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## Lampiran 1. Python Notebook untuk Pembuatan Model Machine Learning pada Tingkat Pertumbuhan Bayam Hijau

```

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from google.colab import drive
drive.mount('/content/drive')

Mounted at /content/drive

from PIL import Image
import numpy as np
import matplotlib.pyplot as plt

def segment_image(image_array):
    # Tentukan rentang warna yang ingin disegmentasi dalam format RGB
    color_ranges = [
        # Rentang warna minggu 2
        (np.array([16, 83, 1]), np.array([187, 133, 86])),
        (np.array([21, 61, 0]), np.array([64, 147, 56])),
        (np.array([112, 156, 0]), np.array([151, 285, 10])),
        # Rentang warna minggu 3
        (np.array([28, 114, 29]), np.array([72, 182, 83])),
        (np.array([48, 193, 186]), np.array([80, 285, 161])),
        # Rentang warna minggu 4
        (np.array([92, 287, 47]), np.array([240, 247, 239])),
        (np.array([57, 145, 15]), np.array([157, 246, 116])),
        (np.array([12, 166, 182]), np.array([40, 226, 151])),
        (np.array([5, 113, 71]), np.array([34, 175, 126])),
        (np.array([0, 121, 73]), np.array([8, 144, 124])),
        (np.array([0, 110, 66]), np.array([14, 138, 69])),
        (np.array([1, 185, 58]), np.array([18, 118, 79])),
        (np.array([27, 237, 187]), np.array([142, 243, 233])),
        (np.array([0, 167, 132]), np.array([9, 193, 157])),
        (np.array([0, 87, 55]), np.array([3, 111, 71])),
        (np.array([0, 129, 188]), np.array([14, 199, 153]))
    ]

    # Rentang warna yang ingin dihindari dalam format RGB
    avoid_ranges = [
        # Rentang warna minggu 2
        (np.array([3, 180, 186]), np.array([73, 215, 217])),
        (np.array([54, 112, 77]), np.array([70, 133, 99])),
        (np.array([57, 186, 81]), np.array([74, 125, 92])),
        (np.array([40, 92, 75]), np.array([74, 130, 181])),
        (np.array([23, 93, 79]), np.array([47, 184, 87])),
        (np.array([69, 112, 69]), np.array([82, 125, 81])),
        (np.array([30, 85, 80]), np.array([40, 90, 90])),
        (np.array([96, 128, 82]), np.array([116, 148, 93])),
        (np.array([62, 180, 76]), np.array([106, 138, 93])),
        (np.array([183, 234, 168]), np.array([191, 241, 186])),
        (np.array([110, 137, 79]), np.array([187, 212, 183])),
        (np.array([137, 154, 79]), np.array([197, 201, 138])),
        (np.array([103, 211, 197]), np.array([135, 241, 232])),
        (np.array([43, 87, 66]), np.array([78, 100, 78])),
        (np.array([18, 83, 79]), np.array([28, 90, 86])),
        (np.array([85, 87, 32]), np.array([95, 115, 66])),
        (np.array([20, 78, 71]), np.array([41, 93, 79])),
        (np.array([86, 129, 89]), np.array([115, 159, 181])),
        (np.array([121, 202, 158]), np.array([127, 214, 182])),
        (np.array([46, 83, 52]), np.array([111, 126, 65])),
        (np.array([31, 82, 64]), np.array([73, 115, 90])),
        (np.array([146, 222, 177]), np.array([198, 243, 233])),
        (np.array([70, 232, 231]), np.array([111, 245, 243])),
        (np.array([86, 124, 67]), np.array([117, 162, 93])),
        (np.array([9, 83, 72]), np.array([48, 186, 83])),
        # Rentang warna minggu 3
        (np.array([27, 66, 37]), np.array([40, 83, 53])),
        (np.array([20, 65, 45]), np.array([32, 81, 63])),
        (np.array([25, 67, 47]), np.array([52, 92, 65])),
        (np.array([240, 242, 239]), np.array([240, 242, 239]))
    ]

    # Membuat masker warna untuk rentang warna yang ingin dihindari
    avoid_color_mask = np.zeros(image_array.shape[:2], dtype=bool)
    for lower_color, upper_color in avoid_ranges:
        avoid_color_mask |= np.all((image_array >= lower_color) & (image_array <= upper_color), axis=-1)

    # Membuat masker warna untuk rentang warna yang ingin disegmentasi
    # ...

```

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```

color_mask = np.zeros(image_array.shape[:2], dtype=bool)
for lower_color, upper_color in color_ranges:
    color_mask |= np.all((image_array >= lower_color) & (image_array <= upper_color), axis=-1)

# Menghilangkan area yang ingin dihindari dari masker warna hasil segmentasi
color_mask &= ~avoid_color_mask

return color_mask

def show_image(image_array, color_mask):
    # Buat gambar hasil segmentasi
    segmented_array = np.zeros_like(image_array)
    segmented_array[color_mask] = image_array[color_mask]

    # Tampilkan gambar asli dan gambar yang telah disegmentasi
    fig, axes = plt.subplots(1, 2, figsize=(10, 5))
    axes[0].imshow(image_array)
    axes[0].set_title('Original Image')
    axes[0].axis('off')

    axes[1].imshow(segmented_array)
    axes[1].set_title('Segmented Image')
    axes[1].axis('off')

    plt.show()

def upload_image(filename):
    try:
        image = Image.open(filename)
        image_array = np.array(image)
        color_mask = segment_image(image_array)
        return image_array, color_mask
    except Exception as e:
        print(e)
        return None, None

test = [
    '/content/drive/MyDrive/bayam hijau/minggu 2/2023-08-28_13_19_38.jpg',
    '/content/drive/MyDrive/bayam hijau/minggu 3/2023-09-06_12_31_19.jpg',
    '/content/drive/MyDrive/bayam hijau/minggu 4/2023-09-13_00_45_18.jpg',
    '/content/drive/MyDrive/bayam hijau/minggu 3/2023-09-08_15_38_22.jpg',
    '/content/drive/MyDrive/bayam hijau/minggu 2/2023-09-02_14_39_23.jpg',
    '/content/drive/MyDrive/bayam hijau/minggu 2/2023-08-29_01_21_31.jpg',
    '/content/drive/MyDrive/bayam hijau/minggu 4/2023-09-13_03_46_40.jpg',
    '/content/drive/MyDrive/bayam hijau/minggu 4/2023-09-15_10_17_44.jpg',
    '/content/drive/MyDrive/bayam hijau/minggu 2/2023-09-05_10_14_36.jpg',
    '/content/drive/MyDrive/bayam hijau/minggu 2/2023-09-04_06_54_48.jpg'
]

