  
8  
Epoch 29/1000  
2/2  0s 9ms/step - loss: 0.0049 - mean\_absolute\_error: 0.0549  
Epoch 30/1000  
2/2  0s 13ms/step - loss: 0.0045 - mean\_absolute\_error: 0.052  
6  
Epoch 31/1000  
2/2  0s 10ms/step - loss: 0.0040 - mean\_absolute\_error: 0.050  
3  
Epoch 32/1000  
2/2  0s 12ms/step - loss: 0.0039 - mean\_absolute\_error: 0.049  
3  
Epoch 33/1000  
2/2  0s 17ms/step - loss: 0.0037 - mean\_absolute\_error: 0.048  
2  
Epoch 34/1000  
2/2  0s 34ms/step - loss: 0.0034 - mean\_absolute\_error: 0.046  
1  
Epoch 35/1000  
2/2  0s 0s/step - loss: 0.0032 - mean\_absolute\_error: 0.0440  
Epoch 36/1000  
2/2  0s 6ms/step - loss: 0.0030 - mean\_absolute\_error: 0.0424  
Epoch 37/1000  
2/2  0s 12ms/step - loss: 0.0029 - mean\_absolute\_error: 0.041  
3  
Epoch 38/1000  
2/2  0s 12ms/step - loss: 0.0028 - mean\_absolute\_error: 0.040  
2  
Epoch 39/1000  
2/2  0s 11ms/step - loss: 0.0027 - mean\_absolute\_error: 0.039  
0  
Epoch 40/1000  
2/2  0s 8ms/step - loss: 0.0026 - mean\_absolute\_error: 0.0381  
Epoch 41/1000  
2/2  0s 9ms/step - loss: 0.0025 - mean\_absolute\_error: 0.0373  
Epoch 42/1000  
2/2  0s 17ms/step - loss: 0.0024 - mean\_absolute\_error: 0.036  
4  
Epoch 43/1000





2/2 ————— 0s 12ms/step - loss: 0.0023 - mean\_absolute\_error: 0.035  
6  
Epoch 44/1000  
2/2 ————— 0s 17ms/step - loss: 0.0022 - mean\_absolute\_error: 0.035  
0  
Epoch 45/1000  
2/2 ————— 0s 13ms/step - loss: 0.0021 - mean\_absolute\_error: 0.034  
5  
Epoch 46/1000  
2/2 ————— 0s 10ms/step - loss: 0.0021 - mean\_absolute\_error: 0.034  
0  
Epoch 47/1000  
2/2 ————— 0s 13ms/step - loss: 0.0020 - mean\_absolute\_error: 0.033  
3  
Epoch 48/1000  
2/2 ————— 0s 13ms/step - loss: 0.0019 - mean\_absolute\_error: 0.032  
8  
Epoch 49/1000  
2/2 ————— 0s 11ms/step - loss: 0.0019 - mean\_absolute\_error: 0.032  
3  
Epoch 50/1000  
2/2 ————— 0s 12ms/step - loss: 0.0018 - mean\_absolute\_error: 0.031  
9  
Epoch 51/1000  
2/2 ————— 0s 11ms/step - loss: 0.0018 - mean\_absolute\_error: 0.031  
4  
Epoch 52/1000  
2/2 ————— 0s 15ms/step - loss: 0.0017 - mean\_absolute\_error: 0.031  
0  
Epoch 53/1000  
2/2 ————— 0s 11ms/step - loss: 0.0017 - mean\_absolute\_error: 0.030  
7  
Epoch 54/1000  
2/2 ————— 0s 13ms/step - loss: 0.0017 - mean\_absolute\_error: 0.030  
4  
Epoch 55/1000  
2/2 ————— 0s 14ms/step - loss: 0.0016 - mean\_absolute\_error: 0.030  
1  
Epoch 56/1000  
2/2 ————— 0s 14ms/step - loss: 0.0016 - mean\_absolute\_error: 0.029  
7  
Epoch 57/1000  
2/2 ————— 0s 16ms/step - loss: 0.0015 - mean\_absolute\_error: 0.029  
4  
Epoch 58/1000  
2/2 ————— 0s 12ms/step - loss: 0.0015 - mean\_absolute\_error: 0.029  
0  
Epoch 59/1000  
2/2 ————— 0s 13ms/step - loss: 0.0015 - mean\_absolute\_error: 0.028  
7  
Epoch 60/1000  
2/2 ————— 0s 15ms/step - loss: 0.0014 - mean\_absolute\_error: 0.028  
4  
Epoch 61/1000  
2/2 ————— 0s 10ms/step - loss: 0.0014 - mean\_absolute\_error: 0.028  
2  
Epoch 62/1000  
2/2 ————— 0s 12ms/step - loss: 0.0014 - mean\_absolute\_error: 0.027  
8  
Epoch 63/1000


2/2  0s 11ms/step - loss: 0.0014 - mean\_absolute\_error: 0.0275  
Epoch 64/1000  
2/2  0s 9ms/step - loss: 0.0013 - mean\_absolute\_error: 0.0271  
Epoch 65/1000  
2/2  0s 8ms/step - loss: 0.0013 - mean\_absolute\_error: 0.0268  
Epoch 66/1000  
2/2  0s 12ms/step - loss: 0.0013 - mean\_absolute\_error: 0.0266  
Epoch 67/1000  
2/2  0s 11ms/step - loss: 0.0013 - mean\_absolute\_error: 0.0263  
Epoch 68/1000  
2/2  0s 31ms/step - loss: 0.0012 - mean\_absolute\_error: 0.0261  
Epoch 69/1000  
2/2  0s 2ms/step - loss: 0.0012 - mean\_absolute\_error: 0.0258  
Epoch 70/1000  
2/2  0s 20ms/step - loss: 0.0012 - mean\_absolute\_error: 0.0255  
Epoch 71/1000  
2/2  0s 10ms/step - loss: 0.0012 - mean\_absolute\_error: 0.0253  
Epoch 72/1000  
2/2  0s 0s/step - loss: 0.0011 - mean\_absolute\_error: 0.0251  
Epoch 73/1000  
2/2  0s 10ms/step - loss: 0.0011 - mean\_absolute\_error: 0.0248  
Epoch 74/1000  
2/2  0s 9ms/step - loss: 0.0011 - mean\_absolute\_error: 0.0246  
Epoch 75/1000  
2/2  0s 8ms/step - loss: 0.0011 - mean\_absolute\_error: 0.0244  
Epoch 76/1000  
2/2  0s 10ms/step - loss: 0.0011 - mean\_absolute\_error: 0.0242  
Epoch 77/1000  
2/2  0s 10ms/step - loss: 0.0011 - mean\_absolute\_error: 0.0240  
Epoch 78/1000  
2/2  0s 0s/step - loss: 0.0010 - mean\_absolute\_error: 0.0237  
Epoch 79/1000  
2/2  0s 0s/step - loss: 0.0010 - mean\_absolute\_error: 0.0235  
Epoch 80/1000  
2/2  0s 14ms/step - loss: 0.0010 - mean\_absolute\_error: 0.0234  
Epoch 81/1000  
2/2  0s 10ms/step - loss: 0.0010 - mean\_absolute\_error: 0.0232  
Epoch 82/1000  
2/2  0s 24ms/step - loss: 9.8931e-04 - mean\_absolute\_error: 0.0231  
Epoch 83/1000  
2/2  0s 11ms/step - loss: 9.7695e-04 - mean\_absolute\_error: 0.0230  
Epoch 84/1000  
2/2  0s 11ms/step - loss: 9.6385e-04 - mean\_absolute\_error: 0.0229  
Epoch 85/1000  
2/2  0s 11ms/step - loss: 9.5054e-04 - mean\_absolute\_error: 0.0227


Epoch 86/1000  
2/2  0s 15ms/step - loss: 9.3784e-04 - mean\_absolute\_error: 0.0225


Epoch 87/1000  
2/2  0s 18ms/step - loss: 9.2630e-04 - mean\_absolute\_error: 0.0224


Epoch 88/1000  
2/2  0s 8ms/step - loss: 9.1570e-04 - mean\_absolute\_error: 0.0222


Epoch 89/1000  
2/2  0s 13ms/step - loss: 9.0560e-04 - mean\_absolute\_error: 0.0221


Epoch 90/1000  
2/2  0s 12ms/step - loss: 8.9553e-04 - mean\_absolute\_error: 0.0220


Epoch 91/1000  
2/2  0s 10ms/step - loss: 8.8534e-04 - mean\_absolute\_error: 0.0219


Epoch 92/1000  
2/2  0s 12ms/step - loss: 8.7546e-04 - mean\_absolute\_error: 0.0217


Epoch 93/1000  
2/2  0s 16ms/step - loss: 8.6670e-04 - mean\_absolute\_error: 0.0216


Epoch 94/1000  
2/2  0s 12ms/step - loss: 8.5853e-04 - mean\_absolute\_error: 0.0216


Epoch 95/1000  
2/2  0s 10ms/step - loss: 8.5000e-04 - mean\_absolute\_error: 0.0215


Epoch 96/1000  
2/2  0s 10ms/step - loss: 8.4150e-04 - mean\_absolute\_error: 0.0214


Epoch 97/1000  
2/2  0s 20ms/step - loss: 8.3301e-04 - mean\_absolute\_error: 0.0213


Epoch 98/1000  
2/2  0s 9ms/step - loss: 8.2442e-04 - mean\_absolute\_error: 0.0212


Epoch 99/1000  
2/2  0s 11ms/step - loss: 8.1575e-04 - mean\_absolute\_error: 0.0211


Epoch 100/1000  
2/2  0s 7ms/step - loss: 8.0773e-04 - mean\_absolute\_error: 0.0210


Epoch 101/1000  
2/2  0s 10ms/step - loss: 8.0030e-04 - mean\_absolute\_error: 0.0209


Epoch 102/1000  
2/2  0s 13ms/step - loss: 7.9302e-04 - mean\_absolute\_error: 0.0208


Epoch 103/1000  
2/2  0s 21ms/step - loss: 7.8559e-04 - mean\_absolute\_error: 0.0207


Epoch 104/1000  
2/2  0s 19ms/step - loss: 7.7793e-04 - mean\_absolute\_error: 0.0206


Epoch 105/1000  
2/2  0s 9ms/step - loss: 7.7024e-04 - mean\_absolute\_error: 0.0205


Epoch 106/1000  
2/2  0s 9ms/step - loss: 7.6285e-04 - mean\_absolute\_error: 0.0204


Epoch 107/1000  
2/2  0s 12ms/step - loss: 7.5580e-04 - mean\_absolute\_error: 0.0204


Epoch 108/1000  
2/2  0s 16ms/step - loss: 7.4894e-04 - mean\_absolute\_error: 0.0203


Epoch 109/1000  
2/2  0s 8ms/step - loss: 7.4206e-04 - mean\_absolute\_error: 0.0202


Epoch 110/1000  
2/2  0s 8ms/step - loss: 7.3517e-04 - mean\_absolute\_error: 0.0201


Epoch 111/1000  
2/2  0s 14ms/step - loss: 7.2816e-04 - mean\_absolute\_error: 0.0200


Epoch 112/1000  
2/2  0s 17ms/step - loss: 7.2120e-04 - mean\_absolute\_error: 0.0199


Epoch 113/1000  
2/2  0s 10ms/step - loss: 7.1440e-04 - mean\_absolute\_error: 0.0198


Epoch 114/1000  
2/2  0s 15ms/step - loss: 7.0774e-04 - mean\_absolute\_error: 0.0197


Epoch 115/1000  
2/2  0s 8ms/step - loss: 7.0114e-04 - mean\_absolute\_error: 0.0197


Epoch 116/1000  
2/2  0s 12ms/step - loss: 6.9446e-04 - mean\_absolute\_error: 0.0196


Epoch 117/1000  
2/2  0s 11ms/step - loss: 6.8782e-04 - mean\_absolute\_error: 0.0195


Epoch 118/1000  
2/2  0s 19ms/step - loss: 6.8138e-04 - mean\_absolute\_error: 0.0194


Epoch 119/1000  
2/2  0s 5ms/step - loss: 6.7521e-04 - mean\_absolute\_error: 0.0193


Epoch 120/1000  
2/2  0s 22ms/step - loss: 6.6931e-04 - mean\_absolute\_error: 0.0192


Epoch 121/1000  
2/2  0s 14ms/step - loss: 6.6358e-04 - mean\_absolute\_error: 0.0192


Epoch 122/1000  
2/2  0s 9ms/step - loss: 6.5786e-04 - mean\_absolute\_error: 0.0191


Epoch 123/1000  
2/2  0s 10ms/step - loss: 6.5212e-04 - mean\_absolute\_error: 0.0190


Epoch 124/1000  
2/2  0s 10ms/step - loss: 6.4646e-04 - mean\_absolute\_error: 0.0189


Epoch 125/1000  
2/2  0s 11ms/step - loss: 6.4100e-04 - mean\_absolute\_error: 0.0189


Epoch 126/1000  
2/2  0s 10ms/step - loss: 6.3579e-04 - mean\_absolute\_error: 0.0188


Epoch 127/1000  
2/2  0s 9ms/step - loss: 6.3078e-04 - mean\_absolute\_error: 0.0187


Epoch 128/1000  
2/2  0s 9ms/step - loss: 6.2583e-04 - mean\_absolute\_error: 0.0186


Epoch 129/1000  
2/2  0s 14ms/step - loss: 6.2094e-04 - mean\_absolute\_error: 0.0186


Epoch 130/1000  
2/2  0s 10ms/step - loss: 6.1609e-04 - mean\_absolute\_error: 0.0185


Epoch 131/1000  
2/2  0s 8ms/step - loss: 6.1138e-04 - mean\_absolute\_error: 0.0184


Epoch 132/1000  
2/2  0s 13ms/step - loss: 6.0665e-04 - mean\_absolute\_error: 0.0184


Epoch 133/1000  
2/2  0s 10ms/step - loss: 6.0191e-04 - mean\_absolute\_error: 0.0183


Epoch 134/1000  
2/2  0s 12ms/step - loss: 5.9726e-04 - mean\_absolute\_error: 0.0182


Epoch 135/1000  
2/2  0s 10ms/step - loss: 5.9269e-04 - mean\_absolute\_error: 0.0181


Epoch 136/1000  
2/2  0s 13ms/step - loss: 5.8821e-04 - mean\_absolute\_error: 0.0181


Epoch 137/1000  
2/2  0s 9ms/step - loss: 5.8382e-04 - mean\_absolute\_error: 0.0180


Epoch 138/1000  
2/2  0s 13ms/step - loss: 5.7950e-04 - mean\_absolute\_error: 0.0179


Epoch 139/1000  
2/2  0s 10ms/step - loss: 5.7527e-04 - mean\_absolute\_error: 0.0179


Epoch 140/1000  
2/2  0s 9ms/step - loss: 5.7108e-04 - mean\_absolute\_error: 0.0178


Epoch 141/1000  
2/2  0s 7ms/step - loss: 5.6693e-04 - mean\_absolute\_error: 0.0178


Epoch 142/1000  
2/2  0s 13ms/step - loss: 5.6278e-04 - mean\_absolute\_error: 0.0177


Epoch 143/1000  
2/2  0s 17ms/step - loss: 5.5861e-04 - mean\_absolute\_error: 0.0176


Epoch 144/1000  
2/2  0s 5ms/step - loss: 5.5442e-04 - mean\_absolute\_error: 0.0176


Epoch 145/1000  
2/2  0s 23ms/step - loss: 5.5027e-04 - mean\_absolute\_error: 0.0175


Epoch 146/1000  
2/2  0s 10ms/step - loss: 5.4616e-04 - mean\_absolute\_error: 0.0174


Epoch 147/1000  
2/2  0s 10ms/step - loss: 5.4205e-04 - mean\_absolute\_error: 0.0174


Epoch 148/1000  
2/2  0s 0s/step - loss: 5.3793e-04 - mean\_absolute\_error: 0.0173


Epoch 149/1000  
2/2  0s 10ms/step - loss: 5.3391e-04 - mean\_absolute\_error: 0.0172


Epoch 150/1000  
2/2  0s 10ms/step - loss: 5.3034e-04 - mean\_absolute\_error: 0.0172


Epoch 151/1000  
2/2  0s 10ms/step - loss: 5.2690e-04 - mean\_absolute\_error: 0.0172


Epoch 152/1000  
2/2  0s 11ms/step - loss: 5.2328e-04 - mean\_absolute\_error: 0.0171


Epoch 153/1000  
2/2  0s 8ms/step - loss: 5.1959e-04 - mean\_absolute\_error: 0.0170


Epoch 154/1000  
2/2  0s 7ms/step - loss: 5.1511e-04 - mean\_absolute\_error: 0.0169


Epoch 155/1000  
2/2  0s 10ms/step - loss: 5.1108e-04 - mean\_absolute\_error: 0.0169


Epoch 156/1000  
2/2  0s 10ms/step - loss: 5.0757e-04 - mean\_absolute\_error: 0.0168


Epoch 157/1000  
2/2  0s 10ms/step - loss: 5.0454e-04 - mean\_absolute\_error: 0.0168


Epoch 158/1000  
2/2  0s 11ms/step - loss: 5.0074e-04 - mean\_absolute\_error: 0.0167


Epoch 159/1000  
2/2  0s 10ms/step - loss: 4.9659e-04 - mean\_absolute\_error: 0.0166


Epoch 160/1000  
2/2  0s 10ms/step - loss: 4.9313e-04 - mean\_absolute\_error: 0.0165


Epoch 161/1000  
2/2  0s 10ms/step - loss: 4.9023e-04 - mean\_absolute\_error: 0.0165


Epoch 162/1000  
2/2  0s 10ms/step - loss: 4.8737e-04 - mean\_absolute\_error: 0.0164


Epoch 163/1000  
2/2  0s 10ms/step - loss: 4.8431e-04 - mean\_absolute\_error: 0.0164


Epoch 164/1000  
2/2  0s 10ms/step - loss: 4.8025e-04 - mean\_absolute\_error: 0.0163


Epoch 165/1000  
2/2  0s 9ms/step - loss: 4.7677e-04 - mean\_absolute\_error: 0.0162


Epoch 166/1000  
2/2  0s 10ms/step - loss: 4.7395e-04 - mean\_absolute\_error: 0.0162


Epoch 167/1000  
2/2  0s 10ms/step - loss: 4.7138e-04 - mean\_absolute\_error: 0.0161


Epoch 168/1000  
2/2  0s 11ms/step - loss: 4.6847e-04 - mean\_absolute\_error: 0.0161


Epoch 169/1000  
2/2  0s 10ms/step - loss: 4.6527e-04 - mean\_absolute\_error: 0.0160


