

To develop a full code solution using regression models to estimate zinc concentration based on turbidity measurements from images, we can break this down into a comprehensive process. This includes data preparation, model training, and making predictions on new data. Below is an example code setup using Python with libraries such as OpenCV for image processing and scikit-learn for regression modeling.

### ### Full Code for Zinc Concentration Estimation Using Regression Models

#### #### Requirements

Make sure you have the following Python libraries installed:

```
```bash

pip install numpy pandas opencv-python scikit-learn matplotlib

```
```

#### #### Data Preparation

You should have a dataset of images and corresponding zinc concentration values. For this example, we will assume you have a CSV file that contains the turbidity and zinc concentration data, where each entry corresponds to an image file path.

```
```python

import os

import cv2

import numpy as np

import pandas as pd

from sklearn.model_selection import train_test_split

from sklearn.linear_model import LinearRegression

import matplotlib.pyplot as plt

```
```

```
# Load data

data = pd.read_csv('zinc_data.csv') # CSV file with 'image_path', 'turbidity', 'zinc_concentration'


# Function to extract features from images

def extract_features(image_path):

    image = cv2.imread(image_path)

    gray_image = cv2.cvtColor(image, cv2.COLOR_BGR2GRAY)

    mean_intensity = np.mean(gray_image) # Example feature: mean pixel intensity

    return [mean_intensity] # You can add more features as needed


# Prepare feature and target arrays

X = []

y = []


for index, row in data.iterrows():

    features = extract_features(row['image_path'])

    X.append(features)

    y.append(row['zinc_concentration'])


X = np.array(X)

y = np.array(y)


# Train-test split

X_train, X_test, y_train, y_test = train_test_split(X, y, test_size=0.2, random_state=42)
```

```
# Create and train the regression model
```

```
model = LinearRegression()
```

```
model.fit(X_train, y_train)
```

```
# Predictions and evaluation
```

```
y_pred = model.predict(X_test)
```

```
# Plotting actual vs predicted values
```

```
plt.scatter(y_test, y_pred)
```

```
plt.xlabel('Actual Zinc Concentration')
```

```
plt.ylabel('Predicted Zinc Concentration')
```

```
plt.title('Actual vs Predicted Zinc Concentration')
```

```
plt.plot([min(y_test), max(y_test)], [min(y_test), max(y_test)], 'r--') # diagonal line
```

```
plt.show()
```

```
# Save the model if necessary
```

```
import joblib
```

```
joblib.dump(model, 'zinc_regression_model.pkl')
```

```
...
```

```
### Real-Time Prediction Code
```

Once the model is trained, you can create a function for real-time predictions using the latest images captured from the slurry.

```
```python
```

```
def predict_zinc_concentration(image_path, model):
```

```

features = extract_features(image_path)

features = np.array(features).reshape(1, -1) # Reshape for single sample

predicted_concentration = model.predict(features)

return predicted_concentration[0]


# Example usage

camera = cv2.VideoCapture(0) # Adjust camera index according to your setup


while True:

    ret, frame = camera.read()

    if not ret:

        break


    # Optionally save the image for prediction

    cv2.imwrite('current_frame.jpg', frame)


    # Predict zinc concentration from the current frame

    predicted_zinc = predict_zinc_concentration('current_frame.jpg', model)


    # Display the predicted concentration on the screen

    cv2.putText(frame, f'Predicted Zinc: {predicted_zinc:.2f}', (10, 30), cv2.FONT_HERSHEY_SIMPLEX, 1, (0,
255, 0), 2)


    cv2.imshow("Real-Time Zinc Concentration Prediction", frame)


    if cv2.waitKey(1) & 0xFF == ord('q'):

```

```
break
```

```
camera.release()
```

```
cv2.destroyAllWindows()
```

```
'''
```

### ### Summary of the Code

1. **Data Preparation**: The initial section loads a dataset, reads the images, and extracts features (like mean pixel intensity).
2. **Model Training**: It trains a Linear Regression model on the extracted features and corresponding zinc concentration values.
3. **Prediction**: The second part implements a real-time loop capturing images from a camera, predicting the zinc concentration based on the most recent frame, and displaying the result.

### ### Important Considerations

- Ensure your image dataset is comprehensive and representative of the varying conditions in the slurry.
- Tune feature extraction and consider additional features that may improve model performance.
- Validate the model's accuracy with real-world samples to ensure reliability before deployment.

This code serves as a foundational framework that you can modify and extend according to your specific requirements and dataset characteristics.