for loop in test:
    image_array, color_mask = upload_image(loop)
    num_pixels = np.sum(color_mask)
    print(num_pixels)
    print(loop)
    show_image(image_array, color_mask)

```

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segment images puth - Colaboratory

184218  
/content/drive/MyDrive/bayan hijau/minggu 2/2023-08-28\_13\_19\_38.jpg

Original Image



Segmented Image



367398  
/content/drive/MyDrive/bayan hijau/minggu 3/2023-09-06 12 31 19.jpg

Original Image



Segmented Image



594981  
/content/drive/MyDrive/bayan hijau/minggu 4/2023-09-13\_00\_45\_18.jpg

Original Image



Segmented Image



411918  
/content/drive/MyDrive/bayan hijau/minggu 3/2023-09-08\_15\_38\_22.jpg

Original Image



Segmented Image



312868  
/content/drive/MyDrive/bayan hijau/minggu 7/2023-09-07 14 29 03.jpg

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segment images puth - Colaboratory

Original Image



Segmented Image



259912

/content/drive/MyDrive/bayam hijau/minggu 2/2023-08-29 01 21 31.jpg

Original Image



Segmented Image



576874

/content/drive/MyDrive/bayam hijau/minggu 4/2023-09-13 03 46 48.jpg

Original Image



Segmented Image



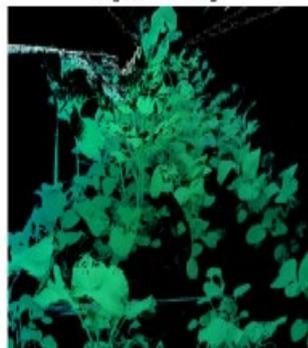
506229

/content/drive/MyDrive/bayam hijau/minggu 4/2023-09-15 10 17 44.jpg

Original Image



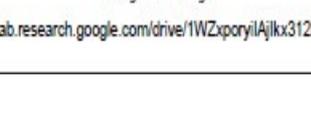
Segmented Image



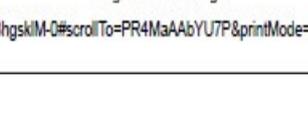
398756

/content/drive/MyDrive/bayam hijau/minggu 2/2023-09-05 10 14 36.jpg

Original Image

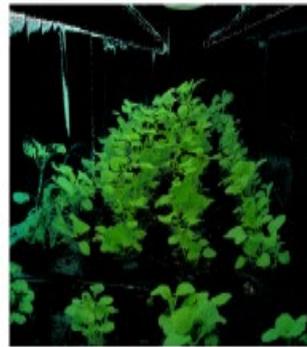


Segmented Image



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```

#evaluate the algorithm to classify

def classify_image(filename):
    _color_mask = upload_image(filename)
    if color_mask is None:
        return "wrong data"
    num_pixels = np.sum(color_mask)

    if num_pixels <= 360000:
        return (0, num_pixels, filename)
    elif num_pixels <= 500000:
        return (1, num_pixels, filename)
    else:
        return (2, num_pixels, filename)

image_pixels = []
image_groups = []
predict_groups = []

import os

for image in os.listdir("/content/drive/MyDrive/bayam hijau/minggu 2"):
    results = classify_image("/content/drive/MyDrive/bayam hijau/minggu 2/"+image)

    # untuk clustering, 1 kali saja hehe
    image_pixels.append(results[1])
    image_groups.append(0)
    predict_groups.append(results[0])

for image in os.listdir("/content/drive/MyDrive/bayam hijau/minggu 3"):
    results = classify_image("/content/drive/MyDrive/bayam hijau/minggu 3/"+image)
    if results == "wrong data":
        continue

    # untuk clustering, 1 kali saja hehe
    image_pixels.append(results[1])
    image_groups.append(1)
    predict_groups.append(results[0])

for image in os.listdir("/content/drive/MyDrive/bayam hijau/minggu 4"):
    results = classify_image("/content/drive/MyDrive/bayam hijau/minggu 4/"+image)

    # untuk clustering, 1 kali saja hehe
    image_pixels.append(results[1])
    image_groups.append(2)
    predict_groups.append(results[0])

cannot identify image file '/content/drive/MyDrive/bayam hijau/minggu 3/2023-09-06_12_49_33.jpg'

# Import necessary libraries
import numpy as np
from sklearn.cluster import KMeans
from sklearn.metrics import confusion_matrix, accuracy_score
import matplotlib.pyplot as plt

print(confusion_matrix(image_groups, predict_groups))
print(f"Accuracy (might need rearrangement): {accuracy_score(image_groups, predict_groups)}")

```

<https://colab.research.google.com/drive/1WZxporYlAjlKx312Nhe0w83hgsKlM-0#scrollTo=PR4MaAAbYU7P&printMode=true>

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```

[[100 14  0]
 [  0 23 12]
 [  0 17 47]]
Accuracy (might need rearrangement): 0.8532423208191127

# Import necessary libraries
from sklearn.ensemble import RandomForestClassifier
from sklearn.model_selection import train_test_split
from sklearn.metrics import accuracy_score, classification_report
import numpy as np

# Split the data into training and test sets (70% train, 30% test)
X_train, X_test, y_train, y_test = train_test_split(image_pixel_values, image_groups, test_size=0.3, random_state=42)

# Create a random forest classifier and train it
clf = RandomForestClassifier(n_estimators=200, random_state=0)
clf.fit(X_train, y_train)

# Predict the labels of the test set
y_pred = clf.predict(X_test)

# Print the accuracy and classification report
print(f"Accuracy: {accuracy_score(y_test, y_pred) * 100:.2f}%")

Accuracy: 87.50%

cm = confusion_matrix(y_test, y_pred)
print(cm)

[[ 61  1  0]
 [  0  5  4]
 [  0  6 11]]

# save the model
import joblib
joblib.dump(clf, 'bayan_putih.pkl')

['bayan_putih.pkl']

```

## Lampiran 2. Python Notebook untuk Pembuatan Model Machine Learning pada Tingkat Pertumbuhan Bayam Batik

```

10/11/23, 10:49 AM segment images batik - Colaboratory

from google.colab import drive
drive.mount('/content/drive')