Epoch 170/1000  
2/2  0s 10ms/step - loss: 4.6138e-04 - mean\_absolute\_error: 0.0159


Epoch 171/1000  
2/2  0s 10ms/step - loss: 4.5812e-04 - mean\_absolute\_error: 0.0159


Epoch 172/1000  
2/2  0s 10ms/step - loss: 4.5549e-04 - mean\_absolute\_error: 0.0158


Epoch 173/1000  
2/2  0s 10ms/step - loss: 4.5284e-04 - mean\_absolute\_error: 0.0158


Epoch 174/1000  
2/2  0s 10ms/step - loss: 4.4970e-04 - mean\_absolute\_error: 0.0157


Epoch 175/1000  
2/2  0s 9ms/step - loss: 4.4629e-04 - mean\_absolute\_error: 0.0156


Epoch 176/1000  
2/2  0s 10ms/step - loss: 4.4308e-04 - mean\_absolute\_error: 0.0156


Epoch 177/1000  
2/2  0s 10ms/step - loss: 4.4018e-04 - mean\_absolute\_error: 0.0155


Epoch 178/1000  
2/2  0s 9ms/step - loss: 4.3737e-04 - mean\_absolute\_error: 0.0155


Epoch 179/1000  
2/2  0s 10ms/step - loss: 4.3437e-04 - mean\_absolute\_error: 0.0154


Epoch 180/1000  
2/2  0s 10ms/step - loss: 4.3123e-04 - mean\_absolute\_error: 0.0153


Epoch 181/1000  
2/2  0s 10ms/step - loss: 4.2813e-04 - mean\_absolute\_error: 0.0153


Epoch 182/1000  
2/2  0s 10ms/step - loss: 4.2528e-04 - mean\_absolute\_error: 0.0152


Epoch 183/1000  
2/2  0s 9ms/step - loss: 4.2263e-04 - mean\_absolute\_error: 0.0151


Epoch 184/1000  
2/2  0s 10ms/step - loss: 4.2002e-04 - mean\_absolute\_error: 0.0151


Epoch 185/1000  
2/2  0s 0s/step - loss: 4.1689e-04 - mean\_absolute\_error: 0.0150


Epoch 186/1000  
2/2  0s 10ms/step - loss: 4.1382e-04 - mean\_absolute\_error: 0.0149


Epoch 187/1000  
2/2  0s 10ms/step - loss: 4.1102e-04 - mean\_absolute\_error: 0.0149


Epoch 188/1000  
2/2  0s 10ms/step - loss: 4.0848e-04 - mean\_absolute\_error: 0.0148


Epoch 189/1000  
2/2  0s 10ms/step - loss: 4.0565e-04 - mean\_absolute\_error: 0.0148


Epoch 190/1000  
2/2  0s 10ms/step - loss: 4.0263e-04 - mean\_absolute\_error: 0.0147


Epoch 191/1000  
2/2  0s 10ms/step - loss: 3.9972e-04 - mean\_absolute\_error: 0.0146


Epoch 192/1000  
2/2  0s 10ms/step - loss: 3.9736e-04 - mean\_absolute\_error: 0.0146


Epoch 193/1000  
2/2  0s 10ms/step - loss: 3.9501e-04 - mean\_absolute\_error: 0.0145


Epoch 194/1000  
2/2  0s 10ms/step - loss: 3.9243e-04 - mean\_absolute\_error: 0.0145


Epoch 195/1000  
2/2  0s 10ms/step - loss: 3.8965e-04 - mean\_absolute\_error: 0.0144


Epoch 196/1000  
2/2  0s 20ms/step - loss: 3.8735e-04 - mean\_absolute\_error: 0.0144


Epoch 197/1000  
2/2  0s 10ms/step - loss: 3.8505e-04 - mean\_absolute\_error: 0.0143


Epoch 198/1000  
2/2  0s 8ms/step - loss: 3.8255e-04 - mean\_absolute\_error: 0.0142


Epoch 199/1000  
2/2  0s 10ms/step - loss: 3.7992e-04 - mean\_absolute\_error: 0.0142


Epoch 200/1000  
2/2  0s 10ms/step - loss: 3.7750e-04 - mean\_absolute\_error: 0.0141

Epoch 201/1000  
2/2  0s 10ms/step - loss: 3.7528e-04 - mean\_absolute\_error: 0.0141


Epoch 202/1000  
2/2  0s 10ms/step - loss: 3.7309e-04 - mean\_absolute\_error: 0.0140


Epoch 203/1000  
2/2  0s 10ms/step - loss: 3.7057e-04 - mean\_absolute\_error: 0.0139


Epoch 204/1000  
2/2  0s 10ms/step - loss: 3.6797e-04 - mean\_absolute\_error: 0.0139


Epoch 205/1000  
2/2  0s 8ms/step - loss: 3.6541e-04 - mean\_absolute\_error: 0.0138





Epoch 206/1000  
2/2  0s 10ms/step - loss: 3.6304e-04 - mean\_absolute\_error: 0.0138


Epoch 207/1000  
2/2  0s 10ms/step - loss: 3.6080e-04 - mean\_absolute\_error: 0.0138


Epoch 208/1000  
2/2  0s 10ms/step - loss: 3.5851e-04 - mean\_absolute\_error: 0.0137


Epoch 209/1000  
2/2  0s 10ms/step - loss: 3.5620e-04 - mean\_absolute\_error: 0.0137


Epoch 210/1000  
2/2  0s 10ms/step - loss: 3.5406e-04 - mean\_absolute\_error: 0.0136


Epoch 211/1000  
2/2  0s 14ms/step - loss: 3.5217e-04 - mean\_absolute\_error: 0.0136


Epoch 212/1000  
2/2  0s 10ms/step - loss: 3.5035e-04 - mean\_absolute\_error: 0.0135


Epoch 213/1000  
2/2  0s 10ms/step - loss: 3.4819e-04 - mean\_absolute\_error: 0.0135


Epoch 214/1000  
2/2  0s 11ms/step - loss: 3.4570e-04 - mean\_absolute\_error: 0.0134


Epoch 215/1000  
2/2  0s 10ms/step - loss: 3.4341e-04 - mean\_absolute\_error: 0.0134


Epoch 216/1000  
2/2  0s 10ms/step - loss: 3.4138e-04 - mean\_absolute\_error: 0.0133


Epoch 217/1000  
2/2  0s 9ms/step - loss: 3.3945e-04 - mean\_absolute\_error: 0.0133


Epoch 218/1000  
2/2  0s 7ms/step - loss: 3.3751e-04 - mean\_absolute\_error: 0.0133


Epoch 219/1000  
2/2  0s 10ms/step - loss: 3.3548e-04 - mean\_absolute\_error: 0.0132


Epoch 220/1000  
2/2  0s 19ms/step - loss: 3.3342e-04 - mean\_absolute\_error: 0.0132


Epoch 221/1000  
2/2  0s 9ms/step - loss: 3.3140e-04 - mean\_absolute\_error: 0.0131


Epoch 222/1000  
2/2  0s 10ms/step - loss: 3.2949e-04 - mean\_absolute\_error: 0.0131


Epoch 223/1000  
2/2  0s 10ms/step - loss: 3.2764e-04 - mean\_absolute\_error: 0.0130


Epoch 224/1000  
2/2  0s 13ms/step - loss: 3.2573e-04 - mean\_absolute\_error: 0.0130


Epoch 225/1000  
2/2  0s 10ms/step - loss: 3.2390e-04 - mean\_absolute\_error: 0.0130


Epoch 226/1000  
2/2  0s 9ms/step - loss: 3.2223e-04 - mean\_absolute\_error: 0.0129


Epoch 227/1000  
2/2  0s 10ms/step - loss: 3.2069e-04 - mean\_absolute\_error: 0.0129


Epoch 228/1000  
2/2  0s 10ms/step - loss: 3.1889e-04 - mean\_absolute\_error: 0.0128


Epoch 229/1000  
2/2  0s 0s/step - loss: 3.1714e-04 - mean\_absolute\_error: 0.0128


Epoch 230/1000  
2/2  0s 0s/step - loss: 3.1541e-04 - mean\_absolute\_error: 0.0128


Epoch 231/1000  
2/2  0s 10ms/step - loss: 3.1383e-04 - mean\_absolute\_error: 0.0127


Epoch 232/1000  
2/2  0s 6ms/step - loss: 3.1218e-04 - mean\_absolute\_error: 0.0127


Epoch 233/1000  
2/2  0s 10ms/step - loss: 3.1053e-04 - mean\_absolute\_error: 0.0127


Epoch 234/1000  
2/2  0s 10ms/step - loss: 3.0911e-04 - mean\_absolute\_error: 0.0126


Epoch 235/1000  
2/2  0s 10ms/step - loss: 3.0785e-04 - mean\_absolute\_error: 0.0126


Epoch 236/1000  
2/2  0s 10ms/step - loss: 3.0631e-04 - mean\_absolute\_error: 0.0126


Epoch 237/1000  
2/2  0s 10ms/step - loss: 3.0430e-04 - mean\_absolute\_error: 0.0125


Epoch 238/1000  
2/2  0s 9ms/step - loss: 3.0204e-04 - mean\_absolute\_error: 0.0124


Epoch 239/1000  
2/2  0s 10ms/step - loss: 2.9989e-04 - mean\_absolute\_error: 0.0124


Epoch 240/1000  
2/2  0s 10ms/step - loss: 2.9810e-04 - mean\_absolute\_error: 0.0124


Epoch 241/1000  
2/2  0s 16ms/step - loss: 2.9646e-04 - mean\_absolute\_error: 0.0124


Epoch 242/1000  
2/2  0s 10ms/step - loss: 2.9433e-04 - mean\_absolute\_error: 0.0123


Epoch 243/1000  
2/2  0s 20ms/step - loss: 2.9174e-04 - mean\_absolute\_error: 0.0122


Epoch 244/1000  
2/2  0s 10ms/step - loss: 2.8964e-04 - mean\_absolute\_error: 0.0122


Epoch 245/1000  
2/2  0s 11ms/step - loss: 2.8817e-04 - mean\_absolute\_error: 0.0122


Epoch 246/1000  
2/2  0s 10ms/step - loss: 2.8662e-04 - mean\_absolute\_error: 0.0122


Epoch 247/1000  
2/2  0s 9ms/step - loss: 2.8474e-04 - mean\_absolute\_error: 0.0121


Epoch 248/1000  
2/2  0s 10ms/step - loss: 2.8282e-04 - mean\_absolute\_error: 0.0120


Epoch 249/1000  
2/2  0s 0s/step - loss: 2.8117e-04 - mean\_absolute\_error: 0.0120


Epoch 250/1000  
2/2  0s 10ms/step - loss: 2.7979e-04 - mean\_absolute\_error: 0.0120


Epoch 251/1000  
2/2  0s 0s/step - loss: 2.7834e-04 - mean\_absolute\_error: 0.0120


Epoch 252/1000  
2/2  0s 19ms/step - loss: 2.7679e-04 - mean\_absolute\_error: 0.0119


Epoch 253/1000  
2/2  0s 0s/step - loss: 2.7502e-04 - mean\_absolute\_error: 0.0119


Epoch 254/1000  
2/2  0s 10ms/step - loss: 2.7320e-04 - mean\_absolute\_error: 0.0118


Epoch 255/1000  
2/2  0s 13ms/step - loss: 2.7173e-04 - mean\_absolute\_error: 0.0118


Epoch 256/1000  
2/2  0s 10ms/step - loss: 2.7049e-04 - mean\_absolute\_error: 0.0118


Epoch 257/1000  
2/2  0s 10ms/step - loss: 2.6905e-04 - mean\_absolute\_error: 0.0117


Epoch 258/1000  
2/2  0s 13ms/step - loss: 2.6729e-04 - mean\_absolute\_error: 0.0117


Epoch 259/1000  
2/2  0s 10ms/step - loss: 2.6554e-04 - mean\_absolute\_error: 0.0116


Epoch 260/1000  
2/2  0s 10ms/step - loss: 2.6428e-04 - mean\_absolute\_error: 0.0116


Epoch 261/1000  
2/2  0s 9ms/step - loss: 2.6330e-04 - mean\_absolute\_error: 0.0116


Epoch 262/1000  
2/2  0s 0s/step - loss: 2.6202e-04 - mean\_absolute\_error: 0.0116


Epoch 263/1000  
2/2  0s 9ms/step - loss: 2.6042e-04 - mean\_absolute\_error: 0.0115


Epoch 264/1000  
2/2  0s 17ms/step - loss: 2.5893e-04 - mean\_absolute\_error: 0.0115


Epoch 265/1000  
2/2  0s 10ms/step - loss: 2.5785e-04 - mean\_absolute\_error: 0.0115


Epoch 266/1000  
2/2  0s 10ms/step - loss: 2.5681e-04 - mean\_absolute\_error: 0.0114


Epoch 267/1000  
2/2  0s 10ms/step - loss: 2.5529e-04 - mean\_absolute\_error: 0.0114


Epoch 268/1000  
2/2  0s 0s/step - loss: 2.5417e-04 - mean\_absolute\_error: 0.0113


Epoch 269/1000  
2/2  0s 0s/step - loss: 2.5304e-04 - mean\_absolute\_error: 0.0113


Epoch 270/1000  
2/2  0s 9ms/step - loss: 2.5198e-04 - mean\_absolute\_error: 0.0113


Epoch 271/1000  
2/2  0s 45ms/step - loss: 2.5077e-04 - mean\_absolute\_error: 0.0113


Epoch 272/1000  
2/2  0s 8ms/step - loss: 2.5002e-04 - mean\_absolute\_error: 0.0112


Epoch 273/1000  
2/2  0s 10ms/step - loss: 2.4894e-04 - mean\_absolute\_error: 0.0112


Epoch 274/1000  
2/2  0s 10ms/step - loss: 2.4762e-04 - mean\_absolute\_error: 0.0112


Epoch 275/1000  
2/2  0s 7ms/step - loss: 2.4690e-04 - mean\_absolute\_error: 0.0112


Epoch 276/1000  
2/2  0s 7ms/step - loss: 2.4583e-04 - mean\_absolute\_error: 0.0111


Epoch 277/1000  
2/2  0s 10ms/step - loss: 2.4459e-04 - mean\_absolute\_error: 0.0111


Epoch 278/1000  
2/2  0s 16ms/step - loss: 2.4396e-04 - mean\_absolute\_error: 0.0111


Epoch 279/1000  
2/2  0s 10ms/step - loss: 2.4313e-04 - mean\_absolute\_error: 0.0111


Epoch 280/1000  
2/2  0s 10ms/step - loss: 2.4199e-04 - mean\_absolute\_error: 0.0110


Epoch 281/1000  
2/2  0s 0s/step - loss: 2.4122e-04 - mean\_absolute\_error: 0.0110


Epoch 282/1000  
2/2  0s 6ms/step - loss: 2.4079e-04 - mean\_absolute\_error: 0.0110


Epoch 283/1000  
2/2  0s 16ms/step - loss: 2.3968e-04 - mean\_absolute\_error: 0.0110


Epoch 284/1000  
2/2  0s 15ms/step - loss: 2.3840e-04 - mean\_absolute\_error: 0.0109


Epoch 285/1000  
2/2  0s 10ms/step - loss: 2.3781e-04 - mean\_absolute\_error: 0.0109


Epoch 286/1000  
2/2  0s 1ms/step - loss: 2.3759e-04 - mean\_absolute\_error: 0.0109


Epoch 287/1000  
2/2  0s 8ms/step - loss: 2.3654e-04 - mean\_absolute\_error: 0.0109


Epoch 288/1000  
2/2  0s 10ms/step - loss: 2.3520e-04 - mean\_absolute\_error: 0.0108


Epoch 289/1000  
2/2  0s 10ms/step - loss: 2.3464e-04 - mean\_absolute\_error: 0.0108


Epoch 290/1000  
2/2  0s 11ms/step - loss: 2.3455e-04 - mean\_absolute\_error: 0.0108


Epoch 291/1000  
2/2  0s 10ms/step - loss: 2.3351e-04 - mean\_absolute\_error: 0.0108


Epoch 292/1000  
2/2  0s 8ms/step - loss: 2.3218e-04 - mean\_absolute\_error: 0.0108


Epoch 293/1000  
2/2  0s 11ms/step - loss: 2.3169e-04 - mean\_absolute\_error: 0.0108


Epoch 294/1000  
2/2  0s 15ms/step - loss: 2.3170e-04 - mean\_absolute\_error: 0.0108


Epoch 295/1000  
2/2  0s 11ms/step - loss: 2.3071e-04 - mean\_absolute\_error: 0.0107


Epoch 296/1000  
2/2  0s 8ms/step - loss: 2.2970e-04 - mean\_absolute\_error: 0.0107


Epoch 297/1000  
2/2  0s 13ms/step - loss: 2.2936e-04 - mean\_absolute\_error: 0.0107


Epoch 298/1000  
2/2  0s 12ms/step - loss: 2.2873e-04 - mean\_absolute\_error: 0.0107


Epoch 299/1000  
2/2  0s 10ms/step - loss: 2.2777e-04 - mean\_absolute\_error: 0.0107


Epoch 300/1000  
2/2  0s 10ms/step - loss: 2.2720e-04 - mean\_absolute\_error: 0.0106


Epoch 301/1000  
2/2  0s 8ms/step - loss: 2.2690e-04 - mean\_absolute\_error: 0.0106


Epoch 302/1000  
2/2  0s 13ms/step - loss: 2.2666e-04 - mean\_absolute\_error: 0.0106


Epoch 303/1000  
2/2  0s 9ms/step - loss: 2.2567e-04 - mean\_absolute\_error: 0.0106


Epoch 304/1000  
2/2  0s 2ms/step - loss: 2.2470e-04 - mean\_absolute\_error: 0.0106


Epoch 305/1000  
2/2  0s 12ms/step - loss: 2.2443e-04 - mean\_absolute\_error: 0.0106


Epoch 306/1000  
2/2  0s 9ms/step - loss: 2.2426e-04 - mean\_absolute\_error: 0.0106


Epoch 307/1000  
2/2  0s 5ms/step - loss: 2.2368e-04 - mean\_absolute\_error: 0.0106


Epoch 308/1000  
2/2  0s 15ms/step - loss: 2.2314e-04 - mean\_absolute\_error: 0.0105


Epoch 309/1000  
2/2  0s 10ms/step - loss: 2.2228e-04 - mean\_absolute\_error: 0.0105


Epoch 310/1000  
2/2  0s 8ms/step - loss: 2.2160e-04 - mean\_absolute\_error: 0.0105


Epoch 311/1000  
2/2  0s 8ms/step - loss: 2.2126e-04 - mean\_absolute\_error: 0.0105


Epoch 312/1000  
2/2  0s 8ms/step - loss: 2.2091e-04 - mean\_absolute\_error: 0.0105


Epoch 313/1000  
2/2  0s 15ms/step - loss: 2.2044e-04 - mean\_absolute\_error: 0.0105


Epoch 314/1000  
2/2  0s 8ms/step - loss: 2.1993e-04 - mean\_absolute\_error: 0.0105


Epoch 315/1000  
2/2  0s 10ms/step - loss: 2.1900e-04 - mean\_absolute\_error: 0.0104


Epoch 316/1000  
2/2  0s 8ms/step - loss: 2.1819e-04 - mean\_absolute\_error: 0.0104


Epoch 317/1000  
2/2  0s 10ms/step - loss: 2.1767e-04 - mean\_absolute\_error: 0.0104


Epoch 318/1000  
2/2  0s 9ms/step - loss: 2.1725e-04 - mean\_absolute\_error: 0.0104


Epoch 319/1000  
2/2  0s 11ms/step - loss: 2.1702e-04 - mean\_absolute\_error: 0.0104


Epoch 320/1000  
2/2  0s 9ms/step - loss: 2.1626e-04 - mean\_absolute\_error: 0.0104





















Epoch 321/1000  
2/2  0s 10ms/step - loss: 2.1591e-04 - mean\_absolute\_error: 0.0104


Epoch 322/1000  
2/2  0s 8ms/step - loss: 2.1520e-04 - mean\_absolute\_error: 0.0103


Epoch 323/1000  
2/2  0s 11ms/step - loss: 2.1470e-04 - mean\_absolute\_error: 0.0103


Epoch 324/1000  
2/2  0s 9ms/step - loss: 2.1452e-04 - mean\_absolute\_error: 0.0103


Epoch 325/1000  
2/2  0s 14ms/step - loss: 2.1389e-04 - mean\_absolute\_error: 0.0103


Epoch 326/1000  
2/2  0s 12ms/step - loss: 2.1350e-04 - mean\_absolute\_error: 0.0103  
Epoch 327/1000  
2/2  0s 16ms/step - loss: 2.1315e-04 - mean\_absolute\_error: 0.0103  
Epoch 328/1000  
2/2  0s 10ms/step - loss: 2.1268e-04 - mean\_absolute\_error: 0.0103  
Epoch 329/1000  
2/2  0s 6ms/step - loss: 2.1169e-04 - mean\_absolute\_error: 0.0103  
Epoch 330/1000  
2/2  0s 10ms/step - loss: 2.1130e-04 - mean\_absolute\_error: 0.0102  
Epoch 331/1000  
2/2  0s 11ms/step - loss: 2.1134e-04 - mean\_absolute\_error: 0.0103  
Epoch 332/1000  
2/2  0s 8ms/step - loss: 2.1055e-04 - mean\_absolute\_error: 0.0102  
Epoch 333/1000  
2/2  0s 18ms/step - loss: 2.0991e-04 - mean\_absolute\_error: 0.0102  
Epoch 334/1000  
2/2  0s 9ms/step - loss: 2.0962e-04 - mean\_absolute\_error: 0.0102  
Epoch 335/1000  
2/2  0s 9ms/step - loss: 2.0940e-04 - mean\_absolute\_error: 0.0102  
Epoch 336/1000  
2/2  0s 11ms/step - loss: 2.0852e-04 - mean\_absolute\_error: 0.0102  
Epoch 337/1000  
2/2  0s 11ms/step - loss: 2.0799e-04 - mean\_absolute\_error: 0.0102  
Epoch 338/1000  
2/2  0s 6ms/step - loss: 2.0785e-04 - mean\_absolute\_error: 0.0102  
Epoch 339/1000  
2/2  0s 15ms/step - loss: 2.0751e-04 - mean\_absolute\_error: 0.0102  
Epoch 340/1000  
2/2  0s 11ms/step - loss: 2.0700e-04 - mean\_absolute\_error: 0.0102  
Epoch 341/1000  
2/2  0s 12ms/step - loss: 2.0610e-04 - mean\_absolute\_error: 0.0101  
Epoch 342/1000  
2/2  0s 12ms/step - loss: 2.0585e-04 - mean\_absolute\_error: 0.0101  
Epoch 343/1000  
2/2  0s 8ms/step - loss: 2.0573e-04 - mean\_absolute\_error: 0.0101  
Epoch 344/1000  
2/2  0s 9ms/step - loss: 2.0539e-04 - mean\_absolute\_error: 0.0101  
Epoch 345/1000  
2/2  0s 6ms/step - loss: 2.0452e-04 - mean\_absolute\_error: 0.0101


Epoch 346/1000  
2/2  0s 10ms/step - loss: 2.0430e-04 - mean\_absolute\_error: 0.0101


Epoch 347/1000  
2/2  0s 10ms/step - loss: 2.0427e-04 - mean\_absolute\_error: 0.0101


Epoch 348/1000  
2/2  0s 36ms/step - loss: 2.0392e-04 - mean\_absolute\_error: 0.0101


Epoch 349/1000  
2/2  0s 10ms/step - loss: 2.0301e-04 - mean\_absolute\_error: 0.0101


Epoch 350/1000  
2/2  0s 8ms/step - loss: 2.0277e-04 - mean\_absolute\_error: 0.0101


Epoch 351/1000  
2/2  0s 17ms/step - loss: 2.0287e-04 - mean\_absolute\_error: 0.0101


Epoch 352/1000  
2/2  0s 10ms/step - loss: 2.0255e-04 - mean\_absolute\_error: 0.0101


Epoch 353/1000  
2/2  0s 3ms/step - loss: 2.0156e-04 - mean\_absolute\_error: 0.0100


Epoch 354/1000  
2/2  0s 15ms/step - loss: 2.0128e-04 - mean\_absolute\_error: 0.0100


Epoch 355/1000  
2/2  0s 10ms/step - loss: 2.0140e-04 - mean\_absolute\_error: 0.0100


Epoch 356/1000  
2/2  0s 17ms/step - loss: 2.0112e-04 - mean\_absolute\_error: 0.0100


Epoch 357/1000  
2/2  0s 12ms/step - loss: 2.0013e-04 - mean\_absolute\_error: 0.0100


Epoch 358/1000  
2/2  0s 13ms/step - loss: 1.9985e-04 - mean\_absolute\_error: 0.0100


Epoch 359/1000  
2/2  0s 12ms/step - loss: 1.9999e-04 - mean\_absolute\_error: 0.0100


Epoch 360/1000  
2/2  0s 11ms/step - loss: 1.9973e-04 - mean\_absolute\_error: 0.0100

Epoch 361/1000  
2/2  0s 9ms/step - loss: 1.9877e-04 - mean\_absolute\_error: 0.0100


Epoch 362/1000  
2/2  0s 2ms/step - loss: 1.9857e-04 - mean\_absolute\_error: 0.0100


Epoch 363/1000  
2/2  0s 11ms/step - loss: 1.9879e-04 - mean\_absolute\_error: 0.0100


Epoch 364/1000  
2/2  0s 12ms/step - loss: 1.9853e-04 - mean\_absolute\_error: 0.0100


Epoch 365/1000  
2/2  0s 10ms/step - loss: 1.9758e-04 - mean\_absolute\_error: 0.0099





Epoch 366/1000  
2/2  0s 0s/step - loss: 1.9739e-04 - mean\_absolute\_error: 0.0099


Epoch 367/1000  
2/2  0s 10ms/step - loss: 1.9759e-04 - mean\_absolute\_error: 0.0099


Epoch 368/1000  
2/2  0s 10ms/step - loss: 1.9720e-04 - mean\_absolute\_error: 0.0099


Epoch 369/1000  
2/2  0s 10ms/step - loss: 1.9654e-04 - mean\_absolute\_error: 0.0099


Epoch 370/1000  
2/2  0s 11ms/step - loss: 1.9629e-04 - mean\_absolute\_error: 0.0099


Epoch 371/1000  
2/2  0s 10ms/step - loss: 1.9631e-04 - mean\_absolute\_error: 0.0099


Epoch 372/1000  
2/2  0s 9ms/step - loss: 1.9554e-04 - mean\_absolute\_error: 0.0099


Epoch 373/1000  
2/2  0s 14ms/step - loss: 1.9505e-04 - mean\_absolute\_error: 0.0099


Epoch 374/1000  
2/2  0s 12ms/step - loss: 1.9504e-04 - mean\_absolute\_error: 0.0099


Epoch 375/1000  
2/2  0s 12ms/step - loss: 1.9498e-04 - mean\_absolute\_error: 0.0099


Epoch 376/1000  
2/2  0s 11ms/step - loss: 1.9450e-04 - mean\_absolute\_error: 0.0099


Epoch 377/1000  
2/2  0s 35ms/step - loss: 1.9362e-04 - mean\_absolute\_error: 0.0098


Epoch 378/1000  
2/2  0s 12ms/step - loss: 1.9358e-04 - mean\_absolute\_error: 0.0098


Epoch 379/1000  
2/2  0s 13ms/step - loss: 1.9365e-04 - mean\_absolute\_error: 0.0098


Epoch 380/1000  
2/2  0s 18ms/step - loss: 1.9338e-04 - mean\_absolute\_error: 0.0098


Epoch 381/1000  
2/2  0s 11ms/step - loss: 1.9260e-04 - mean\_absolute\_error: 0.0098


Epoch 382/1000  
2/2  0s 12ms/step - loss: 1.9255e-04 - mean\_absolute\_error: 0.0098


Epoch 383/1000  
2/2  0s 12ms/step - loss: 1.9246e-04 - mean\_absolute\_error: 0.0098


Epoch 384/1000  
2/2  0s 9ms/step - loss: 1.9179e-04 - mean\_absolute\_error: 0.0098


Epoch 385/1000  
2/2  0s 8ms/step - loss: 1.9141e-04 - mean\_absolute\_error: 0.0098


Epoch 386/1000  
2/2  0s 13ms/step - loss: 1.9155e-04 - mean\_absolute\_error: 0.0098


Epoch 387/1000  
2/2  0s 12ms/step - loss: 1.9103e-04 - mean\_absolute\_error: 0.0098


Epoch 388/1000  
2/2  0s 8ms/step - loss: 1.9055e-04 - mean\_absolute\_error: 0.0098


Epoch 389/1000  
2/2  0s 10ms/step - loss: 1.9023e-04 - mean\_absolute\_error: 0.0097


Epoch 390/1000  
2/2  0s 10ms/step - loss: 1.8995e-04 - mean\_absolute\_error: 0.0097


Epoch 391/1000  
2/2  0s 11ms/step - loss: 1.8987e-04 - mean\_absolute\_error: 0.0097


Epoch 392/1000  
2/2  0s 10ms/step - loss: 1.8922e-04 - mean\_absolute\_error: 0.0097


Epoch 393/1000  
2/2  0s 10ms/step - loss: 1.8893e-04 - mean\_absolute\_error: 0.0097


Epoch 394/1000  
2/2  0s 8ms/step - loss: 1.8879e-04 - mean\_absolute\_error: 0.0097


Epoch 395/1000  
2/2  0s 12ms/step - loss: 1.8802e-04 - mean\_absolute\_error: 0.0097


Epoch 396/1000  
2/2  0s 13ms/step - loss: 1.8772e-04 - mean\_absolute\_error: 0.0097


Epoch 397/1000  
2/2  0s 6ms/step - loss: 1.8770e-04 - mean\_absolute\_error: 0.0097


Epoch 398/1000  
2/2  0s 4ms/step - loss: 1.8736e-04 - mean\_absolute\_error: 0.0097


Epoch 399/1000  
2/2  0s 15ms/step - loss: 1.8638e-04 - mean\_absolute\_error: 0.0096


Epoch 400/1000  
2/2  0s 11ms/step - loss: 1.8620e-04 - mean\_absolute\_error: 0.0096


Epoch 401/1000  
2/2  0s 8ms/step - loss: 1.8633e-04 - mean\_absolute\_error: 0.0097


Epoch 402/1000  
2/2  0s 8ms/step - loss: 1.8545e-04 - mean\_absolute\_error: 0.0096


Epoch 403/1000  
2/2  0s 15ms/step - loss: 1.8503e-04 - mean\_absolute\_error: 0.0096


Epoch 404/1000  
2/2  0s 16ms/step - loss: 1.8539e-04 - mean\_absolute\_error: 0.0096


Epoch 405/1000  
2/2  0s 7ms/step - loss: 1.8485e-04 - mean\_absolute\_error: 0.0096


Epoch 406/1000  
2/2  0s 33ms/step - loss: 1.8423e-04 - mean\_absolute\_error: 0.0096


Epoch 407/1000  
2/2  0s 9ms/step - loss: 1.8428e-04 - mean\_absolute\_error: 0.0096


Epoch 408/1000  
2/2  0s 11ms/step - loss: 1.8452e-04 - mean\_absolute\_error: 0.0096


Epoch 409/1000  
2/2  0s 11ms/step - loss: 1.8373e-04 - mean\_absolute\_error: 0.0096


Epoch 410/1000  
2/2  0s 8ms/step - loss: 1.8328e-04 - mean\_absolute\_error: 0.0096


Epoch 411/1000  
2/2  0s 10ms/step - loss: 1.8347e-04 - mean\_absolute\_error: 0.0096


Epoch 412/1000  
2/2  0s 12ms/step - loss: 1.8330e-04 - mean\_absolute\_error: 0.0096


Epoch 413/1000  
2/2  0s 16ms/step - loss: 1.8273e-04 - mean\_absolute\_error: 0.0095


Epoch 414/1000  
2/2  0s 4ms/step - loss: 1.8273e-04 - mean\_absolute\_error: 0.0096


Epoch 415/1000  
2/2  0s 16ms/step - loss: 1.8250e-04 - mean\_absolute\_error: 0.0095


Epoch 416/1000  
2/2  0s 11ms/step - loss: 1.8227e-04 - mean\_absolute\_error: 0.0095


Epoch 417/1000  
2/2  0s 13ms/step - loss: 1.8192e-04 - mean\_absolute\_error: 0.0095


Epoch 418/1000  
2/2  0s 10ms/step - loss: 1.8166e-04 - mean\_absolute\_error: 0.0095


Epoch 419/1000  
2/2  0s 41ms/step - loss: 1.8160e-04 - mean\_absolute\_error: 0.0095


Epoch 420/1000  
2/2  0s 10ms/step - loss: 1.8161e-04 - mean\_absolute\_error: 0.0095


Epoch 421/1000  
2/2  0s 10ms/step - loss: 1.8102e-04 - mean\_absolute\_error: 0.0095


Epoch 422/1000  
2/2  0s 17ms/step - loss: 1.8084e-04 - mean\_absolute\_error: 0.0095


Epoch 423/1000  
2/2  0s 9ms/step - loss: 1.8095e-04 - mean\_absolute\_error: 0.0095


Epoch 424/1000  
2/2  0s 3ms/step - loss: 1.8062e-04 - mean\_absolute\_error: 0.0095


Epoch 425/1000  
2/2  0s 12ms/step - loss: 1.8007e-04 - mean\_absolute\_error: 0.0095


Epoch 426/1000  
2/2  0s 0s/step - loss: 1.7999e-04 - mean\_absolute\_error: 0.0095


Epoch 427/1000  
2/2  0s 10ms/step - loss: 1.8009e-04 - mean\_absolute\_error: 0.0095


Epoch 428/1000  
2/2  0s 9ms/step - loss: 1.7988e-04 - mean\_absolute\_error: 0.0095


Epoch 429/1000  
2/2  0s 12ms/step - loss: 1.7921e-04 - mean\_absolute\_error: 0.0094


Epoch 430/1000  
2/2  0s 11ms/step - loss: 1.7924e-04 - mean\_absolute\_error: 0.0095


Epoch 431/1000  
2/2  0s 10ms/step - loss: 1.7917e-04 - mean\_absolute\_error: 0.0095


Epoch 432/1000  
2/2  0s 11ms/step - loss: 1.7861e-04 - mean\_absolute\_error: 0.0094


Epoch 433/1000  
2/2  0s 12ms/step - loss: 1.7839e-04 - mean\_absolute\_error: 0.0094


Epoch 434/1000  
2/2  0s 43ms/step - loss: 1.7864e-04 - mean\_absolute\_error: 0.0094


Epoch 435/1000  
2/2  0s 7ms/step - loss: 1.7848e-04 - mean\_absolute\_error: 0.0094


Epoch 436/1000  
2/2  0s 9ms/step - loss: 1.7796e-04 - mean\_absolute\_error: 0.0094


Epoch 437/1000  
2/2  0s 10ms/step - loss: 1.7779e-04 - mean\_absolute\_error: 0.0094


Epoch 438/1000  
2/2  0s 18ms/step - loss: 1.7764e-04 - mean\_absolute\_error: 0.0094


Epoch 439/1000  
2/2  0s 8ms/step - loss: 1.7720e-04 - mean\_absolute\_error: 0.0094


Epoch 440/1000  
2/2  0s 6ms/step - loss: 1.7693e-04 - mean\_absolute\_error: 0.0094


Epoch 441/1000  
2/2  0s 8ms/step - loss: 1.7715e-04 - mean\_absolute\_error: 0.0094


Epoch 442/1000  
2/2  0s 9ms/step - loss: 1.7674e-04 - mean\_absolute\_error: 0.0094


Epoch 443/1000  
2/2  0s 17ms/step - loss: 1.7642e-04 - mean\_absolute\_error: 0.0094


Epoch 444/1000  
2/2  0s 10ms/step - loss: 1.7643e-04 - mean\_absolute\_error: 0.0094


Epoch 445/1000  
2/2  0s 13ms/step - loss: 1.7621e-04 - mean\_absolute\_error: 0.0094


Epoch 446/1000  
2/2  0s 9ms/step - loss: 1.7573e-04 - mean\_absolute\_error: 0.0093


Epoch 447/1000  
2/2  0s 10ms/step - loss: 1.7564e-04 - mean\_absolute\_error: 0.0094


Epoch 448/1000  
2/2  0s 6ms/step - loss: 1.7574e-04 - mean\_absolute\_error: 0.0094


Epoch 449/1000  
2/2  0s 14ms/step - loss: 1.7559e-04 - mean\_absolute\_error: 0.0094


Epoch 450/1000  
2/2  0s 12ms/step - loss: 1.7497e-04 - mean\_absolute\_error: 0.0093


Epoch 451/1000  
2/2  0s 9ms/step - loss: 1.7482e-04 - mean\_absolute\_error: 0.0093


Epoch 452/1000  
2/2  0s 26ms/step - loss: 1.7474e-04 - mean\_absolute\_error: 0.0093