!unzip /content/drive/MyDrive/camerapi.zip -d /content/camerapi

Archive: /content/drive/MyDrive/camerapi.zip
inflating: /content/camerapi/camerapi/2023-05-16_19-39-47
inflating: /content/camerapi/camerapi/2023-05-16_20-39-48
inflating: /content/camerapi/camerapi/2023-05-16_21-39-50
inflating: /content/camerapi/camerapi/2023-05-16_22-39-51
inflating: /content/camerapi/camerapi/2023-05-16_23-39-53
inflating: /content/camerapi/camerapi/2023-05-17_00-39-55
inflating: /content/camerapi/camerapi/2023-05-17_01-39-56
inflating: /content/camerapi/camerapi/2023-05-17_02-39-58
inflating: /content/camerapi/camerapi/2023-05-17_03-40-00
inflating: /content/camerapi/camerapi/2023-05-17_04-40-01
inflating: /content/camerapi/camerapi/2023-05-17_05-40-03
inflating: /content/camerapi/camerapi/2023-05-17_06-40-05
inflating: /content/camerapi/camerapi/2023-05-17_07-40-06
inflating: /content/camerapi/camerapi/2023-05-17_08-40-08
inflating: /content/camerapi/camerapi/2023-05-17_09-40-09
inflating: /content/camerapi/camerapi/2023-05-17_10-40-11
inflating: /content/camerapi/camerapi/2023-05-17_11-40-12
inflating: /content/camerapi/camerapi/2023-05-17_12-40-14
inflating: /content/camerapi/camerapi/2023-05-17_13-40-16
inflating: /content/camerapi/camerapi/2023-05-17_14-40-17
inflating: /content/camerapi/camerapi/2023-05-17_15-40-19
inflating: /content/camerapi/camerapi/2023-05-17_16-40-20
inflating: /content/camerapi/camerapi/2023-05-17_17-40-22
inflating: /content/camerapi/camerapi/2023-05-17_18-40-24
inflating: /content/camerapi/camerapi/2023-05-17_19-40-25
inflating: /content/camerapi/camerapi/2023-05-17_20-19-17
inflating: /content/camerapi/camerapi/2023-05-17_21-19-19
inflating: /content/camerapi/camerapi/2023-05-17_22-19-20
inflating: /content/camerapi/camerapi/2023-05-17_23-19-22
inflating: /content/camerapi/camerapi/2023-05-18_00-19-23
inflating: /content/camerapi/camerapi/2023-05-18_01-19-25
inflating: /content/camerapi/camerapi/2023-05-18_02-19-27
inflating: /content/camerapi/camerapi/2023-05-18_03-19-28
inflating: /content/camerapi/camerapi/2023-05-18_04-19-30
inflating: /content/camerapi/camerapi/2023-05-18_05-19-31
inflating: /content/camerapi/camerapi/2023-05-18_06-19-33
inflating: /content/camerapi/camerapi/2023-05-18_07-19-34
inflating: /content/camerapi/camerapi/2023-05-18_08-19-36
inflating: /content/camerapi/camerapi/2023-05-18_09-19-38
inflating: /content/camerapi/camerapi/2023-05-18_10-19-39
inflating: /content/camerapi/camerapi/2023-05-18_11-19-41
inflating: /content/camerapi/camerapi/2023-05-18_12-19-42
inflating: /content/camerapi/camerapi/2023-05-18_13-19-44
inflating: /content/camerapi/camerapi/2023-05-18_14-19-46
inflating: /content/camerapi/camerapi/2023-05-18_15-19-47
inflating: /content/camerapi/camerapi/2023-05-18_16-19-49
inflating: /content/camerapi/camerapi/2023-05-18_17-19-50
inflating: /content/camerapi/camerapi/2023-05-18_18-19-52
inflating: /content/camerapi/camerapi/2023-05-18_19-19-53
inflating: /content/camerapi/camerapi/2023-05-18_20-19-55
inflating: /content/camerapi/camerapi/2023-05-18_21-19-57
inflating: /content/camerapi/camerapi/2023-05-18_22-19-58
inflating: /content/camerapi/camerapi/2023-05-18_23-20-00
inflating: /content/camerapi/camerapi/2023-05-19_00-20-01
inflating: /content/camerapi/camerapi/2023-05-19_01-20-03
inflating: /content/camerapi/camerapi/2023-05-19_02-20-05
inflating: /content/camerapi/camerapi/2023-05-19_03-20-06

!rm /content/camerapi/camerapi/2023-05-28_20-07-24

import os

def makedir(dir):
    if not os.path.exists(dir):
        os.makedirs(dir, exist_ok=True)

makedir("/content/week2")
makedir("/content/week3")
makedir("/content/week4")

https://colab.research.google.com/drive/1WdBhXv5ID3eHnAbcpv2QLnWXakC24jZp#printMode=true 1/8

```

10/11/23, 10:40 AM

segment images batik - Colaboratory

```

import re
import os

week_2_data = []
week_3_data = []
week_4_data = []

for data in os.listdir("/content/camerapi/camerapi"):
    re_data = re.search(r"(\d+)-(\d+)-(\d+)-(\d+)-(\d+)", data)
    month, date = int(re_data[2]), int(re_data[3])
    # print(month, date)

    if month == 5:
        if date < 20:
            week_2_data.append(data)
        elif date < 24:
            week_3_data.append(data)
        else:
            week_4_data.append(data)
    else:
        if date < 5:
            week_4_data.append(data)

import shutil

for data in range(len(week_2_data)):
    shutil.copy("/content/camerapi/camerapi/"+week_2_data[data], "/content/week2/"+week_2_data[data])

for data in range(len(week_3_data)):
    shutil.copy("/content/camerapi/camerapi/"+week_3_data[data], "/content/week3/"+week_3_data[data])

for data in range(len(week_4_data)):
    shutil.copy("/content/camerapi/camerapi/"+week_4_data[data], "/content/week4/"+week_4_data[data])

print(len(week_2_data))

77

print(len(week_3_data))

96

print(len(week_4_data))

173

from PIL import Image
import numpy as np
import matplotlib.pyplot as plt

def segment_image(image_array):
    # Tentukan rentang warna yang ingin disegmentasi dalam format RGB
    color_ranges = [
        # Rentang warna minggu 2
        (np.array([65, 101, 50]), np.array([121, 144, 119])),
        (np.array([62, 80, 49]), np.array([124, 167, 99])),
        (np.array([68, 76, 75]), np.array([128, 146, 136])),
        (np.array([87, 97, 80]), np.array([133, 175, 139])),
        (np.array([70, 99, 71]), np.array([131, 183, 133])),
        (np.array([67, 80, 68]), np.array([99, 117, 101])),
        (np.array([84, 96, 88]), np.array([110, 122, 111])),
        (np.array([59, 70, 57]), np.array([143, 177, 130])),
        (np.array([72, 90, 66]), np.array([134, 164, 131])),
        (np.array([69, 127, 107]), np.array([139, 137, 140])),
        (np.array([61, 84, 48]), np.array([143, 188, 133])),
        (np.array([76, 88, 74]), np.array([119, 148, 123])),
        (np.array([85, 104, 78]), np.array([157, 171, 136])),
        (np.array([83, 103, 84]), np.array([151, 198, 151])),
        # Rentang warna minggu 3
        (np.array([97, 94, 64]), np.array([170, 196, 141])),
        # Rentang warna minggu 4
        (np.array([44, 137, 65]), np.array([96, 208, 168])),
        (np.array([23, 77, 60]), np.array([57, 114, 129]))
    ]

```

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segment images batik - Colaboratory

```

# Rentang warna yang ingin dihindari dalam format RGB
avoid_ranges = [
    # Rentang warna minggu 2
    (np.array([52, 62, 57]), np.array([109, 107, 111])),
    (np.array([101, 120, 101]), np.array([126, 153, 127])),
    (np.array([76, 98, 95]), np.array([103, 123, 117])),
    (np.array([88, 127, 107]), np.array([93, 137, 140])),
    (np.array([63, 84, 89]), np.array([102, 136, 137])),
    (np.array([96, 150, 139]), np.array([116, 165, 170])),
    (np.array([113, 138, 121]), np.array([168, 198, 153])),
    (np.array([95, 116, 94]), np.array([117, 161, 161])),
    # Rentang warna minggu 3
    (np.array([75, 106, 96]), np.array([139, 142, 156])),
    (np.array([103, 162, 160]), np.array([112, 165, 164])),
    # Rentang warna minggu 4
    (np.array([15, 54, 61]), np.array([59, 115, 110]))
]

# Membuat masker warna untuk rentang warna yang ingin dihindari
avoid_color_mask = np.zeros(image_array.shape[:2], dtype=bool)
for lower_color, upper_color in avoid_ranges:
    avoid_color_mask |= np.all((image_array >= lower_color) & (image_array <= upper_color), axis=-1)

# Membuat masker warna untuk rentang warna yang ingin disegmentasi
color_mask = np.zeros(image_array.shape[:2], dtype=bool)
for lower_color, upper_color in color_ranges:
    color_mask |= np.all((image_array >= lower_color) & (image_array <= upper_color), axis=-1)