Epoch 453/1000  
2/2  0s 7ms/step - loss: 1.7450e-04 - mean\_absolute\_error: 0.0093


Epoch 454/1000  
2/2  0s 12ms/step - loss: 1.7426e-04 - mean\_absolute\_error: 0.0093


Epoch 455/1000  
2/2  0s 0s/step - loss: 1.7437e-04 - mean\_absolute\_error: 0.0093


Epoch 456/1000  
2/2  0s 10ms/step - loss: 1.7423e-04 - mean\_absolute\_error: 0.0093


Epoch 457/1000  
2/2  0s 10ms/step - loss: 1.7372e-04 - mean\_absolute\_error: 0.0093


Epoch 458/1000  
2/2  0s 7ms/step - loss: 1.7342e-04 - mean\_absolute\_error: 0.0093


Epoch 459/1000  
2/2  0s 9ms/step - loss: 1.7357e-04 - mean\_absolute\_error: 0.0093


Epoch 460/1000  
2/2  0s 8ms/step - loss: 1.7345e-04 - mean\_absolute\_error: 0.0093


Epoch 461/1000  
2/2  0s 10ms/step - loss: 1.7274e-04 - mean\_absolute\_error: 0.0093


Epoch 462/1000  
2/2  0s 13ms/step - loss: 1.7286e-04 - mean\_absolute\_error: 0.0093


Epoch 463/1000  
2/2  0s 10ms/step - loss: 1.7292e-04 - mean\_absolute\_error: 0.0093


Epoch 464/1000  
2/2  0s 11ms/step - loss: 1.7243e-04 - mean\_absolute\_error: 0.0093


Epoch 465/1000  
2/2  0s 13ms/step - loss: 1.7234e-04 - mean\_absolute\_error: 0.0093


Epoch 466/1000  
2/2  0s 4ms/step - loss: 1.7243e-04 - mean\_absolute\_error: 0.0093


Epoch 467/1000  
2/2  0s 8ms/step - loss: 1.7212e-04 - mean\_absolute\_error: 0.0092


Epoch 468/1000  
2/2  0s 15ms/step - loss: 1.7185e-04 - mean\_absolute\_error: 0.0092


Epoch 469/1000  
2/2  0s 7ms/step - loss: 1.7189e-04 - mean\_absolute\_error: 0.0092


Epoch 470/1000  
2/2  0s 8ms/step - loss: 1.7168e-04 - mean\_absolute\_error: 0.0092


Epoch 471/1000  
2/2  0s 7ms/step - loss: 1.7125e-04 - mean\_absolute\_error: 0.0092


Epoch 472/1000  
2/2  0s 8ms/step - loss: 1.7114e-04 - mean\_absolute\_error: 0.0092


Epoch 473/1000  
2/2  0s 11ms/step - loss: 1.7125e-04 - mean\_absolute\_error: 0.0092


Epoch 474/1000  
2/2  0s 10ms/step - loss: 1.7114e-04 - mean\_absolute\_error: 0.0092


Epoch 475/1000  
2/2  0s 11ms/step - loss: 1.7067e-04 - mean\_absolute\_error: 0.0092


Epoch 476/1000  
2/2  0s 7ms/step - loss: 1.7058e-04 - mean\_absolute\_error: 0.0092


Epoch 477/1000  
2/2  0s 10ms/step - loss: 1.7039e-04 - mean\_absolute\_error: 0.0092


Epoch 478/1000  
2/2  0s 8ms/step - loss: 1.7016e-04 - mean\_absolute\_error: 0.0092


Epoch 479/1000  
2/2  0s 11ms/step - loss: 1.7022e-04 - mean\_absolute\_error: 0.0092


Epoch 480/1000  
2/2  0s 12ms/step - loss: 1.7026e-04 - mean\_absolute\_error: 0.0092


Epoch 481/1000  
2/2  0s 7ms/step - loss: 1.6985e-04 - mean\_absolute\_error: 0.0092


Epoch 482/1000  
2/2  0s 9ms/step - loss: 1.6945e-04 - mean\_absolute\_error: 0.0092


Epoch 483/1000  
2/2  0s 0s/step - loss: 1.6940e-04 - mean\_absolute\_error: 0.0092


Epoch 484/1000  
2/2  0s 40ms/step - loss: 1.6928e-04 - mean\_absolute\_error: 0.0092


Epoch 485/1000  
2/2  0s 8ms/step - loss: 1.6919e-04 - mean\_absolute\_error: 0.0092


Epoch 486/1000  
2/2  0s 10ms/step - loss: 1.6912e-04 - mean\_absolute\_error: 0.0092


Epoch 487/1000  
2/2  0s 7ms/step - loss: 1.6876e-04 - mean\_absolute\_error: 0.0091


Epoch 488/1000  
2/2  0s 14ms/step - loss: 1.6835e-04 - mean\_absolute\_error: 0.0091


Epoch 489/1000  
2/2  0s 7ms/step - loss: 1.6829e-04 - mean\_absolute\_error: 0.0091


Epoch 490/1000  
2/2  0s 10ms/step - loss: 1.6851e-04 - mean\_absolute\_error: 0.0091


Epoch 491/1000  
2/2  0s 12ms/step - loss: 1.6816e-04 - mean\_absolute\_error: 0.0091


Epoch 492/1000  
2/2  0s 5ms/step - loss: 1.6770e-04 - mean\_absolute\_error: 0.0091


Epoch 493/1000  
2/2  0s 20ms/step - loss: 1.6773e-04 - mean\_absolute\_error: 0.0091


Epoch 494/1000  
2/2  0s 18ms/step - loss: 1.6767e-04 - mean\_absolute\_error: 0.0091


Epoch 495/1000  
2/2  0s 13ms/step - loss: 1.6735e-04 - mean\_absolute\_error: 0.0091


Epoch 496/1000  
2/2  0s 9ms/step - loss: 1.6749e-04 - mean\_absolute\_error: 0.0091


Epoch 497/1000  
2/2  0s 15ms/step - loss: 1.6745e-04 - mean\_absolute\_error: 0.0091


Epoch 498/1000  
2/2  0s 9ms/step - loss: 1.6699e-04 - mean\_absolute\_error: 0.0091


Epoch 499/1000  
2/2  0s 10ms/step - loss: 1.6685e-04 - mean\_absolute\_error: 0.0091


Epoch 500/1000  
2/2  0s 14ms/step - loss: 1.6679e-04 - mean\_absolute\_error: 0.0091


Epoch 501/1000  
2/2  0s 10ms/step - loss: 1.6657e-04 - mean\_absolute\_error: 0.0091


Epoch 502/1000  
2/2  0s 4ms/step - loss: 1.6648e-04 - mean\_absolute\_error: 0.0091


Epoch 503/1000  
2/2  0s 19ms/step - loss: 1.6624e-04 - mean\_absolute\_error: 0.0091


Epoch 504/1000  
2/2  0s 13ms/step - loss: 1.6595e-04 - mean\_absolute\_error: 0.0091


Epoch 505/1000  
2/2  0s 8ms/step - loss: 1.6597e-04 - mean\_absolute\_error: 0.0091


Epoch 506/1000  
2/2  0s 10ms/step - loss: 1.6585e-04 - mean\_absolute\_error: 0.0091


Epoch 507/1000  
2/2  0s 10ms/step - loss: 1.6561e-04 - mean\_absolute\_error: 0.0090


Epoch 508/1000  
2/2  0s 14ms/step - loss: 1.6564e-04 - mean\_absolute\_error: 0.0091


Epoch 509/1000  
2/2  0s 8ms/step - loss: 1.6545e-04 - mean\_absolute\_error: 0.0090


Epoch 510/1000  
2/2  0s 13ms/step - loss: 1.6510e-04 - mean\_absolute\_error: 0.0090


Epoch 511/1000  
2/2  0s 15ms/step - loss: 1.6515e-04 - mean\_absolute\_error: 0.0090


Epoch 512/1000  
2/2  0s 5ms/step - loss: 1.6520e-04 - mean\_absolute\_error: 0.0090


Epoch 513/1000  
2/2  0s 13ms/step - loss: 1.6484e-04 - mean\_absolute\_error: 0.0090


Epoch 514/1000  
2/2  0s 12ms/step - loss: 1.6453e-04 - mean\_absolute\_error: 0.0090


Epoch 515/1000  
2/2  0s 13ms/step - loss: 1.6462e-04 - mean\_absolute\_error: 0.0090


Epoch 516/1000  
2/2  0s 7ms/step - loss: 1.6466e-04 - mean\_absolute\_error: 0.0090


Epoch 517/1000  
2/2  0s 7ms/step - loss: 1.6445e-04 - mean\_absolute\_error: 0.0090


Epoch 518/1000  
2/2  0s 10ms/step - loss: 1.6440e-04 - mean\_absolute\_error: 0.0090


Epoch 519/1000  
2/2  0s 9ms/step - loss: 1.6418e-04 - mean\_absolute\_error: 0.0090


Epoch 520/1000  
2/2  0s 8ms/step - loss: 1.6376e-04 - mean\_absolute\_error: 0.0090

Epoch 521/1000  
2/2  0s 10ms/step - loss: 1.6367e-04 - mean\_absolute\_error: 0.0090


Epoch 522/1000  
2/2  0s 13ms/step - loss: 1.6391e-04 - mean\_absolute\_error: 0.0090


Epoch 523/1000  
2/2  0s 15ms/step - loss: 1.6380e-04 - mean\_absolute\_error: 0.0090


Epoch 524/1000  
2/2  0s 8ms/step - loss: 1.6350e-04 - mean\_absolute\_error: 0.0090


Epoch 525/1000  
2/2  0s 8ms/step - loss: 1.6325e-04 - mean\_absolute\_error: 0.0090





Epoch 526/1000  
2/2  0s 9ms/step - loss: 1.6301e-04 - mean\_absolute\_error: 0.0090


Epoch 527/1000  
2/2  0s 7ms/step - loss: 1.6294e-04 - mean\_absolute\_error: 0.0090


Epoch 528/1000  
2/2  0s 15ms/step - loss: 1.6315e-04 - mean\_absolute\_error: 0.0090


Epoch 529/1000  
2/2  0s 12ms/step - loss: 1.6305e-04 - mean\_absolute\_error: 0.0090


Epoch 530/1000  
2/2  0s 13ms/step - loss: 1.6275e-04 - mean\_absolute\_error: 0.0090


Epoch 531/1000  
2/2  0s 8ms/step - loss: 1.6242e-04 - mean\_absolute\_error: 0.0089


Epoch 532/1000  
2/2  0s 13ms/step - loss: 1.6227e-04 - mean\_absolute\_error: 0.0089


Epoch 533/1000  
2/2  0s 9ms/step - loss: 1.6227e-04 - mean\_absolute\_error: 0.0089


Epoch 534/1000  
2/2  0s 13ms/step - loss: 1.6220e-04 - mean\_absolute\_error: 0.0089


Epoch 535/1000  
2/2  0s 14ms/step - loss: 1.6221e-04 - mean\_absolute\_error: 0.0089


Epoch 536/1000  
2/2  0s 10ms/step - loss: 1.6202e-04 - mean\_absolute\_error: 0.0089


Epoch 537/1000  
2/2  0s 14ms/step - loss: 1.6167e-04 - mean\_absolute\_error: 0.0089


Epoch 538/1000  
2/2  0s 11ms/step - loss: 1.6156e-04 - mean\_absolute\_error: 0.0089


Epoch 539/1000  
2/2  0s 9ms/step - loss: 1.6177e-04 - mean\_absolute\_error: 0.0089


Epoch 540/1000  
2/2  0s 3ms/step - loss: 1.6152e-04 - mean\_absolute\_error: 0.0089


Epoch 541/1000  
2/2  0s 12ms/step - loss: 1.6120e-04 - mean\_absolute\_error: 0.0089


Epoch 542/1000  
2/2  0s 6ms/step - loss: 1.6135e-04 - mean\_absolute\_error: 0.0089


Epoch 543/1000  
2/2  0s 11ms/step - loss: 1.6112e-04 - mean\_absolute\_error: 0.0089


Epoch 544/1000  
2/2  0s 10ms/step - loss: 1.6079e-04 - mean\_absolute\_error: 0.0089


Epoch 545/1000  
2/2  0s 40ms/step - loss: 1.6103e-04 - mean\_absolute\_error: 0.0089


Epoch 546/1000  
2/2  0s 8ms/step - loss: 1.6090e-04 - mean\_absolute\_error: 0.0089


Epoch 547/1000  
2/2  0s 9ms/step - loss: 1.6048e-04 - mean\_absolute\_error: 0.0089


Epoch 548/1000  
2/2  0s 6ms/step - loss: 1.6060e-04 - mean\_absolute\_error: 0.0089


Epoch 549/1000  
2/2  0s 12ms/step - loss: 1.6052e-04 - mean\_absolute\_error: 0.0089


Epoch 550/1000  
2/2  0s 9ms/step - loss: 1.6017e-04 - mean\_absolute\_error: 0.0089


Epoch 551/1000  
2/2  0s 15ms/step - loss: 1.6025e-04 - mean\_absolute\_error: 0.0089


Epoch 552/1000  
2/2  0s 10ms/step - loss: 1.6015e-04 - mean\_absolute\_error: 0.0089


Epoch 553/1000  
2/2  0s 6ms/step - loss: 1.5984e-04 - mean\_absolute\_error: 0.0089


Epoch 554/1000  
2/2  0s 3ms/step - loss: 1.5993e-04 - mean\_absolute\_error: 0.0089


Epoch 555/1000  
2/2  0s 12ms/step - loss: 1.5980e-04 - mean\_absolute\_error: 0.0089


Epoch 556/1000  
2/2  0s 8ms/step - loss: 1.5953e-04 - mean\_absolute\_error: 0.0088


Epoch 557/1000  
2/2  0s 19ms/step - loss: 1.5953e-04 - mean\_absolute\_error: 0.0089


Epoch 558/1000  
2/2  0s 14ms/step - loss: 1.5947e-04 - mean\_absolute\_error: 0.0089


Epoch 559/1000  
2/2  0s 53ms/step - loss: 1.5940e-04 - mean\_absolute\_error: 0.0088


Epoch 560/1000  
2/2  0s 46ms/step - loss: 1.5932e-04 - mean\_absolute\_error: 0.0088


Epoch 561/1000  
2/2  0s 5ms/step - loss: 1.5909e-04 - mean\_absolute\_error: 0.0088


Epoch 562/1000  
2/2  0s 12ms/step - loss: 1.5881e-04 - mean\_absolute\_error: 0.0088


Epoch 563/1000  
2/2  0s 7ms/step - loss: 1.5882e-04 - mean\_absolute\_error: 0.0088


Epoch 564/1000  
2/2  0s 9ms/step - loss: 1.5894e-04 - mean\_absolute\_error: 0.0088


Epoch 565/1000  
2/2  0s 9ms/step - loss: 1.5885e-04 - mean\_absolute\_error: 0.0088


Epoch 566/1000  
2/2  0s 8ms/step - loss: 1.5856e-04 - mean\_absolute\_error: 0.0088


Epoch 567/1000  
2/2  0s 3ms/step - loss: 1.5833e-04 - mean\_absolute\_error: 0.0088


Epoch 568/1000  
2/2  0s 8ms/step - loss: 1.5833e-04 - mean\_absolute\_error: 0.0088


Epoch 569/1000  
2/2  0s 19ms/step - loss: 1.5839e-04 - mean\_absolute\_error: 0.0088


Epoch 570/1000  
2/2  0s 9ms/step - loss: 1.5836e-04 - mean\_absolute\_error: 0.0088


Epoch 571/1000  
2/2  0s 13ms/step - loss: 1.5806e-04 - mean\_absolute\_error: 0.0088


Epoch 572/1000  
2/2  0s 9ms/step - loss: 1.5773e-04 - mean\_absolute\_error: 0.0088


Epoch 573/1000  
2/2  0s 16ms/step - loss: 1.5771e-04 - mean\_absolute\_error: 0.0088


Epoch 574/1000  
2/2  0s 9ms/step - loss: 1.5785e-04 - mean\_absolute\_error: 0.0088


Epoch 575/1000  
2/2  0s 10ms/step - loss: 1.5787e-04 - mean\_absolute\_error: 0.0088


Epoch 576/1000  
2/2  0s 9ms/step - loss: 1.5752e-04 - mean\_absolute\_error: 0.0088


Epoch 577/1000  
2/2  0s 12ms/step - loss: 1.5721e-04 - mean\_absolute\_error: 0.0088


Epoch 578/1000  
2/2  0s 19ms/step - loss: 1.5719e-04 - mean\_absolute\_error: 0.0088


Epoch 579/1000  
2/2  0s 13ms/step - loss: 1.5732e-04 - mean\_absolute\_error: 0.0088


Epoch 580/1000  
2/2  0s 12ms/step - loss: 1.5735e-04 - mean\_absolute\_error: 0.0088


Epoch 581/1000  
2/2  0s 6ms/step - loss: 1.5700e-04 - mean\_absolute\_error: 0.0088


Epoch 582/1000  
2/2  0s 10ms/step - loss: 1.5671e-04 - mean\_absolute\_error: 0.0087


Epoch 583/1000  
2/2  0s 15ms/step - loss: 1.5671e-04 - mean\_absolute\_error: 0.0087


Epoch 584/1000  
2/2  0s 12ms/step - loss: 1.5690e-04 - mean\_absolute\_error: 0.0088


Epoch 585/1000  
2/2  0s 15ms/step - loss: 1.5687e-04 - mean\_absolute\_error: 0.0087


Epoch 586/1000  
2/2  0s 6ms/step - loss: 1.5651e-04 - mean\_absolute\_error: 0.0087


Epoch 587/1000  
2/2  0s 13ms/step - loss: 1.5624e-04 - mean\_absolute\_error: 0.0087


Epoch 588/1000  
2/2  0s 13ms/step - loss: 1.5620e-04 - mean\_absolute\_error: 0.0087


Epoch 589/1000  
2/2  0s 22ms/step - loss: 1.5635e-04 - mean\_absolute\_error: 0.0087


Epoch 590/1000  
2/2  0s 9ms/step - loss: 1.5640e-04 - mean\_absolute\_error: 0.0087


Epoch 591/1000  
2/2  0s 9ms/step - loss: 1.5602e-04 - mean\_absolute\_error: 0.0087


Epoch 592/1000  
2/2  0s 0s/step - loss: 1.5572e-04 - mean\_absolute\_error: 0.0087


Epoch 593/1000  
2/2  0s 10ms/step - loss: 1.5575e-04 - mean\_absolute\_error: 0.0087


Epoch 594/1000  
2/2  0s 17ms/step - loss: 1.5591e-04 - mean\_absolute\_error: 0.0087