# Menghilangkan area yang ingin dihindari dari masker warna hasil segmentasi
color_mask &= ~avoid_color_mask

return color_mask

def show_image(image_array, color_mask):
    # Buat gambar hasil segmentasi
    segmented_array = np.zeros_like(image_array)
    segmented_array[color_mask] = image_array[color_mask]

    # Tampilkan gambar asli dan gambar yang telah disegmentasi
    fig, axes = plt.subplots(1, 2, figsize=(10, 5))
    axes[0].imshow(image_array)
    axes[0].set_title('Original Image')
    axes[0].axis('off')

    axes[1].imshow(segmented_array)
    axes[1].set_title('Segmented Image')
    axes[1].axis('off')

    plt.show()

def upload_image(filename):
    try:
        image = Image.open(filename)
        image_array = np.array(image)
        color_mask = segment_image(image_array)
        return image_array, color_mask
    except Exception as e:
        print(e)
        return None, None

test = [
    "/content/camerapi/camerapi/2023-05-16_19-39-47",
    "/content/camerapi/camerapi/2023-05-22_00-21-56",
    "/content/camerapi/camerapi/2023-05-20_17-21-07",
    "/content/camerapi/camerapi/2023-05-29_21-07-26",
    "/content/camerapi/camerapi/2023-05-29_01-07-32",
    "/content/camerapi/camerapi/2023-06-04_02-11-25",
    "/content/camerapi/camerapi/2023-06-10_22-29-51",
    "/content/week2/2023-05-17_16-40-20",
    "/content/week2/2023-05-19_17-20-28",
    "/content/week3/2023-05-23_22-23-10"
]

```

<https://colab.research.google.com/drive/1WdBhXv5ID3eHnAbcpv2QLnWXakC24jZp#printMode=true>

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10/11/23, 10:49 AM

segment images batik - Colaboratory

```

for loop in test:
    image_array, color_mask = upload_image(loop)
    num_pixels = np.sum(color_mask)
    print(num_pixels)
    print(loop)
    show_image(image_array, color_mask)

```

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segment images batik - Colaboratory

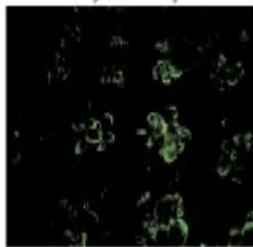
111683

/content/camerapi/camerapi/2023-05-16\_19-39-47

Original Image



Segmented Image



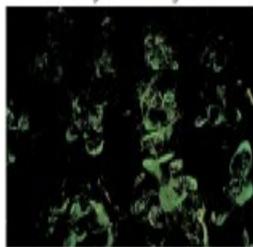
227937

/content/camerapi/camerapi/2023-05-22\_00-21-56

Original Image



Segmented Image



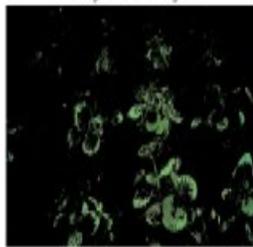
178569

/content/camerapi/camerapi/2023-05-20\_17-21-07

Original Image



Segmented Image



634827

/content/camerapi/camerapi/2023-05-28\_21-07-26

Original Image



Segmented Image



576540

/content/camerapi/camerapi/2023-05-29\_01-07-32

Original Image



Segmented Image



10/11/23, 10:49 AM

segment images batik - Colaboratory

```

#evaluste the algorithm to classify

def classify_image(filename):
    _, color_mask = upload_image(filename)
    if color_mask is None:
        return "wrong data"
    num_pixels = np.sum(color_mask)

    if num_pixels <= 200000:
        return (0, num_pixels, filename)
    elif num_pixels <= 500000:
        return (1, num_pixels, filename)
    else:
        return (2, num_pixels, filename)

image_pixels = []
image_groups = []
predict_groups = []
wrong_image = []

import os

for image in os.listdir("/content/week2"):
    results = classify_image("/content/week2/"+image)

    # untuk clustering, 1 kali saja hehe
    image_pixels.append(results[1])
    image_groups.append(0)
    predict_groups.append(results[0])

    if results[0] != 0:
        wrong_image.append([image, results[2]])

for image in os.listdir("/content/week3"):
    results = classify_image("/content/week3/"+image)
    if results == "wrong data":
        continue

    # untuk clustering, 1 kali saja hehe
    image_pixels.append(results[1])
    image_groups.append(1)
    predict_groups.append(results[0])

    if results[0] != 1:
        wrong_image.append([image, results[2]])

for image in os.listdir("/content/week4"):
    results = classify_image("/content/week4/"+image)

    # untuk clustering, 1 kali saja hehe
    image_pixels.append(results[1])
    image_groups.append(2)
    predict_groups.append(results[0])

    if results[0] != 2:
        wrong_image.append([image, results[2]])

-----
KeyboardInterrupt                                Traceback (most recent call last)
<ipython-input-23-36ee22aeb6e> in <cell line: 8>()
      7
----> 8 for image in os.listdir("/content/week2"):
      9     results = classify_image("/content/week2/"+image)
     10
     11     # untuk clustering, 1 kali saja hehe

-----
3 frames
/usr/local/lib/python3.10/dist-packages/numpy/core/overrides.py in all(*args, **kwargs)

KeyboardInterrupt:

SEARCH STACK OVERFLOW

```

```

# Import necessary libraries
import numpy as np

```

<https://colab.research.google.com/drive/1WdBhXv5ID3eHnAbcpv2QLnWXakC24jZp#printMode=true>

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### Lampiran 3. Python Notebook untuk Pembuatan Model Machine Learning pada Tingkat Pertumbuhan Bayam Merah

```

12/10/23, 11:11 AM segment images merah - Colaboratory

from google.colab import drive
drive.mount('/content/drive')

Mounted at /content/drive

!unzip "/content/drive/MyDrive/bayam_merah_fix_data (1).zip" -d /content/bayam_merah

Archive: /content/drive/MyDrive/bayam_merah_fix_data (1).zip
extracting: /content/bayam_merah/content/week2/2023-11-13_17:44:05_1194.88_6.4_24.8_79.8.jpg
extracting: /content/bayam_merah/content/week2/2023-11-17_23:36:44_1185.45_6.66_24.8_79.8.jpg
extracting: /content/bayam_merah/content/week2/2023-11-17_00:32:43_1171.09_6.7_24.8_79.8.jpg
extracting: /content/bayam_merah/content/week2/2023-11-18_02:37:19_1187.34_6.3_24.8_79.8.jpg
extracting: /content/bayam_merah/content/week2/2023-11-13_16:43:53_1188.4_6.66_24.8_79.8.jpg
extracting: /content/bayam_merah/content/week2/2023-11-19_00:41:46_1160.28_6.15_24.8_79.8.jpg
extracting: /content/bayam_merah/content/week2/2023-11-15_00:50:15_1159.36_6.15_24.8_79.8.jpg
extracting: /content/bayam_merah/content/week2/2023-11-16_17:30:08_1170.2_6.42_24.8_79.8.jpg
extracting: /content/bayam_merah/content/week2/2023-11-13_14:43:31_1173.58_6.66_24.8_79.8.jpg
extracting: /content/bayam_merah/content/week2/2023-11-18_09:38:40_1169.35_6.23_24.8_79.8.jpg
extracting: /content/bayam_merah/content/week2/2023-11-14_06:46:28_1150.06_6.23_24.8_79.8.jpg
extracting: /content/bayam_merah/content/week2/2023-11-19_07:43:05_1152.95_6.05_24.8_79.8.jpg
extracting: /content/bayam_merah/content/week2/2023-11-14_23:50:03_1180.11_6.54_24.8_79.8.jpg
extracting: /content/bayam_merah/content/week2/2023-11-16_20:32:04_1168.02_6.69_24.8_79.8.jpg
extracting: /content/bayam_merah/content/week2/2023-11-13_19:44:27_1157.36_6.02_24.8_79.8.jpg
extracting: /content/bayam_merah/content/week2/2023-11-13_23:45:23_1181.55_6.64_24.8_79.8.jpg
extracting: /content/bayam_merah/content/week2/2023-11-18_03:37:31_1157.78_6.02_24.8_79.8.jpg
extracting: /content/bayam_merah/content/week2/2023-11-17_09:34:20_1189.66_6.17_24.8_79.8.jpg
extracting: /content/bayam_merah/content/week2/2023-11-18_20:40:53_1177.13_6.8_24.8_79.8.jpg
extracting: /content/bayam_merah/content/week2/2023-11-16_18:07:18_1183.41_6.68_24.8_79.8.jpg
extracting: /content/bayam_merah/content/week2/2023-11-17_14:35:28_1156.7_6.67_24.8_79.8.jpg
extracting: /content/bayam_merah/content/week2/2023-11-14_11:47:10_1156.44_6.6_24.8_79.8.jpg
extracting: /content/bayam_merah/content/week2/2023-11-14_04:46:05_1185.7_6.99_24.8_79.8.jpg
extracting: /content/bayam_merah/content/week2/2023-11-16_21:32:16_1184.69_6.96_24.8_79.8.jpg
extracting: /content/bayam_merah/content/week2/2023-11-18_10:38:52_1193.15_6.56_24.8_79.8.jpg
extracting: /content/bayam_merah/content/week2/2023-11-14_14:48:16_1152.78_6.16_24.8_79.8.jpg
extracting: /content/bayam_merah/content/week2/2023-11-16_16:29:54_1157.46_6.97_24.8_79.8.jpg
extracting: /content/bayam_merah/content/week2/2023-11-17_13:35:25_1164.59_6.79_24.8_79.8.jpg
extracting: /content/bayam_merah/content/week2/2023-11-19_11:43:52_1169.04_6.13_24.8_79.8.jpg
extracting: /content/bayam_merah/content/week2/2023-11-17_05:33:33_1193.63_6.71_24.8_79.8.jpg
extracting: /content/bayam_merah/content/week2/2023-11-14_17:48:55_1181.54_6.58_24.8_79.8.jpg
extracting: /content/bayam_merah/content/week2/2023-11-17_07:33:57_1191.94_6.41_24.8_79.8.jpg
extracting: /content/bayam_merah/content/week2/2023-11-17_10:34:50_1177.39_6.15_24.8_79.8.jpg
extracting: /content/bayam_merah/content/week2/2023-11-16_14:18:30_1158.12_6.62_24.8_79.8.jpg
extracting: /content/bayam_merah/content/week2/2023-11-15_11:52:19_1185.4_6.12_24.8_79.8.jpg
extracting: /content/bayam_merah/content/week2/2023-11-18_17:40:25_1186.81_6.23_24.8_79.8.jpg
extracting: /content/bayam_merah/content/week2/2023-11-18_19:40:41_1180.61_6.38_24.8_79.8.jpg
extracting: /content/bayam_merah/content/week2/2023-11-14_10:46:58_1160.09_6.04_24.8_79.8.jpg
extracting: /content/bayam_merah/content/week2/2023-11-18_23:41:35_1162.71_6.64_24.8_79.8.jpg
extracting: /content/bayam_merah/content/week2/2023-11-18_05:37:55_1157.74_6.9_24.8_79.8.jpg
extracting: /content/bayam_merah/content/week2/2023-11-16_19:31:53_1184.95_6.6_24.8_79.8.jpg
extracting: /content/bayam_merah/content/week2/2023-11-17_12:35:13_1188.21_6.55_24.8_79.8.jpg
extracting: /content/bayam_merah/content/week2/2023-11-19_12:44:03_1168.37_6.81_24.8_79.8.jpg
extracting: /content/bayam_merah/content/week2/2023-11-15_12:52:34_1157.94_6.06_24.8_79.8.jpg
extracting: /content/bayam_merah/content/week2/2023-11-19_06:42:54_1173.11_6.86_24.8_79.8.jpg
extracting: /content/bayam_merah/content/week2/2023-11-16_09:07:05_1159.83_6.89_24.8_79.8.jpg
extracting: /content/bayam_merah/content/week2/2023-11-14_07:46:31_1165.28_6.4_24.8_79.8.jpg
extracting: /content/bayam_merah/content/week2/2023-11-15_13:52:46_1191.02_6.81_24.8_79.8.jpg
extracting: /content/bayam_merah/content/week2/2023-11-16_18:31:40_1165.39_6.94_24.8_79.8.jpg
extracting: /content/bayam_merah/content/week2/2023-11-17_22:36:30_1178.26_6.57_24.8_79.8.jpg
extracting: /content/bayam_merah/content/week2/2023-11-15_04:50:56_1163.82_6.08_24.8_79.8.jpg
extracting: /content/bayam_merah/content/week2/2023-11-18_08:38:29_1188.26_6.05_24.8_79.8.jpg
extracting: /content/bayam_merah/content/week2/2023-11-14_19:49:17_1162.09_6.25_24.8_79.8.jpg
extracting: /content/bayam_merah/content/week2/2023-11-17_18:36:09_1189.5_6.4_24.8_79.8.jpg
extracting: /content/bayam_merah/content/week2/2023-11-14_13:47:42_1190.02_6.05_24.8_79.8.jpg
extracting: /content/bayam_merah/content/week2/2023-11-17_06:33:45_1164.99_6.63_24.8_79.8.jpg
extracting: /content/bayam_merah/content/week2/2023-11-14_08:46:34_1173.27_6.69_24.8_79.8.jpg

import os

len(os.listdir("/content/bayam_merah/content/week2"))

130

len(os.listdir("/content/bayam_merah/content/week3"))

123

len(os.listdir("/content/bayam_merah/content/week4"))

https://colab.research.google.com/drive/1cBjPlxa5HeV_3WLFrsvoNH3g8A_F1o1#printMode=true 1/6

```

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segment images merah - Colaboratory