Epoch 595/1000  
2/2  0s 11ms/step - loss: 1.5591e-04 - mean\_absolute\_error: 0.0087


Epoch 596/1000  
2/2  0s 10ms/step - loss: 1.5556e-04 - mean\_absolute\_error: 0.0087


Epoch 597/1000  
2/2  0s 9ms/step - loss: 1.5525e-04 - mean\_absolute\_error: 0.0087


Epoch 598/1000  
2/2  0s 15ms/step - loss: 1.5524e-04 - mean\_absolute\_error: 0.0087


Epoch 599/1000  
2/2  0s 14ms/step - loss: 1.5545e-04 - mean\_absolute\_error: 0.0087


Epoch 600/1000  
2/2  0s 0s/step - loss: 1.5545e-04 - mean\_absolute\_error: 0.0087


Epoch 601/1000  
2/2  0s 12ms/step - loss: 1.5504e-04 - mean\_absolute\_error: 0.0087


Epoch 602/1000  
2/2  0s 9ms/step - loss: 1.5475e-04 - mean\_absolute\_error: 0.0087


Epoch 603/1000  
2/2  0s 7ms/step - loss: 1.5470e-04 - mean\_absolute\_error: 0.0087


Epoch 604/1000  
2/2  0s 10ms/step - loss: 1.5487e-04 - mean\_absolute\_error: 0.0087


Epoch 605/1000  
2/2  0s 12ms/step - loss: 1.5489e-04 - mean\_absolute\_error: 0.0087


Epoch 606/1000  
2/2  0s 12ms/step - loss: 1.5451e-04 - mean\_absolute\_error: 0.0087


Epoch 607/1000  
2/2  0s 0s/step - loss: 1.5421e-04 - mean\_absolute\_error: 0.0086


Epoch 608/1000  
2/2  0s 3ms/step - loss: 1.5425e-04 - mean\_absolute\_error: 0.0086


Epoch 609/1000  
2/2  0s 10ms/step - loss: 1.5443e-04 - mean\_absolute\_error: 0.0087


Epoch 610/1000  
2/2  0s 14ms/step - loss: 1.5446e-04 - mean\_absolute\_error: 0.0087


Epoch 611/1000  
2/2  0s 11ms/step - loss: 1.5411e-04 - mean\_absolute\_error: 0.0086


Epoch 612/1000  
2/2  0s 9ms/step - loss: 1.5378e-04 - mean\_absolute\_error: 0.0086


Epoch 613/1000  
2/2  0s 10ms/step - loss: 1.5380e-04 - mean\_absolute\_error: 0.0086


Epoch 614/1000  
2/2  0s 8ms/step - loss: 1.5401e-04 - mean\_absolute\_error: 0.0086


Epoch 615/1000  
2/2  0s 21ms/step - loss: 1.5382e-04 - mean\_absolute\_error: 0.0086


Epoch 616/1000  
2/2  0s 12ms/step - loss: 1.5354e-04 - mean\_absolute\_error: 0.0086


Epoch 617/1000  
2/2  0s 9ms/step - loss: 1.5365e-04 - mean\_absolute\_error: 0.0086


Epoch 618/1000  
2/2  0s 44ms/step - loss: 1.5336e-04 - mean\_absolute\_error: 0.0086


Epoch 619/1000  
2/2  0s 11ms/step - loss: 1.5318e-04 - mean\_absolute\_error: 0.0086


Epoch 620/1000  
2/2  0s 0s/step - loss: 1.5348e-04 - mean\_absolute\_error: 0.0086


Epoch 621/1000  
2/2  0s 11ms/step - loss: 1.5336e-04 - mean\_absolute\_error: 0.0086


Epoch 622/1000  
2/2  0s 4ms/step - loss: 1.5303e-04 - mean\_absolute\_error: 0.0086


Epoch 623/1000  
2/2  0s 11ms/step - loss: 1.5303e-04 - mean\_absolute\_error: 0.0086


Epoch 624/1000  
2/2  0s 10ms/step - loss: 1.5292e-04 - mean\_absolute\_error: 0.0086


Epoch 625/1000  
2/2  0s 12ms/step - loss: 1.5281e-04 - mean\_absolute\_error: 0.0086


Epoch 626/1000  
2/2  0s 10ms/step - loss: 1.5295e-04 - mean\_absolute\_error: 0.0086


Epoch 627/1000  
2/2  0s 0s/step - loss: 1.5273e-04 - mean\_absolute\_error: 0.0086


Epoch 628/1000  
2/2  0s 10ms/step - loss: 1.5250e-04 - mean\_absolute\_error: 0.0086


Epoch 629/1000  
2/2  0s 50ms/step - loss: 1.5266e-04 - mean\_absolute\_error: 0.0086


Epoch 630/1000  
2/2  0s 10ms/step - loss: 1.5277e-04 - mean\_absolute\_error: 0.0086


Epoch 631/1000  
2/2  0s 20ms/step - loss: 1.5260e-04 - mean\_absolute\_error: 0.0086


Epoch 632/1000  
2/2  0s 11ms/step - loss: 1.5236e-04 - mean\_absolute\_error: 0.0086


Epoch 633/1000  
2/2  0s 0s/step - loss: 1.5208e-04 - mean\_absolute\_error: 0.0086


Epoch 634/1000  
2/2  0s 8ms/step - loss: 1.5205e-04 - mean\_absolute\_error: 0.0086


Epoch 635/1000  
2/2  0s 7ms/step - loss: 1.5230e-04 - mean\_absolute\_error: 0.0086


Epoch 636/1000  
2/2  0s 7ms/step - loss: 1.5210e-04 - mean\_absolute\_error: 0.0086


Epoch 637/1000  
2/2  0s 16ms/step - loss: 1.5179e-04 - mean\_absolute\_error: 0.0085


Epoch 638/1000  
2/2  0s 10ms/step - loss: 1.5192e-04 - mean\_absolute\_error: 0.0086


Epoch 639/1000  
2/2  0s 4ms/step - loss: 1.5201e-04 - mean\_absolute\_error: 0.0086


Epoch 640/1000  
2/2  0s 24ms/step - loss: 1.5175e-04 - mean\_absolute\_error: 0.0085


Epoch 641/1000  
2/2  0s 3ms/step - loss: 1.5160e-04 - mean\_absolute\_error: 0.0085


Epoch 642/1000  
2/2  0s 2ms/step - loss: 1.5172e-04 - mean\_absolute\_error: 0.0086


Epoch 643/1000  
2/2  0s 9ms/step - loss: 1.5154e-04 - mean\_absolute\_error: 0.0085


Epoch 644/1000  
2/2  0s 8ms/step - loss: 1.5134e-04 - mean\_absolute\_error: 0.0085


Epoch 645/1000  
2/2  0s 10ms/step - loss: 1.5136e-04 - mean\_absolute\_error: 0.0085


Epoch 646/1000  
2/2  0s 10ms/step - loss: 1.5139e-04 - mean\_absolute\_error: 0.0085


Epoch 647/1000  
2/2  0s 2ms/step - loss: 1.5131e-04 - mean\_absolute\_error: 0.0085


Epoch 648/1000  
2/2  0s 10ms/step - loss: 1.5117e-04 - mean\_absolute\_error: 0.0085


Epoch 649/1000  
2/2  0s 8ms/step - loss: 1.5106e-04 - mean\_absolute\_error: 0.0085


Epoch 650/1000  
2/2  0s 10ms/step - loss: 1.5107e-04 - mean\_absolute\_error: 0.0085


Epoch 651/1000  
2/2  0s 8ms/step - loss: 1.5103e-04 - mean\_absolute\_error: 0.0085


Epoch 652/1000  
2/2  0s 3ms/step - loss: 1.5085e-04 - mean\_absolute\_error: 0.0085


Epoch 653/1000  
2/2  0s 6ms/step - loss: 1.5071e-04 - mean\_absolute\_error: 0.0085


Epoch 654/1000  
2/2  0s 62ms/step - loss: 1.5079e-04 - mean\_absolute\_error: 0.0085


Epoch 655/1000  
2/2  0s 10ms/step - loss: 1.5083e-04 - mean\_absolute\_error: 0.0085


Epoch 656/1000  
2/2  0s 7ms/step - loss: 1.5063e-04 - mean\_absolute\_error: 0.0085


Epoch 657/1000  
2/2  0s 8ms/step - loss: 1.5045e-04 - mean\_absolute\_error: 0.0085


Epoch 658/1000  
2/2  0s 11ms/step - loss: 1.5055e-04 - mean\_absolute\_error: 0.0085


Epoch 659/1000  
2/2  0s 10ms/step - loss: 1.5050e-04 - mean\_absolute\_error: 0.0085


Epoch 660/1000  
2/2  0s 7ms/step - loss: 1.5029e-04 - mean\_absolute\_error: 0.0085


Epoch 661/1000  
2/2  0s 13ms/step - loss: 1.5016e-04 - mean\_absolute\_error: 0.0085


Epoch 662/1000  
2/2  0s 7ms/step - loss: 1.5024e-04 - mean\_absolute\_error: 0.0085


Epoch 663/1000  
2/2  0s 15ms/step - loss: 1.5026e-04 - mean\_absolute\_error: 0.0085


Epoch 664/1000  
2/2  0s 7ms/step - loss: 1.5003e-04 - mean\_absolute\_error: 0.0085


Epoch 665/1000  
2/2  0s 14ms/step - loss: 1.4987e-04 - mean\_absolute\_error: 0.0085


Epoch 666/1000  
2/2  0s 10ms/step - loss: 1.4996e-04 - mean\_absolute\_error: 0.0085


Epoch 667/1000  
2/2  0s 7ms/step - loss: 1.4981e-04 - mean\_absolute\_error: 0.0085


Epoch 668/1000  
2/2  0s 6ms/step - loss: 1.4971e-04 - mean\_absolute\_error: 0.0085


Epoch 669/1000  
2/2  0s 20ms/step - loss: 1.4999e-04 - mean\_absolute\_error: 0.0085


Epoch 670/1000  
2/2  0s 8ms/step - loss: 1.4959e-04 - mean\_absolute\_error: 0.0084


Epoch 671/1000  
2/2  0s 8ms/step - loss: 1.4920e-04 - mean\_absolute\_error: 0.0084


Epoch 672/1000  
2/2  0s 17ms/step - loss: 1.4952e-04 - mean\_absolute\_error: 0.0085


Epoch 673/1000  
2/2  0s 18ms/step - loss: 1.4959e-04 - mean\_absolute\_error: 0.0085


Epoch 674/1000  
2/2  0s 9ms/step - loss: 1.4941e-04 - mean\_absolute\_error: 0.0084


Epoch 675/1000  
2/2  0s 9ms/step - loss: 1.4926e-04 - mean\_absolute\_error: 0.0084


Epoch 676/1000  
2/2  0s 9ms/step - loss: 1.4910e-04 - mean\_absolute\_error: 0.0084


Epoch 677/1000  
2/2  0s 7ms/step - loss: 1.4908e-04 - mean\_absolute\_error: 0.0084


Epoch 678/1000  
2/2  0s 9ms/step - loss: 1.4927e-04 - mean\_absolute\_error: 0.0084


Epoch 679/1000  
2/2  0s 12ms/step - loss: 1.4893e-04 - mean\_absolute\_error: 0.0084


Epoch 680/1000  
2/2  0s 9ms/step - loss: 1.4860e-04 - mean\_absolute\_error: 0.0084

Epoch 681/1000  
2/2  0s 9ms/step - loss: 1.4877e-04 - mean\_absolute\_error: 0.0084


Epoch 682/1000  
2/2  0s 9ms/step - loss: 1.4882e-04 - mean\_absolute\_error: 0.0084


Epoch 683/1000  
2/2  0s 28ms/step - loss: 1.4888e-04 - mean\_absolute\_error: 0.0084


Epoch 684/1000  
2/2  0s 10ms/step - loss: 1.4889e-04 - mean\_absolute\_error: 0.0084


Epoch 685/1000  
2/2  0s 10ms/step - loss: 1.4851e-04 - mean\_absolute\_error: 0.0084





Epoch 686/1000  
2/2  0s 14ms/step - loss: 1.4819e-04 - mean\_absolute\_error: 0.0084


Epoch 687/1000  
2/2  0s 8ms/step - loss: 1.4827e-04 - mean\_absolute\_error: 0.0084


Epoch 688/1000  
2/2  0s 19ms/step - loss: 1.4845e-04 - mean\_absolute\_error: 0.0084


Epoch 689/1000  
2/2  0s 10ms/step - loss: 1.4849e-04 - mean\_absolute\_error: 0.0084


Epoch 690/1000  
2/2  0s 15ms/step - loss: 1.4844e-04 - mean\_absolute\_error: 0.0084


Epoch 691/1000  
2/2  0s 17ms/step - loss: 1.4823e-04 - mean\_absolute\_error: 0.0084


Epoch 692/1000  
2/2  0s 11ms/step - loss: 1.4803e-04 - mean\_absolute\_error: 0.0084


Epoch 693/1000  
2/2  0s 10ms/step - loss: 1.4787e-04 - mean\_absolute\_error: 0.0084


Epoch 694/1000  
2/2  0s 10ms/step - loss: 1.4772e-04 - mean\_absolute\_error: 0.0084


Epoch 695/1000  
2/2  0s 11ms/step - loss: 1.4774e-04 - mean\_absolute\_error: 0.0084


Epoch 696/1000  
2/2  0s 15ms/step - loss: 1.4790e-04 - mean\_absolute\_error: 0.0084


Epoch 697/1000  
2/2  0s 13ms/step - loss: 1.4760e-04 - mean\_absolute\_error: 0.0084


Epoch 698/1000  
2/2  0s 18ms/step - loss: 1.4737e-04 - mean\_absolute\_error: 0.0084


Epoch 699/1000  
2/2  0s 79ms/step - loss: 1.4759e-04 - mean\_absolute\_error: 0.0084


Epoch 700/1000  
2/2  0s 50ms/step - loss: 1.4772e-04 - mean\_absolute\_error: 0.0084


Epoch 701/1000  
2/2  0s 9ms/step - loss: 1.4771e-04 - mean\_absolute\_error: 0.0084


Epoch 702/1000  
2/2  0s 6ms/step - loss: 1.4733e-04 - mean\_absolute\_error: 0.0084


Epoch 703/1000  
2/2  0s 0s/step - loss: 1.4701e-04 - mean\_absolute\_error: 0.0083


Epoch 704/1000  
2/2  0s 9ms/step - loss: 1.4714e-04 - mean\_absolute\_error: 0.0084


Epoch 705/1000  
2/2  0s 10ms/step - loss: 1.4713e-04 - mean\_absolute\_error: 0.0084


Epoch 706/1000  
2/2  0s 10ms/step - loss: 1.4691e-04 - mean\_absolute\_error: 0.0083


Epoch 707/1000  
2/2  0s 11ms/step - loss: 1.4711e-04 - mean\_absolute\_error: 0.0084


Epoch 708/1000  
2/2  0s 11ms/step - loss: 1.4714e-04 - mean\_absolute\_error: 0.0083


Epoch 709/1000  
2/2  0s 17ms/step - loss: 1.4674e-04 - mean\_absolute\_error: 0.0083


Epoch 710/1000  
2/2  0s 9ms/step - loss: 1.4664e-04 - mean\_absolute\_error: 0.0083


Epoch 711/1000  
2/2  0s 8ms/step - loss: 1.4675e-04 - mean\_absolute\_error: 0.0083


Epoch 712/1000  
2/2  0s 7ms/step - loss: 1.4658e-04 - mean\_absolute\_error: 0.0083


Epoch 713/1000  
2/2  0s 12ms/step - loss: 1.4671e-04 - mean\_absolute\_error: 0.0083


Epoch 714/1000  
2/2  0s 14ms/step - loss: 1.4654e-04 - mean\_absolute\_error: 0.0083


Epoch 715/1000  
2/2  0s 9ms/step - loss: 1.4611e-04 - mean\_absolute\_error: 0.0083


Epoch 716/1000  
2/2  0s 10ms/step - loss: 1.4630e-04 - mean\_absolute\_error: 0.0083


Epoch 717/1000  
2/2  0s 45ms/step - loss: 1.4651e-04 - mean\_absolute\_error: 0.0083


Epoch 718/1000  
2/2  0s 12ms/step - loss: 1.4645e-04 - mean\_absolute\_error: 0.0083


Epoch 719/1000  
2/2  0s 9ms/step - loss: 1.4606e-04 - mean\_absolute\_error: 0.0083


Epoch 720/1000  
2/2  0s 8ms/step - loss: 1.4583e-04 - mean\_absolute\_error: 0.0083


Epoch 721/1000  
2/2  0s 9ms/step - loss: 1.4592e-04 - mean\_absolute\_error: 0.0083


Epoch 722/1000  
2/2  0s 12ms/step - loss: 1.4607e-04 - mean\_absolute\_error: 0.0083


Epoch 723/1000  
2/2  0s 0s/step - loss: 1.4618e-04 - mean\_absolute\_error: 0.0083


Epoch 724/1000  
2/2  0s 12ms/step - loss: 1.4573e-04 - mean\_absolute\_error: 0.0083


Epoch 725/1000  
2/2  0s 9ms/step - loss: 1.4546e-04 - mean\_absolute\_error: 0.0083


Epoch 726/1000  
2/2  0s 11ms/step - loss: 1.4565e-04 - mean\_absolute\_error: 0.0083


Epoch 727/1000  
2/2  0s 14ms/step - loss: 1.4583e-04 - mean\_absolute\_error: 0.0083


Epoch 728/1000  
2/2  0s 8ms/step - loss: 1.4581e-04 - mean\_absolute\_error: 0.0083


Epoch 729/1000  
2/2  0s 12ms/step - loss: 1.4540e-04 - mean\_absolute\_error: 0.0083


Epoch 730/1000  
2/2  0s 8ms/step - loss: 1.4511e-04 - mean\_absolute\_error: 0.0083


Epoch 731/1000  
2/2  0s 13ms/step - loss: 1.4531e-04 - mean\_absolute\_error: 0.0083


Epoch 732/1000  
2/2  0s 6ms/step - loss: 1.4549e-04 - mean\_absolute\_error: 0.0083


Epoch 733/1000  
2/2  0s 8ms/step - loss: 1.4547e-04 - mean\_absolute\_error: 0.0083


Epoch 734/1000  
2/2  0s 12ms/step - loss: 1.4505e-04 - mean\_absolute\_error: 0.0082


Epoch 735/1000  
2/2  0s 12ms/step - loss: 1.4483e-04 - mean\_absolute\_error: 0.0082


Epoch 736/1000  
2/2  0s 21ms/step - loss: 1.4497e-04 - mean\_absolute\_error: 0.0083