```

from PIL import Image
import numpy as np
import matplotlib.pyplot as plt

def segment_image(image_array):
    # Tentukan rentang warna yang ingin disegmentasi dalam format RGB
    color_ranges = [
        # Rentang warna minggu 2
        (np.array([70, 117, 17]), np.array([136, 213, 91])),
        (np.array([25, 96, 6]), np.array([72, 152, 63])),
        (np.array([58, 53, 13]), np.array([93, 122, 84])),
        (np.array([72, 90, 74]), np.array([89, 112, 87])),
        (np.array([83, 85, 27]), np.array([97, 117, 91])),
        (np.array([48, 115, 62]), np.array([66, 136, 77])),
        (np.array([77, 100, 85]), np.array([61, 108, 91])),
        # Rentang warna minggu 3
        (np.array([60, 114, 0]), np.array([102, 199, 51])),
        (np.array([109, 127, 74]), np.array([129, 158, 93])),
        (np.array([87, 146, 49]), np.array([108, 191, 85])),
        (np.array([73, 47, 67]), np.array([87, 136, 92])),
        (np.array([39, 54, 59]), np.array([63, 83, 81])),
        # Rentang warna minggu 4
        (np.array([104, 183, 77]), np.array([155, 238, 126])),
        (np.array([117, 188, 0]), np.array([176, 243, 7])),
        (np.array([195, 236, 145]), np.array([241, 245, 229])),
        (np.array([92, 189, 0]), np.array([120, 216, 55])),
        (np.array([24, 52, 6]), np.array([65, 103, 45])),
        (np.array([35, 78, 59]), np.array([55, 99, 81])),
        (np.array([43, 113, 17]), np.array([71, 153, 45])),
        (np.array([24, 52, 6]), np.array([65, 103, 45])),
        (np.array([129, 213, 0]), np.array([174, 243, 36])),
        (np.array([25, 60, 49]), np.array([52, 98, 72])),
        (np.array([55, 84, 52]), np.array([69, 101, 63])),
        (np.array([34, 87, 58]), np.array([53, 128, 70])),
        (np.array([62, 107, 61]), np.array([83, 154, 78])),
        (np.array([68, 96, 71]), np.array([83, 106, 81])),
        (np.array([26, 53, 44]), np.array([69, 101, 72])),
        (np.array([25, 71, 53]), np.array([65, 96, 75])),
        (np.array([50, 135, 59]), np.array([67, 144, 76])),
        (np.array([30, 51, 35]), np.array([69, 130, 80]))
    ]

    # Rentang warna yang ingin dihindari dalam format RGB
    avoid_ranges = [
        # Rentang warna minggu 2
        (np.array([58, 82, 58]), np.array([66, 88, 64])),
        # (np.array([41, 88, 73]), np.array([72, 108, 84])),
        (np.array([32, 69, 62]), np.array([59, 89, 89])),
        (np.array([58, 82, 58]), np.array([66, 88, 64])),
        (np.array([103, 136, 89]), np.array([158, 197, 127])),
        (np.array([44, 91, 77]), np.array([63, 102, 84])),
        # Rentang warna minggu 3
        (np.array([62, 96, 69]), np.array([74, 110, 84])),
        (np.array([68, 106, 77]), np.array([104, 141, 99])),
        (np.array([25, 79, 58]), np.array([52, 108, 72])),
        (np.array([17, 56, 53]), np.array([28, 71, 61])),
        (np.array([19, 63, 37]), np.array([30, 73, 63])),
        (np.array([21, 66, 57]), np.array([31, 80, 73])),
        (np.array([66, 93, 59]), np.array([109, 135, 87])),
        (np.array([19, 58, 56]), np.array([29, 68, 65])),
        (np.array([52, 87, 72]), np.array([63, 102, 87])),
        (np.array([20, 91, 76]), np.array([51, 105, 85])),
        # Rentang warna minggu 4
        (np.array([30, 65, 52]), np.array([40, 74, 62])),
        (np.array([33, 65, 44]), np.array([51, 93, 71])),
        (np.array([55, 90, 66]), np.array([62, 97, 73])),
        (np.array([31, 87, 76]), np.array([42, 92, 83])),
        (np.array([24, 54, 40]), np.array([36, 67, 53])),
        (np.array([22, 59, 54]), np.array([29, 67, 62])),
        (np.array([88, 119, 71]), np.array([166, 200, 114]))
    ]

    # Membuat masker warna untuk rentang warna yang ingin dihindari
    avoid_color_mask = np.zeros(image_array.shape[:2], dtype=bool)
    for lower_color, upper_color in avoid_ranges:
        avoid_color_mask |= np.all((image_array >= lower_color) & (image_array <= upper_color), axis=-1)

```

[https://colab.research.google.com/drive/1cBJP1xa5HeV\\_3WLFrsvoNH3g6A\\_F1o1#printMode=true](https://colab.research.google.com/drive/1cBJP1xa5HeV_3WLFrsvoNH3g6A_F1o1#printMode=true)

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segment images merah - Colaboratory

```

# Membuat masker warna untuk rentang warna yang ingin disegmentasi
color_mask = np.zeros(image_array.shape[:2], dtype=bool)
for lower_color, upper_color in color_ranges:
    color_mask |= np.all((image_array >= lower_color) & (image_array <= upper_color), axis=-1)

# Menghilangkan area yang ingin dihindari dari masker warna hasil segmentasi
color_mask &= ~avoid_color_mask

return color_mask

def show_image(image_array, color_mask):
    # Buat gambar hasil segmentasi
    segmented_array = np.zeros_like(image_array)
    segmented_array[color_mask] = image_array[color_mask]

    # Tampilkan gambar asli dan gambar yang telah disegmentasi
    fig, axes = plt.subplots(1, 2, figsize=(10, 5))
    axes[0].imshow(image_array)
    axes[0].set_title('Original Image')
    axes[0].axis('off')

    axes[1].imshow(segmented_array)
    axes[1].set_title('Segmented Image')
    axes[1].axis('off')

    plt.show()

def upload_image(filename):
    try:
        image = Image.open(filename)
        image_array = np.array(image)
        color_mask = segment_image(image_array)
        return image_array, color_mask
    except Exception as e:
        print(e)
        return None, None

test = [
    "/content/bayam_merah/content/week2/2023-11-13_14:43:31_1173.58_6.66_24.8_79.8.jpg",
    "/content/bayam_merah/content/week2/2023-11-19_01:41:57_1173.21_6.72_24.8_79.8.jpg",
    "/content/bayam_merah/content/week3/2023-11-20_12:20:58_1169.13_6.38_24.8_79.8.jpg",
    "/content/bayam_merah/content/week3/2023-11-26_00:51:13_1188.81_6.94_24.8_79.8.jpg",
    "/content/bayam_merah/content/week4/2023-11-28_02:44:03_1184.31_6.69_24.8_79.8.jpg",
    "/content/bayam_merah/content/week4/2023-12-06_22:53:49_1170.07_6.65_24.8_79.8.jpg"
]

for loop in test:
    image_array, color_mask = upload_image(loop)
    num_pixels = np.sum(color_mask)
    print(num_pixels)
    print(loop)
    show_image(image_array, color_mask)

```

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segment images merah - Colaboratory

46784

/content/bayam\_merah/content/week2/2023-11-13\_14:43:31\_1173\_58\_6\_66\_24\_8\_79\_8.jpg

Original Image



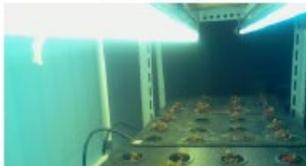
Segmented Image



53488

/content/bayam\_merah/content/week2/2023-11-19\_01:41:57\_1173\_21\_6\_72\_24\_8\_79\_8.jpg

Original Image



Segmented Image



#evaluate the algorithm to classify

```
def classify_image(filename):
    _, color_mask = upload_image(filename)
    if color_mask is None:
        return "wrong data"
    num_pixels = np.sum(color_mask)

    if num_pixels <= 54000:
        return (0, num_pixels, filename)
    elif num_pixels <= 120000:
        return (1, num_pixels, filename)
    else:
        return (2, num_pixels, filename)
```

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segment images merah - Colaboratory

```
image_pixels = []
image_groups = []
predict_groups = []
wrong_image = []

import os

for image in os.listdir("/content/bayam_merah/content/week2"):
    results = classify_image("/content/bayam_merah/content/week2/"+image)

    # untuk clustering, 1 kali saja hehe
    image_pixels.append(results[1])
    image_groups.append(0)
    #ndit mau ngumpul/narite-fall

# Import necessary libraries
import numpy as np
from sklearn.metrics import confusion_matrix, accuracy_score
import matplotlib.pyplot as plt

print(confusion_matrix(image_groups, predict_groups))
print(f"Accuracy (might need rearrangement): {accuracy_score(image_groups, predict_groups)}")

[[ 72  58  0]
 [ 21  98  4]
 [ 0  47 164]]
Accuracy (might need rearrangement): 0.7198275862068966

#ndit mau ngumpul/narite-fall

# show the wrong data
for image, filename in wrong_image:
    image_array, color_mask = upload_image(filename)
    num_pixels = np.sum(color_mask)
    print(num_pixels)
    print(filename)
    show_image(image_array, color_mask)
    -----

image_pixel_values = np.array(image_pixels).reshape(-1, 1)
predict_groups.append(results[0])

# Import necessary libraries
from sklearn.ensemble import RandomForestClassifier
from sklearn.model_selection import train_test_split
```

## Lampiran 4. Python Notebook untuk Pembuatan Model Machine Learning pada Tingkat Nutrisi Bayam

```

2/26/24, 9:55 AM segment image nutrisi - Colaboratory

from google.colab import drive
drive.mount('/content/drive')

Mounted at /content/drive

!unzip ~/content/drive/MyDrive/bayam_merah_fix_data (1).zip -d /content/bayam_merah

Archive: /content/drive/MyDrive/bayam_merah_fix_data (1).zip
  extracting: /content/bayam_merah/content/week2/2023-11-13_17:44:05_1194_89_6_4_24_8_79_8.jpg
  extracting: /content/bayam_merah/content/week2/2023-11-17_23:36:44_1185_45_6_66_24_8_79_8.jpg
  extracting: /content/bayam_merah/content/week2/2023-11-17_00:32:43_1171_09_6_7_24_8_79_8.jpg
  extracting: /content/bayam_merah/content/week2/2023-11-19_02:37:19_1187_34_6_3_24_8_79_8.jpg
  extracting: /content/bayam_merah/content/week2/2023-11-13_16:40:53_1188_4_5_66_24_8_79_8.jpg
  extracting: /content/bayam_merah/content/week2/2023-11-19_08:41:46_1168_28_6_15_24_8_79_8.jpg
  extracting: /content/bayam_merah/content/week2/2023-11-15_08:50:15_1159_36_6_15_24_8_79_8.jpg
  extracting: /content/bayam_merah/content/week2/2023-11-16_17:38:08_1178_2_6_42_24_8_79_8.jpg
  extracting: /content/bayam_merah/content/week2/2023-11-13_14:43:51_1175_58_6_66_24_8_79_8.jpg
  extracting: /content/bayam_merah/content/week2/2023-11-16_20:32:04_1165_02_6_69_24_8_79_8.jpg
  extracting: /content/bayam_merah/content/week2/2023-11-16_09:38:48_1169_35_6_23_24_8_79_8.jpg
  extracting: /content/bayam_merah/content/week2/2023-11-14_06:46:28_1158_06_6_23_24_8_79_8.jpg
  extracting: /content/bayam_merah/content/week2/2023-11-19_07:43:05_1152_95_6_05_24_8_79_8.jpg
  extracting: /content/bayam_merah/content/week2/2023-11-14_23:50:03_1188_11_6_54_24_8_79_8.jpg
  extracting: /content/bayam_merah/content/week2/2023-11-16_20:32:04_1165_02_6_69_24_8_79_8.jpg
  extracting: /content/bayam_merah/content/week2/2023-11-13_19:44:17_1157_36_6_02_24_8_79_8.jpg
  extracting: /content/bayam_merah/content/week2/2023-11-13_23:45:23_1181_55_6_64_24_8_79_8.jpg
  extracting: /content/bayam_merah/content/week2/2023-11-16_03:37:31_1157_78_6_02_24_8_79_8.jpg
  extracting: /content/bayam_merah/content/week2/2023-11-17_09:34:29_1189_66_6_17_24_8_79_8.jpg
  extracting: /content/bayam_merah/content/week2/2023-11-16_20:40:53_1177_11_6_24_8_79_8.jpg
  extracting: /content/bayam_merah/content/week2/2023-11-16_18:07:18_1183_41_6_68_24_8_79_8.jpg
  extracting: /content/bayam_merah/content/week2/2023-11-17_14:35:28_1156_7_6_67_24_8_79_8.jpg
  extracting: /content/bayam_merah/content/week2/2023-11-14_11:47:18_1156_44_6_24_8_79_8.jpg
  extracting: /content/bayam_merah/content/week2/2023-11-14_04:46:05_1185_7_6_99_24_8_79_8.jpg
  extracting: /content/bayam_merah/content/week2/2023-11-16_21:32:16_1184_69_6_96_24_8_79_8.jpg
  extracting: /content/bayam_merah/content/week2/2023-11-18_18:38:52_1193_15_6_56_24_8_79_8.jpg
  extracting: /content/bayam_merah/content/week2/2023-11-14_14:48:16_1152_78_6_16_24_8_79_8.jpg
  extracting: /content/bayam_merah/content/week2/2023-11-16_16:29:54_1157_46_6_97_24_8_79_8.jpg
  extracting: /content/bayam_merah/content/week2/2023-11-17_13:35:25_1164_59_6_79_24_8_79_8.jpg
  extracting: /content/bayam_merah/content/week2/2023-11-19_11:43:52_1169_04_6_13_24_8_79_8.jpg
  extracting: /content/bayam_merah/content/week2/2023-11-17_05:33:33_1193_63_6_71_24_8_79_8.jpg
  extracting: /content/bayam_merah/content/week2/2023-11-14_17:48:55_1181_54_6_58_24_8_79_8.jpg
  extracting: /content/bayam_merah/content/week2/2023-11-17_07:33:57_1191_94_6_41_24_8_79_8.jpg
  extracting: /content/bayam_merah/content/week2/2023-11-17_18:34:58_1177_39_6_15_24_8_79_8.jpg
  extracting: /content/bayam_merah/content/week2/2023-11-16_14:18:38_1158_12_6_62_24_8_79_8.jpg
  extracting: /content/bayam_merah/content/week2/2023-11-15_11:52:19_1185_4_6_12_24_8_79_8.jpg
  extracting: /content/bayam_merah/content/week2/2023-11-16_17:48:25_1186_81_6_23_24_8_79_8.jpg
  extracting: /content/bayam_merah/content/week2/2023-11-18_19:40:41_1188_61_6_38_24_8_79_8.jpg
  extracting: /content/bayam_merah/content/week2/2023-11-14_10:46:58_1168_09_6_04_24_8_79_8.jpg
  extracting: /content/bayam_merah/content/week2/2023-11-18_23:41:35_1162_71_6_64_24_8_79_8.jpg
  extracting: /content/bayam_merah/content/week2/2023-11-18_05:37:55_1157_74_6_9_24_8_79_8.jpg
  extracting: /content/bayam_merah/content/week2/2023-11-16_19:31:53_1184_95_6_24_8_79_8.jpg
  extracting: /content/bayam_merah/content/week2/2023-11-17_12:35:13_1188_11_6_55_24_8_79_8.jpg
  extracting: /content/bayam_merah/content/week2/2023-11-19_12:44:03_1166_37_6_81_24_8_79_8.jpg
  extracting: /content/bayam_merah/content/week2/2023-11-15_12:52:34_1157_94_6_06_24_8_79_8.jpg
  extracting: /content/bayam_merah/content/week2/2023-11-19_06:42:54_1173_11_6_06_24_8_79_8.jpg
  extracting: /content/bayam_merah/content/week2/2023-11-16_09:07:05_1159_83_6_89_24_8_79_8.jpg
  extracting: /content/bayam_merah/content/week2/2023-11-14_07:46:31_1165_28_6_4_24_8_79_8.jpg
  extracting: /content/bayam_merah/content/week2/2023-11-15_13:52:46_1191_02_6_81_24_8_79_8.jpg
  extracting: /content/bayam_merah/content/week2/2023-11-16_18:31:48_1165_39_6_94_24_8_79_8.jpg
  extracting: /content/bayam_merah/content/week2/2023-11-17_22:36:30_1178_26_6_57_24_8_79_8.jpg
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  extracting: /content/bayam_merah/content/week2/2023-11-18_08:38:29_1188_26_6_05_24_8_79_8.jpg
  extracting: /content/bayam_merah/content/week2/2023-11-14_19:48:17_1162_09_6_25_24_8_79_8.jpg
  extracting: /content/bayam_merah/content/week2/2023-11-17_18:36:09_1189_5_6_24_8_79_8.jpg
  extracting: /content/bayam_merah/content/week2/2023-11-14_13:47:42_1198_02_6_05_24_8_79_8.jpg
  extracting: /content/bayam_merah/content/week2/2023-11-17_06:33:45_1164_99_6_63_24_8_79_8.jpg
  extracting: /content/bayam_merah/content/week2/2023-11-14_08:46:34_1173_27_6_69_24_8_79_8.jpg