Epoch 737/1000  
2/2  0s 11ms/step - loss: 1.4518e-04 - mean\_absolute\_error: 0.0083


Epoch 738/1000  
2/2  0s 15ms/step - loss: 1.4506e-04 - mean\_absolute\_error: 0.0083


Epoch 739/1000  
2/2  0s 5ms/step - loss: 1.4486e-04 - mean\_absolute\_error: 0.0082


Epoch 740/1000  
2/2  0s 8ms/step - loss: 1.4477e-04 - mean\_absolute\_error: 0.0082


Epoch 741/1000  
2/2  0s 10ms/step - loss: 1.4454e-04 - mean\_absolute\_error: 0.0082


Epoch 742/1000  
2/2  0s 9ms/step - loss: 1.4480e-04 - mean\_absolute\_error: 0.0082


Epoch 743/1000  
2/2  0s 7ms/step - loss: 1.4471e-04 - mean\_absolute\_error: 0.0082


Epoch 744/1000  
2/2  0s 11ms/step - loss: 1.4426e-04 - mean\_absolute\_error: 0.0082


Epoch 745/1000  
2/2  0s 13ms/step - loss: 1.4462e-04 - mean\_absolute\_error: 0.0082


Epoch 746/1000  
2/2  0s 5ms/step - loss: 1.4461e-04 - mean\_absolute\_error: 0.0082


Epoch 747/1000  
2/2  0s 14ms/step - loss: 1.4415e-04 - mean\_absolute\_error: 0.0082


Epoch 748/1000  
2/2  0s 4ms/step - loss: 1.4454e-04 - mean\_absolute\_error: 0.0082


Epoch 749/1000  
2/2  0s 15ms/step - loss: 1.4440e-04 - mean\_absolute\_error: 0.0082


Epoch 750/1000  
2/2  0s 9ms/step - loss: 1.4390e-04 - mean\_absolute\_error: 0.0082


Epoch 751/1000  
2/2  0s 4ms/step - loss: 1.4441e-04 - mean\_absolute\_error: 0.0082


Epoch 752/1000  
2/2  0s 7ms/step - loss: 1.4425e-04 - mean\_absolute\_error: 0.0082


Epoch 753/1000  
2/2  0s 13ms/step - loss: 1.4366e-04 - mean\_absolute\_error: 0.0082


Epoch 754/1000  
2/2  0s 13ms/step - loss: 1.4427e-04 - mean\_absolute\_error: 0.0082


Epoch 755/1000  
2/2  0s 3ms/step - loss: 1.4410e-04 - mean\_absolute\_error: 0.0082


Epoch 756/1000  
2/2  0s 3ms/step - loss: 1.4344e-04 - mean\_absolute\_error: 0.0082


Epoch 757/1000  
2/2  0s 10ms/step - loss: 1.4406e-04 - mean\_absolute\_error: 0.0082


Epoch 758/1000  
2/2  0s 12ms/step - loss: 1.4391e-04 - mean\_absolute\_error: 0.0082


Epoch 759/1000  
2/2  0s 10ms/step - loss: 1.4324e-04 - mean\_absolute\_error: 0.0082


Epoch 760/1000  
2/2  0s 15ms/step - loss: 1.4385e-04 - mean\_absolute\_error: 0.0082


Epoch 761/1000  
2/2  0s 10ms/step - loss: 1.4385e-04 - mean\_absolute\_error: 0.0082


Epoch 762/1000  
2/2  0s 15ms/step - loss: 1.4350e-04 - mean\_absolute\_error: 0.0082


Epoch 763/1000  
2/2  0s 12ms/step - loss: 1.4359e-04 - mean\_absolute\_error: 0.0082


Epoch 764/1000  
2/2  0s 13ms/step - loss: 1.4333e-04 - mean\_absolute\_error: 0.0082


Epoch 765/1000  
2/2  0s 10ms/step - loss: 1.4305e-04 - mean\_absolute\_error: 0.0082


Epoch 766/1000  
2/2  0s 21ms/step - loss: 1.4334e-04 - mean\_absolute\_error: 0.0082


Epoch 767/1000  
2/2  0s 11ms/step - loss: 1.4352e-04 - mean\_absolute\_error: 0.0082


Epoch 768/1000  
2/2  0s 18ms/step - loss: 1.4339e-04 - mean\_absolute\_error: 0.0082


Epoch 769/1000  
2/2  0s 5ms/step - loss: 1.4311e-04 - mean\_absolute\_error: 0.0082


Epoch 770/1000  
2/2  0s 13ms/step - loss: 1.4297e-04 - mean\_absolute\_error: 0.0082


Epoch 771/1000  
2/2  0s 9ms/step - loss: 1.4294e-04 - mean\_absolute\_error: 0.0082


Epoch 772/1000  
2/2  0s 57ms/step - loss: 1.4296e-04 - mean\_absolute\_error: 0.0082


Epoch 773/1000  
2/2  0s 7ms/step - loss: 1.4310e-04 - mean\_absolute\_error: 0.0082


Epoch 774/1000  
2/2  0s 39ms/step - loss: 1.4307e-04 - mean\_absolute\_error: 0.0082


Epoch 775/1000  
2/2  0s 9ms/step - loss: 1.4261e-04 - mean\_absolute\_error: 0.0082


Epoch 776/1000  
2/2  0s 13ms/step - loss: 1.4252e-04 - mean\_absolute\_error: 0.0082


Epoch 777/1000  
2/2  0s 8ms/step - loss: 1.4264e-04 - mean\_absolute\_error: 0.0082


Epoch 778/1000  
2/2  0s 14ms/step - loss: 1.4254e-04 - mean\_absolute\_error: 0.0082


Epoch 779/1000  
2/2  0s 10ms/step - loss: 1.4264e-04 - mean\_absolute\_error: 0.0082


Epoch 780/1000  
2/2  0s 15ms/step - loss: 1.4274e-04 - mean\_absolute\_error: 0.0082


Epoch 781/1000  
2/2  0s 10ms/step - loss: 1.4224e-04 - mean\_absolute\_error: 0.0081


Epoch 782/1000  
2/2  0s 12ms/step - loss: 1.4215e-04 - mean\_absolute\_error: 0.0081


Epoch 783/1000  
2/2  0s 10ms/step - loss: 1.4226e-04 - mean\_absolute\_error: 0.0082


Epoch 784/1000  
2/2  0s 19ms/step - loss: 1.4206e-04 - mean\_absolute\_error: 0.0082


Epoch 785/1000  
2/2  0s 10ms/step - loss: 1.4224e-04 - mean\_absolute\_error: 0.0082


Epoch 786/1000  
2/2  0s 11ms/step - loss: 1.4235e-04 - mean\_absolute\_error: 0.0082


Epoch 787/1000  
2/2  0s 13ms/step - loss: 1.4178e-04 - mean\_absolute\_error: 0.0081


Epoch 788/1000  
2/2  0s 9ms/step - loss: 1.4173e-04 - mean\_absolute\_error: 0.0081


Epoch 789/1000  
2/2  0s 8ms/step - loss: 1.4189e-04 - mean\_absolute\_error: 0.0081


Epoch 790/1000  
2/2  0s 8ms/step - loss: 1.4158e-04 - mean\_absolute\_error: 0.0081


Epoch 791/1000  
2/2  0s 10ms/step - loss: 1.4178e-04 - mean\_absolute\_error: 0.0081


Epoch 792/1000  
2/2  0s 8ms/step - loss: 1.4180e-04 - mean\_absolute\_error: 0.0081


Epoch 793/1000  
2/2  0s 8ms/step - loss: 1.4142e-04 - mean\_absolute\_error: 0.0081


Epoch 794/1000  
2/2  0s 8ms/step - loss: 1.4153e-04 - mean\_absolute\_error: 0.0081


Epoch 795/1000  
2/2  0s 12ms/step - loss: 1.4132e-04 - mean\_absolute\_error: 0.0081


Epoch 796/1000  
2/2  0s 35ms/step - loss: 1.4114e-04 - mean\_absolute\_error: 0.0081


Epoch 797/1000  
2/2  0s 0s/step - loss: 1.4135e-04 - mean\_absolute\_error: 0.0081


Epoch 798/1000  
2/2  0s 6ms/step - loss: 1.4133e-04 - mean\_absolute\_error: 0.0081


Epoch 799/1000  
2/2  0s 7ms/step - loss: 1.4128e-04 - mean\_absolute\_error: 0.0081


Epoch 800/1000  
2/2  0s 12ms/step - loss: 1.4102e-04 - mean\_absolute\_error: 0.0081


Epoch 801/1000  
2/2  0s 8ms/step - loss: 1.4080e-04 - mean\_absolute\_error: 0.0081


Epoch 802/1000  
2/2  0s 3ms/step - loss: 1.4081e-04 - mean\_absolute\_error: 0.0081


Epoch 803/1000  
2/2  0s 8ms/step - loss: 1.4075e-04 - mean\_absolute\_error: 0.0081


Epoch 804/1000  
2/2  0s 8ms/step - loss: 1.4091e-04 - mean\_absolute\_error: 0.0081


Epoch 805/1000  
2/2  0s 17ms/step - loss: 1.4080e-04 - mean\_absolute\_error: 0.0081


Epoch 806/1000  
2/2  0s 6ms/step - loss: 1.4047e-04 - mean\_absolute\_error: 0.0081


Epoch 807/1000  
2/2  0s 11ms/step - loss: 1.4080e-04 - mean\_absolute\_error: 0.0081


Epoch 808/1000  
2/2  0s 11ms/step - loss: 1.4071e-04 - mean\_absolute\_error: 0.0081


Epoch 809/1000  
2/2  0s 7ms/step - loss: 1.4019e-04 - mean\_absolute\_error: 0.0081


Epoch 810/1000  
2/2  0s 8ms/step - loss: 1.4052e-04 - mean\_absolute\_error: 0.0081


Epoch 811/1000  
2/2  0s 4ms/step - loss: 1.4046e-04 - mean\_absolute\_error: 0.0081


Epoch 812/1000  
2/2  0s 9ms/step - loss: 1.4019e-04 - mean\_absolute\_error: 0.0081


Epoch 813/1000  
2/2  0s 10ms/step - loss: 1.4022e-04 - mean\_absolute\_error: 0.0081


Epoch 814/1000  
2/2  0s 12ms/step - loss: 1.4033e-04 - mean\_absolute\_error: 0.0081


Epoch 815/1000  
2/2  0s 6ms/step - loss: 1.3999e-04 - mean\_absolute\_error: 0.0081


Epoch 816/1000  
2/2  0s 11ms/step - loss: 1.3988e-04 - mean\_absolute\_error: 0.0081


Epoch 817/1000  
2/2  0s 9ms/step - loss: 1.4005e-04 - mean\_absolute\_error: 0.0081


Epoch 818/1000  
2/2  0s 18ms/step - loss: 1.3989e-04 - mean\_absolute\_error: 0.0081


Epoch 819/1000  
2/2  0s 6ms/step - loss: 1.3977e-04 - mean\_absolute\_error: 0.0081


Epoch 820/1000  
2/2  0s 14ms/step - loss: 1.3969e-04 - mean\_absolute\_error: 0.0081


Epoch 821/1000  
2/2  0s 10ms/step - loss: 1.3984e-04 - mean\_absolute\_error: 0.0081


Epoch 822/1000  
2/2  0s 13ms/step - loss: 1.3963e-04 - mean\_absolute\_error: 0.0081


Epoch 823/1000  
2/2  0s 15ms/step - loss: 1.3937e-04 - mean\_absolute\_error: 0.0080


Epoch 824/1000  
2/2  0s 15ms/step - loss: 1.3959e-04 - mean\_absolute\_error: 0.0081


Epoch 825/1000  
2/2  0s 11ms/step - loss: 1.3957e-04 - mean\_absolute\_error: 0.0081


Epoch 826/1000  
2/2  0s 23ms/step - loss: 1.3940e-04 - mean\_absolute\_error: 0.0081


Epoch 827/1000  
2/2  0s 42ms/step - loss: 1.3934e-04 - mean\_absolute\_error: 0.0081


Epoch 828/1000  
2/2  0s 8ms/step - loss: 1.3954e-04 - mean\_absolute\_error: 0.0081


Epoch 829/1000  
2/2  0s 12ms/step - loss: 1.3924e-04 - mean\_absolute\_error: 0.0080


Epoch 830/1000  
2/2  0s 9ms/step - loss: 1.3905e-04 - mean\_absolute\_error: 0.0080


Epoch 831/1000  
2/2  0s 10ms/step - loss: 1.3934e-04 - mean\_absolute\_error: 0.0081


Epoch 832/1000  
2/2  0s 15ms/step - loss: 1.3924e-04 - mean\_absolute\_error: 0.0081


Epoch 833/1000  
2/2  0s 10ms/step - loss: 1.3909e-04 - mean\_absolute\_error: 0.0080


Epoch 834/1000  
2/2  0s 12ms/step - loss: 1.3900e-04 - mean\_absolute\_error: 0.0080


Epoch 835/1000  
2/2  0s 9ms/step - loss: 1.3908e-04 - mean\_absolute\_error: 0.0080


Epoch 836/1000  
2/2  0s 11ms/step - loss: 1.3909e-04 - mean\_absolute\_error: 0.0080


Epoch 837/1000  
2/2  0s 10ms/step - loss: 1.3896e-04 - mean\_absolute\_error: 0.0080


Epoch 838/1000  
2/2  0s 8ms/step - loss: 1.3871e-04 - mean\_absolute\_error: 0.0080


Epoch 839/1000  
2/2  0s 10ms/step - loss: 1.3894e-04 - mean\_absolute\_error: 0.0080


Epoch 840/1000  
2/2  0s 8ms/step - loss: 1.3875e-04 - mean\_absolute\_error: 0.0080

Epoch 841/1000  
2/2  0s 13ms/step - loss: 1.3846e-04 - mean\_absolute\_error: 0.0080


Epoch 842/1000  
2/2  0s 12ms/step - loss: 1.3879e-04 - mean\_absolute\_error: 0.0080


Epoch 843/1000  
2/2  0s 15ms/step - loss: 1.3871e-04 - mean\_absolute\_error: 0.0080


Epoch 844/1000  
2/2  0s 12ms/step - loss: 1.3852e-04 - mean\_absolute\_error: 0.0080


Epoch 845/1000  
2/2  0s 7ms/step - loss: 1.3850e-04 - mean\_absolute\_error: 0.0080





Epoch 846/1000  
2/2  0s 10ms/step - loss: 1.3855e-04 - mean\_absolute\_error: 0.0080


Epoch 847/1000  
2/2  0s 7ms/step - loss: 1.3851e-04 - mean\_absolute\_error: 0.0080


Epoch 848/1000  
2/2  0s 8ms/step - loss: 1.3869e-04 - mean\_absolute\_error: 0.0080


Epoch 849/1000  
2/2  0s 0s/step - loss: 1.3826e-04 - mean\_absolute\_error: 0.0080


Epoch 850/1000  
2/2  0s 16ms/step - loss: 1.3803e-04 - mean\_absolute\_error: 0.0080


Epoch 851/1000  
2/2  0s 10ms/step - loss: 1.3818e-04 - mean\_absolute\_error: 0.0080


Epoch 852/1000  
2/2  0s 9ms/step - loss: 1.3807e-04 - mean\_absolute\_error: 0.0080


Epoch 853/1000  
2/2  0s 11ms/step - loss: 1.3837e-04 - mean\_absolute\_error: 0.0080


Epoch 854/1000  
2/2  0s 43ms/step - loss: 1.3826e-04 - mean\_absolute\_error: 0.0080


Epoch 855/1000  
2/2  0s 15ms/step - loss: 1.3787e-04 - mean\_absolute\_error: 0.0080


Epoch 856/1000  
2/2  0s 12ms/step - loss: 1.3836e-04 - mean\_absolute\_error: 0.0080


Epoch 857/1000  
2/2  0s 6ms/step - loss: 1.3810e-04 - mean\_absolute\_error: 0.0080


Epoch 858/1000  
2/2  0s 8ms/step - loss: 1.3755e-04 - mean\_absolute\_error: 0.0080


Epoch 859/1000  
2/2  0s 10ms/step - loss: 1.3798e-04 - mean\_absolute\_error: 0.0080


Epoch 860/1000  
2/2  0s 10ms/step - loss: 1.3792e-04 - mean\_absolute\_error: 0.0080


Epoch 861/1000  
2/2  0s 43ms/step - loss: 1.3774e-04 - mean\_absolute\_error: 0.0080


Epoch 862/1000  
2/2  0s 12ms/step - loss: 1.3781e-04 - mean\_absolute\_error: 0.0080


Epoch 863/1000  
2/2  0s 9ms/step - loss: 1.3779e-04 - mean\_absolute\_error: 0.0080


Epoch 864/1000  
2/2  0s 11ms/step - loss: 1.3780e-04 - mean\_absolute\_error: 0.0080


Epoch 865/1000  
2/2  0s 9ms/step - loss: 1.3782e-04 - mean\_absolute\_error: 0.0080


Epoch 866/1000  
2/2  0s 12ms/step - loss: 1.3738e-04 - mean\_absolute\_error: 0.0080


Epoch 867/1000  
2/2  0s 10ms/step - loss: 1.3757e-04 - mean\_absolute\_error: 0.0080


Epoch 868/1000  
2/2  0s 11ms/step - loss: 1.3771e-04 - mean\_absolute\_error: 0.0080


Epoch 869/1000  
2/2  0s 15ms/step - loss: 1.3746e-04 - mean\_absolute\_error: 0.0080


Epoch 870/1000  
2/2  0s 5ms/step - loss: 1.3727e-04 - mean\_absolute\_error: 0.0080


Epoch 871/1000  
2/2  0s 0s/step - loss: 1.3741e-04 - mean\_absolute\_error: 0.0080


Epoch 872/1000  
2/2  0s 13ms/step - loss: 1.3740e-04 - mean\_absolute\_error: 0.0080


Epoch 873/1000  
2/2  0s 14ms/step - loss: 1.3735e-04 - mean\_absolute\_error: 0.0080


Epoch 874/1000  
2/2  0s 13ms/step - loss: 1.3707e-04 - mean\_absolute\_error: 0.0080


Epoch 875/1000  
2/2  0s 8ms/step - loss: 1.3729e-04 - mean\_absolute\_error: 0.0080


Epoch 876/1000  
2/2  0s 14ms/step - loss: 1.3712e-04 - mean\_absolute\_error: 0.0080


Epoch 877/1000  
2/2  0s 9ms/step - loss: 1.3688e-04 - mean\_absolute\_error: 0.0079


Epoch 878/1000  
2/2  0s 8ms/step - loss: 1.3712e-04 - mean\_absolute\_error: 0.0080


Epoch 879/1000  
2/2  0s 7ms/step - loss: 1.3702e-04 - mean\_absolute\_error: 0.0080


Epoch 880/1000  
2/2  0s 7ms/step - loss: 1.3714e-04 - mean\_absolute\_error: 0.0080


Epoch 881/1000  
2/2  0s 10ms/step - loss: 1.3739e-04 - mean\_absolute\_error: 0.0080


Epoch 882/1000  
2/2  0s 10ms/step - loss: 1.3669e-04 - mean\_absolute\_error: 0.0079


Epoch 883/1000  
2/2  0s 11ms/step - loss: 1.3666e-04 - mean\_absolute\_error: 0.0079


Epoch 884/1000  
2/2  0s 35ms/step - loss: 1.3680e-04 - mean\_absolute\_error: 0.0080


Epoch 885/1000  
2/2  0s 8ms/step - loss: 1.3653e-04 - mean\_absolute\_error: 0.0079


Epoch 886/1000  
2/2  0s 8ms/step - loss: 1.3700e-04 - mean\_absolute\_error: 0.0080


Epoch 887/1000  
2/2  0s 9ms/step - loss: 1.3711e-04 - mean\_absolute\_error: 0.0080


Epoch 888/1000  
2/2  0s 11ms/step - loss: 1.3680e-04 - mean\_absolute\_error: 0.0079


Epoch 889/1000  
2/2  0s 7ms/step - loss: 1.3668e-04 - mean\_absolute\_error: 0.0079


Epoch 890/1000  
2/2  0s 0s/step - loss: 1.3647e-04 - mean\_absolute\_error: 0.0079


Epoch 891/1000  
2/2  0s 9ms/step - loss: 1.3631e-04 - mean\_absolute\_error: 0.0079


Epoch 892/1000  
2/2  0s 12ms/step - loss: 1.3632e-04 - mean\_absolute\_error: 0.0079


Epoch 893/1000  
2/2  0s 7ms/step - loss: 1.3657e-04 - mean\_absolute\_error: 0.0079


Epoch 894/1000  
2/2  0s 8ms/step - loss: 1.3668e-04 - mean\_absolute\_error: 0.0079


Epoch 895/1000  
2/2  0s 7ms/step - loss: 1.3665e-04 - mean\_absolute\_error: 0.0079


Epoch 896/1000  
2/2  0s 8ms/step - loss: 1.3629e-04 - mean\_absolute\_error: 0.0079


Epoch 897/1000  
2/2  0s 12ms/step - loss: 1.3619e-04 - mean\_absolute\_error: 0.0079


Epoch 898/1000  
2/2  0s 12ms/step - loss: 1.3617e-04 - mean\_absolute\_error: 0.0079


Epoch 899/1000  
2/2  0s 15ms/step - loss: 1.3597e-04 - mean\_absolute\_error: 0.0079


Epoch 900/1000  
2/2  0s 13ms/step - loss: 1.3630e-04 - mean\_absolute\_error: 0.0079


Epoch 901/1000  
2/2  0s 11ms/step - loss: 1.3639e-04 - mean\_absolute\_error: 0.0079


Epoch 902/1000  
2/2  0s 9ms/step - loss: 1.3628e-04 - mean\_absolute\_error: 0.0079


Epoch 903/1000  
2/2  0s 12ms/step - loss: 1.3606e-04 - mean\_absolute\_error: 0.0079


Epoch 904/1000  
2/2  0s 9ms/step - loss: 1.3589e-04 - mean\_absolute\_error: 0.0079


Epoch 905/1000  
2/2  0s 9ms/step - loss: 1.3579e-04 - mean\_absolute\_error: 0.0079


Epoch 906/1000  
2/2  0s 34ms/step - loss: 1.3573e-04 - mean\_absolute\_error: 0.0079


Epoch 907/1000  
2/2  0s 7ms/step - loss: 1.3600e-04 - mean\_absolute\_error: 0.0079


Epoch 908/1000  
2/2  0s 11ms/step - loss: 1.3613e-04 - mean\_absolute\_error: 0.0079


Epoch 909/1000  
2/2  0s 64ms/step - loss: 1.3604e-04 - mean\_absolute\_error: 0.0079


Epoch 910/1000  
2/2  0s 10ms/step - loss: 1.3572e-04 - mean\_absolute\_error: 0.0079


Epoch 911/1000  
2/2  0s 10ms/step - loss: 1.3561e-04 - mean\_absolute\_error: 0.0079


Epoch 912/1000  
2/2  0s 12ms/step - loss: 1.3551e-04 - mean\_absolute\_error: 0.0079


Epoch 913/1000  
2/2  0s 8ms/step - loss: 1.3538e-04 - mean\_absolute\_error: 0.0079


Epoch 914/1000  
2/2  0s 13ms/step - loss: 1.3568e-04 - mean\_absolute\_error: 0.0079


Epoch 915/1000  
2/2  0s 7ms/step - loss: 1.3577e-04 - mean\_absolute\_error: 0.0079


Epoch 916/1000  
2/2  0s 11ms/step - loss: 1.3571e-04 - mean\_absolute\_error: 0.0079


Epoch 917/1000  
2/2  0s 9ms/step - loss: 1.3545e-04 - mean\_absolute\_error: 0.0079


Epoch 918/1000  
2/2  0s 4ms/step - loss: 1.3529e-04 - mean\_absolute\_error: 0.0079


Epoch 919/1000  
2/2  0s 9ms/step - loss: 1.3521e-04 - mean\_absolute\_error: 0.0079


Epoch 920/1000  
2/2  0s 15ms/step - loss: 1.3510e-04 - mean\_absolute\_error: 0.0079


Epoch 921/1000  
2/2  0s 6ms/step - loss: 1.3536e-04 - mean\_absolute\_error: 0.0079


Epoch 922/1000  
2/2  0s 7ms/step - loss: 1.3545e-04 - mean\_absolute\_error: 0.0079


Epoch 923/1000  
2/2  0s 811us/step - loss: 1.3542e-04 - mean\_absolute\_error: 0.0079


Epoch 924/1000  
2/2  0s 9ms/step - loss: 1.3520e-04 - mean\_absolute\_error: 0.0079


Epoch 925/1000  
2/2  0s 5ms/step - loss: 1.3500e-04 - mean\_absolute\_error: 0.0079


Epoch 926/1000  
2/2  0s 14ms/step - loss: 1.3488e-04 - mean\_absolute\_error: 0.0079


Epoch 927/1000  
2/2  0s 13ms/step - loss: 1.3481e-04 - mean\_absolute\_error: 0.0079


Epoch 928/1000  
2/2  0s 13ms/step - loss: 1.3507e-04 - mean\_absolute\_error: 0.0079


Epoch 929/1000  
2/2  0s 8ms/step - loss: 1.3517e-04 - mean\_absolute\_error: 0.0079


Epoch 930/1000  
2/2  0s 37ms/step - loss: 1.3499e-04 - mean\_absolute\_error: 0.0079


Epoch 931/1000  
2/2  0s 7ms/step - loss: 1.3489e-04 - mean\_absolute\_error: 0.0079


Epoch 932/1000  
2/2  0s 10ms/step - loss: 1.3504e-04 - mean\_absolute\_error: 0.0079


Epoch 933/1000  
2/2  0s 7ms/step - loss: 1.3491e-04 - mean\_absolute\_error: 0.0079


Epoch 934/1000  
2/2  0s 7ms/step - loss: 1.3471e-04 - mean\_absolute\_error: 0.0079


Epoch 935/1000  
2/2  0s 10ms/step - loss: 1.3448e-04 - mean\_absolute\_error: 0.0078


Epoch 936/1000  
2/2  0s 10ms/step - loss: 1.3453e-04 - mean\_absolute\_error: 0.0079


Epoch 937/1000  
2/2  0s 10ms/step - loss: 1.3461e-04 - mean\_absolute\_error: 0.0079


Epoch 938/1000  
2/2  0s 8ms/step - loss: 1.3480e-04 - mean\_absolute\_error: 0.0079


Epoch 939/1000  
2/2  0s 8ms/step - loss: 1.3457e-04 - mean\_absolute\_error: 0.0078


Epoch 940/1000  
2/2  0s 10ms/step - loss: 1.3422e-04 - mean\_absolute\_error: 0.0078


Epoch 941/1000  
2/2  0s 0s/step - loss: 1.3445e-04 - mean\_absolute\_error: 0.0078


Epoch 942/1000  
2/2  0s 12ms/step - loss: 1.3447e-04 - mean\_absolute\_error: 0.0078


Epoch 943/1000  
2/2  0s 7ms/step - loss: 1.3414e-04 - mean\_absolute\_error: 0.0078


Epoch 944/1000  
2/2  0s 6ms/step - loss: 1.3397e-04 - mean\_absolute\_error: 0.0078


Epoch 945/1000  
2/2  0s 7ms/step - loss: 1.3403e-04 - mean\_absolute\_error: 0.0078


Epoch 946/1000  
2/2  0s 5ms/step - loss: 1.3411e-04 - mean\_absolute\_error: 0.0078


Epoch 947/1000  
2/2  0s 8ms/step - loss: 1.3432e-04 - mean\_absolute\_error: 0.0078


Epoch 948/1000  
2/2  0s 5ms/step - loss: 1.3398e-04 - mean\_absolute\_error: 0.0078


Epoch 949/1000  
2/2  0s 10ms/step - loss: 1.3372e-04 - mean\_absolute\_error: 0.0078


Epoch 950/1000  
2/2  0s 8ms/step - loss: 1.3403e-04 - mean\_absolute\_error: 0.0078


Epoch 951/1000  
2/2  0s 70ms/step - loss: 1.3397e-04 - mean\_absolute\_error: 0.0078


Epoch 952/1000  
2/2  0s 9ms/step - loss: 1.3369e-04 - mean\_absolute\_error: 0.0078


Epoch 953/1000  
2/2  0s 7ms/step - loss: 1.3355e-04 - mean\_absolute\_error: 0.0078


Epoch 954/1000  
2/2  0s 9ms/step - loss: 1.3360e-04 - mean\_absolute\_error: 0.0078


Epoch 955/1000  
2/2  0s 8ms/step - loss: 1.3370e-04 - mean\_absolute\_error: 0.0078


Epoch 956/1000  
2/2  0s 12ms/step - loss: 1.3387e-04 - mean\_absolute\_error: 0.0078


Epoch 957/1000  
2/2  0s 7ms/step - loss: 1.3353e-04 - mean\_absolute\_error: 0.0078


Epoch 958/1000  
2/2  0s 8ms/step - loss: 1.3330e-04 - mean\_absolute\_error: 0.0078


Epoch 959/1000  
2/2  0s 7ms/step - loss: 1.3355e-04 - mean\_absolute\_error: 0.0078


Epoch 960/1000  
2/2  0s 11ms/step - loss: 1.3355e-04 - mean\_absolute\_error: 0.0078


Epoch 961/1000  
2/2  0s 8ms/step - loss: 1.3329e-04 - mean\_absolute\_error: 0.0078


Epoch 962/1000  
2/2  0s 7ms/step - loss: 1.3314e-04 - mean\_absolute\_error: 0.0078


Epoch 963/1000  
2/2  0s 2ms/step - loss: 1.3324e-04 - mean\_absolute\_error: 0.0078


Epoch 964/1000  
2/2  0s 7ms/step - loss: 1.3338e-04 - mean\_absolute\_error: 0.0078


Epoch 965/1000  
2/2  0s 10ms/step - loss: 1.3349e-04 - mean\_absolute\_error: 0.0078


Epoch 966/1000  
2/2  0s 6ms/step - loss: 1.3320e-04 - mean\_absolute\_error: 0.0078


Epoch 967/1000  
2/2  0s 11ms/step - loss: 1.3295e-04 - mean\_absolute\_error: 0.0078


Epoch 968/1000  
2/2  0s 7ms/step - loss: 1.3325e-04 - mean\_absolute\_error: 0.0078


Epoch 969/1000  
2/2  0s 30ms/step - loss: 1.3311e-04 - mean\_absolute\_error: 0.0078


Epoch 970/1000  
2/2  0s 15ms/step - loss: 1.3326e-04 - mean\_absolute\_error: 0.0078


Epoch 971/1000  
2/2  0s 10ms/step - loss: 1.3308e-04 - mean\_absolute\_error: 0.0078


Epoch 972/1000  
2/2  0s 10ms/step - loss: 1.3273e-04 - mean\_absolute\_error: 0.0078


Epoch 973/1000  
2/2  0s 10ms/step - loss: 1.3313e-04 - mean\_absolute\_error: 0.0078


Epoch 974/1000  
2/2  0s 8ms/step - loss: 1.3304e-04 - mean\_absolute\_error: 0.0078


Epoch 975/1000  
2/2  0s 0s/step - loss: 1.3277e-04 - mean\_absolute\_error: 0.0078


Epoch 976/1000  
2/2  0s 8ms/step - loss: 1.3277e-04 - mean\_absolute\_error: 0.0078


Epoch 977/1000  
2/2  0s 7ms/step - loss: 1.3274e-04 - mean\_absolute\_error: 0.0078


Epoch 978/1000  
2/2  0s 7ms/step - loss: 1.3286e-04 - mean\_absolute\_error: 0.0078


Epoch 979/1000  
2/2  0s 10ms/step - loss: 1.3308e-04 - mean\_absolute\_error: 0.0078


Epoch 980/1000  
2/2  0s 0s/step - loss: 1.3264e-04 - mean\_absolute\_error: 0.0078

Epoch 981/1000  
2/2  0s 7ms/step - loss: 1.3251e-04 - mean\_absolute\_error: 0.0078

Epoch 982/1000  
2/2  0s 6ms/step - loss: 1.3275e-04 - mean\_absolute\_error: 0.0078

Epoch 983/1000  
2/2  0s 8ms/step - loss: 1.3264e-04 - mean\_absolute\_error: 0.0078

Epoch 984/1000  
2/2  0s 10ms/step - loss: 1.3248e-04 - mean\_absolute\_error: 0.0077

Epoch 985/1000  
2/2  0s 12ms/step - loss: 1.3231e-04 - mean\_absolute\_error: 0.0077

```

Epoch 986/1000
2/2 ————— 0s 8ms/step - loss: 1.3242e-04 - mean_absolute_error: 0.0078
Epoch 987/1000
2/2 ————— 0s 47ms/step - loss: 1.3250e-04 - mean_absolute_error: 0.0078
Epoch 988/1000
2/2 ————— 0s 9ms/step - loss: 1.3261e-04 - mean_absolute_error: 0.0078
Epoch 989/1000
2/2 ————— 0s 6ms/step - loss: 1.3232e-04 - mean_absolute_error: 0.0077
Epoch 990/1000
2/2 ————— 0s 9ms/step - loss: 1.3209e-04 - mean_absolute_error: 0.0077
Epoch 991/1000
2/2 ————— 0s 3ms/step - loss: 1.3232e-04 - mean_absolute_error: 0.0077
Epoch 992/1000
2/2 ————— 0s 8ms/step - loss: 1.3222e-04 - mean_absolute_error: 0.0077
Epoch 993/1000
2/2 ————— 0s 8ms/step - loss: 1.3197e-04 - mean_absolute_error: 0.0077
Epoch 994/1000
2/2 ————— 0s 8ms/step - loss: 1.3181e-04 - mean_absolute_error: 0.0077
Epoch 995/1000
2/2 ————— 0s 6ms/step - loss: 1.3190e-04 - mean_absolute_error: 0.0077
Epoch 996/1000
2/2 ————— 0s 8ms/step - loss: 1.3196e-04 - mean_absolute_error: 0.0077
Epoch 997/1000
2/2 ————— 0s 11ms/step - loss: 1.3214e-04 - mean_absolute_error: 0.0077
Epoch 998/1000
2/2 ————— 0s 0s/step - loss: 1.3179e-04 - mean_absolute_error: 0.0077
Epoch 999/1000
2/2 ————— 0s 8ms/step - loss: 1.3152e-04 - mean_absolute_error: 0.0077
Epoch 1000/1000
2/2 ————— 0s 17ms/step - loss: 1.3178e-04 - mean_absolute_error: 0.0077
14/14 ————— 0s 8ms/step
Predicciones finalizadas

```

```

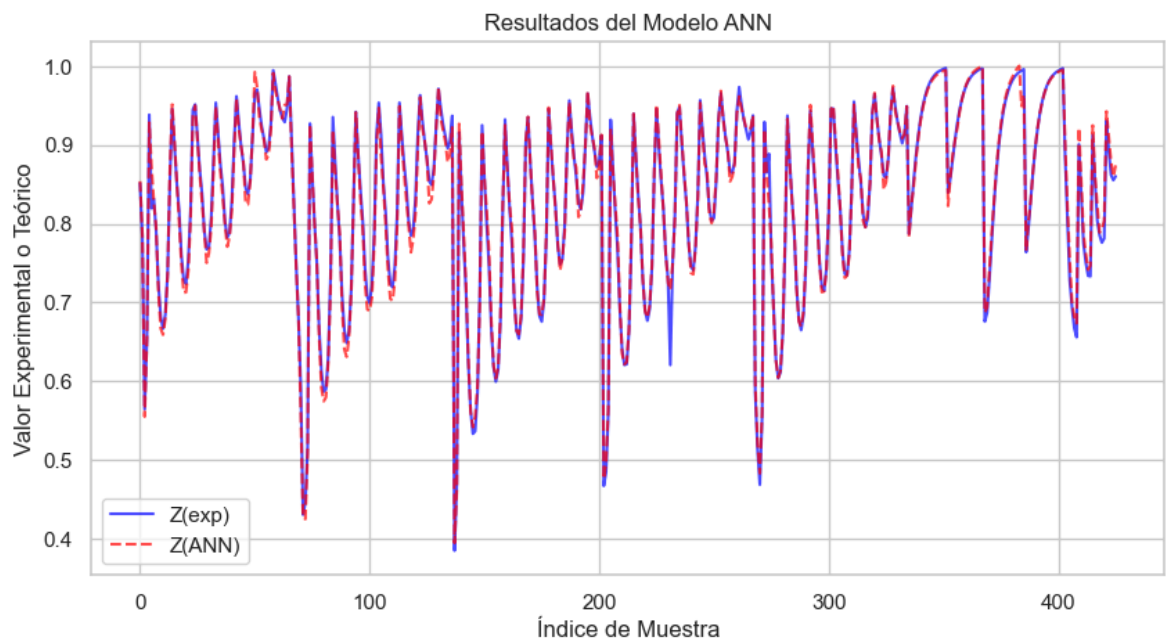
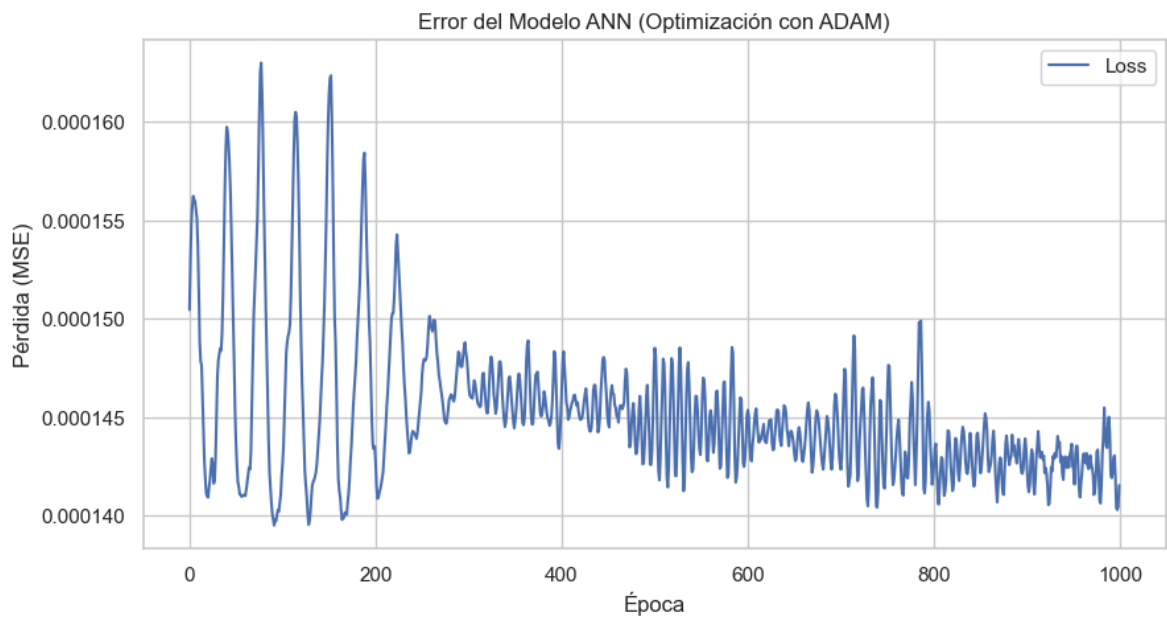
In [89]: # Graficar el error del entrenamiento ANN (historia de entrenamiento)
plt.figure(figsize=(10, 5))
plt.plot(history.history['loss'], label='Loss')
plt.xlabel('Época')
plt.ylabel('Pérdida (MSE)')
plt.title('Error del Modelo ANN (Optimización con ADAM)')
plt.legend()
plt.show()

# Mostrar los resultados del modelo ANN comparados con Z(exp)
plt.figure(figsize=(10, 5))
plt.plot(data['Z(exp)'], label='Z(exp)', color='blue', linestyle='--', alpha=0.7)

```



```
plt.plot(data['Z(ANN)'], label='Z(ANN)', color='red', linestyle='--', alpha=0.7)
plt.xlabel('Índice de Muestra')
plt.ylabel('Valor Experimental o Teórico')
plt.title('Resultados del Modelo ANN')
plt.legend()
plt.show()
```



In [90]: `data.head()`

Out[90]:

	Ppr	Tpr	X	Z(exp)	Z(PR)	Z(SRK)	Z(ANN)
0	-0.918927	-1.514769	-0.845877	0.85127	0.831137	0.851514	0.853999
1	-0.758450	-1.514769	-0.651715	0.78334	0.758910	0.785745	0.786481
2	0.495533	-1.514769	0.865487	0.56427	0.553238	0.600779	0.555012
3	1.091028	-1.514769	1.585981	0.65462	0.626810	0.685755	0.652548
4	-1.064584	-0.714518	-1.051493	0.93835	0.925536	0.937494	0.928310

# Redes Neuronales Artificiales Difusas (ANFIS)

El modelo ANFIS (Sistema de Inferencia Adaptativa Basado en Redes Neuronales) es óptimo para la predicción del factor de compresibilidad  $Z$  debido a su integración de la lógica difusa y las redes neuronales, lo que le permite modelar relaciones no lineales complejas en los datos con mayor precisión. Esta combinación ofrece interpretabilidad a través de reglas difusas que explican la relación entre las variables de entrada  $P_{pr}, T_{pr}$  y  $X$  la salida, facilitando la comprensión del modelo. La lógica difusa es esencial porque captura la incertidumbre e imprecisión de los datos, representando las variables en un espectro continuo y estableciendo reglas de inferencia que reflejan relaciones complejas. Con funciones de membresía que evalúan grados de pertenencia, ANFIS se adapta eficazmente a las variaciones en los datos y permite incorporar conocimiento experto en sus reglas, resultando en predicciones más precisas y confiables. En comparación con modelos tradicionales como ANN, PR y SRK, ANFIS destaca al abordar no solo patrones lineales, sino también interacciones complejas, convirtiéndose en una herramienta poderosa en contextos donde la incertidumbre es significativa.

```
In [91]: # Definimos los valores estadísticos para poder establecer las funciones de memb  
data.describe()
```

```
Out[91]:
```

	Ppr	Tpr	X	Z(exp)	Z(PR)	Z(SRK)
count	4.260000e+02	4.260000e+02	4.260000e+02	426.000000	426.000000	426.000000
mean	1.167558e-16	-9.173674e-16	1.334353e-16	0.830186	0.812970	0.848090
std	1.001176e+00	1.001176e+00	1.001176e+00	0.120819	0.120516	0.112477
min	-1.293167e+00	-2.175385e+00	-1.302035e+00	0.385000	0.380997	0.417298
25%	-8.052580e-01	-6.524621e-01	-8.089775e-01	0.752370	0.734174	0.782861
50%	-2.380152e-01	-4.924795e-02	-2.894237e-01	0.854520	0.831778	0.869998
75%	5.848586e-01	5.698793e-01	6.286379e-01	0.927115	0.906826	0.936520
max	2.908447e+00	2.485878e+00	2.921182e+00	0.997580	0.996806	1.024800

```
In [92]: # RED NEURONAL ARTIFICIAL DIFUSA(ANFIS)
#Importación de la libreria anfis(modificada debido a la presencia de errores)
#Ref: https://github.com/twmeggs/anfis
import sys
sys.path.append("..")
import anfis_ejm as anfis

# Seleccionar las primeras tres columnas como entradas (Ppr, Tpr, X)
X = data.iloc[:, 0:3].values
# Seleccionar la cuarta columna como salida (Z_exp)
Y = data.iloc[:, 3].values

# Diseñar las funciones de membresía especificando la media y sigma
mf = [
    [['gaussmf', {'mean': 1, 'sigma': 0.5}], # Función para Ppr
```

```

    ['gaussmf', {'mean': 0.5, 'sigma': 0.5}],
    ['gaussmf', {'mean': 0, 'sigma': 0.5}],
    ['gaussmf', {'mean': -0.5, 'sigma': 0.5}],
    ['gaussmf', {'mean': -1, 'sigma': 0.5}]],

    [['gaussmf', {'mean': 1, 'sigma': 0.5}], # Función para Tpr
    ['gaussmf', {'mean': 0.5, 'sigma': 0.5}],
    ['gaussmf', {'mean': 0, 'sigma': 0.5}],
    ['gaussmf', {'mean': -0.5, 'sigma': 0.5}],
    ['gaussmf', {'mean': -1, 'sigma': 0.5}]],

    [['gaussmf', {'mean': 1, 'sigma': 0.5}], # Función para X
    ['gaussmf', {'mean': 0.5, 'sigma': 0.5}],
    ['gaussmf', {'mean': 0, 'sigma': 0.5}],
    ['gaussmf', {'mean': -0.5, 'sigma': 0.5}],
    ['gaussmf', {'mean': -1, 'sigma': 0.5}]]
]

# Crear un objeto para las funciones de membresía
mfc = anfys.MemFuncs(mf)

# Crear un objeto ANFIS
anf = anfys.ANFIS(X, Y, mfc)

# Método de entrenamiento híbrido fuera de línea
print("Entrenando el modelo ANFIS...")
Pred = anf.trainHybridJangOffline(epochs=20)
print("Entrenamiento completo.")

#Agregar predicciones al DataFrame
data['Z(ANFIS)'] = Pred

```

```

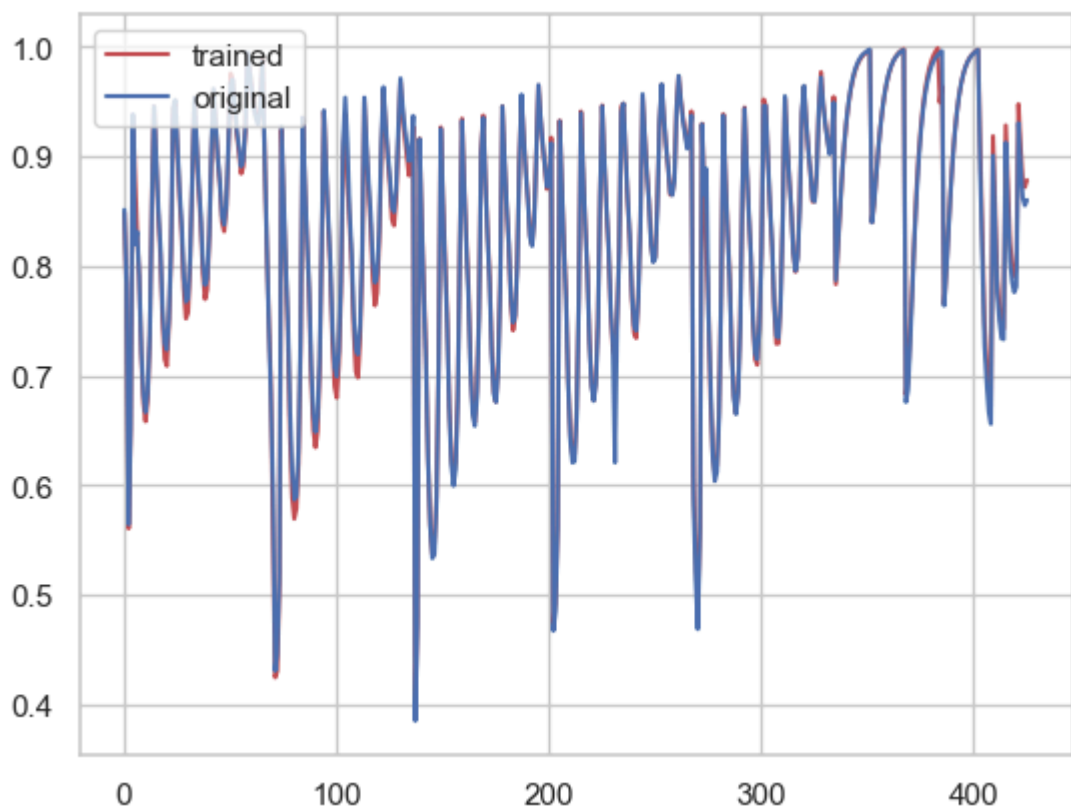
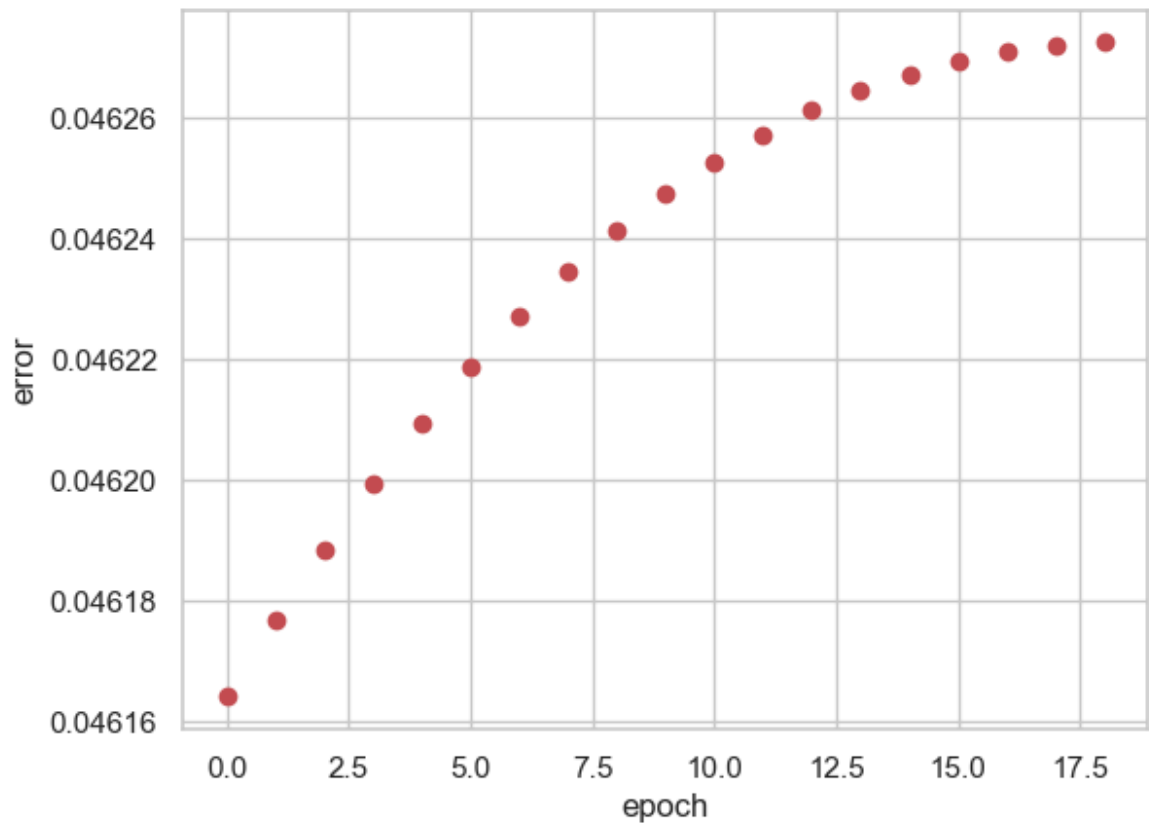
Entrenando el modelo ANFIS...
current error: 0.04616408090081334
current error: 0.04617677371347302
current error: 0.04618858842765071
current error: 0.046199515710508676
current error: 0.04620956062860439
current error: 0.04621873965429193
current error: 0.04622707772609749
current error: 0.04623460547048351
current error: 0.046241356674300724
current error: 0.04624736607665959
current error: 0.04625266752686934
current error: 0.046257292532819655
current error: 0.0462612692028471
current error: 0.04626462156481703
current error: 0.04626736923012219
current error: 0.0462695273577654
current error: 0.0462711068654446
current error: 0.046272114830179414
current error: 0.04627255502050972
Entrenamiento completo.

```

```

In [93]: # Graficar el error del modelo
anf.plotErrors()
# Mostrando los resultados
anf.plotResults()

```



```
In [94]: data.head()
```

Out[94]:

	Ppr	Tpr	X	Z(exp)	Z(PR)	Z(SRK)	Z(ANN)	Z(ANFIS)
0	-0.918927	-1.514769	-0.845877	0.85127	0.831137	0.851514	0.853999	0.848266
1	-0.758450	-1.514769	-0.651715	0.78334	0.758910	0.785745	0.786481	0.780725
2	0.495533	-1.514769	0.865487	0.56427	0.553238	0.600779	0.555012	0.560475
3	1.091028	-1.514769	1.585981	0.65462	0.626810	0.685755	0.652548	0.649682
4	-1.064584	-0.714518	-1.051493	0.93835	0.925536	0.937494	0.928310	0.937233

## Gráficas de Comparación de los modelos respecto a los valores teóricos

Las gráficas de comparación de los modelos respecto a los valores teóricos se utilizan para evaluar visualmente la precisión y la validez de distintos modelos predictivos en relación con los valores experimentales o teóricos. En el contexto de la predicción del factor de compresibilidad  $Z$ , estas gráficas permiten comparar cómo se comportan los diferentes métodos (en este caso, los modelos PR, SRK, ANN y ANFIS) en su capacidad para replicar los datos observados. Estas gráficas nos proporcionan una forma efectiva de identificar patrones y discrepancias entre las predicciones y los datos reales. Al incluir una línea de referencia (generalmente la línea de identidad  $y = x$ ), se puede ver cuán cerca están las predicciones de los valores esperados. Además, calcular y mostrar el coeficiente de determinación  $R^2$  nos ayuda a cuantificar la correlación y el ajuste entre los valores predichos y los experimentales, proporcionando una medida objetiva del rendimiento del modelo. En resumen, estas gráficas son esenciales para comparar la eficacia de los modelos y tomar decisiones fundamentadas sobre cuál de ellos se desempeña mejor en términos de precisión y consistencia.

In [95]:

```
# Estableciendo el estilo de las gráficas
sns.set_theme(style='whitegrid')

# Creando un gráfico de dispersión para cada método en relación a 'Z(exp)'
plt.figure(figsize=(16, 12))

# Función para calcular y mostrar R^2 en los gráficos
def plot_with_r2(ax, x, y, title, xlabel, ylabel):
    # Calcular la regresión lineal
    slope, intercept, r_value, _, _ = linregress(x, y)
    r_squared = r_value**2

    # Crear el gráfico de dispersión
    sns.scatterplot(x=x, y=y, ax=ax)
    ax.set_title(title)
    ax.set_xlabel(xlabel)
    ax.set_ylabel(ylabel)

    # Añadir línea de regresión
    ax.plot(x, slope * x + intercept, color='red', linestyle='--')

    # Mostrar el valor de R^2
    ax.text(0.05, 0.95, f'$R^2 = {r_squared:.4f}$', transform=ax.transAxes, font
```

```

# Gráficoando para Z(PR)
ax1 = plt.subplot(2, 2, 1)
plot_with_r2(ax1, data['Z(exp)'], data['Z(PR)'], 'Correlación entre Z(exp) y Z(P

# Gráficoando para Z(SRK)
ax2 = plt.subplot(2, 2, 2)
plot_with_r2(ax2, data['Z(exp)'], data['Z(SRK)'], 'Correlación entre Z(exp) y Z(

# Gráficoando para Z(ANN)
ax3 = plt.subplot(2, 2, 3)
plot_with_r2(ax3, data['Z(exp)'], data['Z(ANN)'], 'Correlación entre Z(exp) y Z(

# Gráficoando para Z(ANFIS)
ax4 = plt.subplot(2, 2, 4)
plot_with_r2(ax4, data['Z(exp)'], data['Z(ANFIS)'], 'Correlación entre Z(exp) y

# Ajustando el layout
plt.tight_layout()
plt.show()

```