import os
print(len(os.listdir('/content/drive/MyDrive/new_malnutrisi')))
print(len(os.listdir('/content/drive/MyDrive/new_overnutrisi')))

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47

```

2/26/24, 9:55 AM

segment image nutrisi - Colaboratory

```

from PIL import Image
import numpy as np
import matplotlib.pyplot as plt

def segment_image(image_array):
    # Tentukan rentang warna yang ingin disegmentasi dalam format RGB
    color_ranges = [
        # Rentang warna minggu 2
        (np.array([70, 117, 17]), np.array([136, 213, 91])),
        (np.array([25, 96, 6]), np.array([72, 152, 63])),
        (np.array([58, 53, 13]), np.array([93, 122, 84])),
        (np.array([72, 90, 74]), np.array([89, 112, 87])),
        (np.array([83, 85, 27]), np.array([97, 117, 91])),
        (np.array([48, 115, 62]), np.array([66, 136, 77])),
        (np.array([77, 100, 85]), np.array([81, 100, 91])),
        # Rentang warna minggu 3
        (np.array([60, 114, 0]), np.array([102, 199, 51])),
        (np.array([109, 127, 74]), np.array([129, 158, 93])),
        (np.array([87, 146, 49]), np.array([108, 191, 85])),
        (np.array([73, 47, 67]), np.array([67, 136, 92])),
        (np.array([39, 54, 59]), np.array([63, 83, 81])),
        # Rentang warna minggu 4
        (np.array([104, 183, 77]), np.array([155, 238, 126])),
        (np.array([117, 188, 0]), np.array([176, 243, 7])),
        (np.array([195, 236, 145]), np.array([241, 245, 229])),
        (np.array([92, 189, 0]), np.array([120, 216, 55])),
        (np.array([24, 52, 6]), np.array([65, 103, 45])),
        (np.array([35, 78, 59]), np.array([55, 99, 81])),
        (np.array([43, 113, 17]), np.array([71, 153, 45])),
        (np.array([24, 52, 6]), np.array([65, 103, 45])),
        (np.array([129, 213, 0]), np.array([174, 243, 36])),
        (np.array([25, 60, 49]), np.array([52, 98, 72])),
        (np.array([55, 84, 52]), np.array([69, 101, 63])),
        (np.array([34, 87, 58]), np.array([53, 128, 70])),
        (np.array([62, 107, 61]), np.array([83, 154, 78])),
        (np.array([60, 96, 71]), np.array([83, 106, 81])),
        (np.array([26, 53, 44]), np.array([69, 101, 72])),
        (np.array([25, 71, 53]), np.array([65, 96, 75])),
        (np.array([50, 135, 59]), np.array([67, 144, 76])),
        (np.array([30, 51, 35]), np.array([69, 130, 80]))
    ]

    # Rentang warna yang ingin dihindari dalam format RGB
    avoid_ranges = [
        # Rentang warna minggu 2
        (np.array([58, 82, 58]), np.array([66, 88, 64])),
        # (np.array([41, 88, 73]), np.array([72, 108, 84])),
        (np.array([32, 69, 62]), np.array([59, 89, 89])),
        (np.array([58, 82, 58]), np.array([66, 88, 64])),
        (np.array([103, 136, 89]), np.array([158, 197, 127])),
        (np.array([44, 91, 77]), np.array([63, 102, 84])),
        (np.array([196, 241, 207]), np.array([240, 244, 239])),
        (np.array([62, 88, 56]), np.array([75, 104, 75])),
        # Rentang warna minggu 3
        (np.array([62, 96, 69]), np.array([74, 110, 84])),
        (np.array([68, 106, 77]), np.array([104, 141, 99])),
        (np.array([25, 79, 58]), np.array([52, 100, 72])),
        (np.array([17, 56, 53]), np.array([20, 71, 61])),
        (np.array([19, 63, 37]), np.array([30, 73, 63])),
        (np.array([21, 66, 57]), np.array([31, 80, 73])),
        (np.array([66, 99, 59]), np.array([109, 135, 87])),
        (np.array([19, 58, 56]), np.array([29, 68, 65])),
        (np.array([52, 87, 72]), np.array([63, 102, 87])),
        (np.array([20, 91, 76]), np.array([51, 105, 85])),
        (np.array([45, 73, 46]), np.array([59, 84, 59])),
        (np.array([47, 65, 30]), np.array([60, 76, 35])),
        # Rentang warna minggu 4
        (np.array([30, 65, 52]), np.array([40, 74, 62])),
        (np.array([33, 65, 44]), np.array([51, 93, 71])),
        (np.array([55, 90, 66]), np.array([62, 97, 73])),
        (np.array([31, 87, 76]), np.array([42, 92, 83])),
        (np.array([24, 54, 40]), np.array([36, 67, 53])),
        (np.array([22, 59, 54]), np.array([29, 67, 62])),
        (np.array([88, 119, 71]), np.array([166, 200, 114])),
        (np.array([57, 72, 29]), np.array([63, 78, 33]))
    ]

```

[https://colab.research.google.com/drive/1bfeRbBeGo2OCyraUcEIBRi2NfoVl2MB?usp=chrome\\_ntp#printMode=true](https://colab.research.google.com/drive/1bfeRbBeGo2OCyraUcEIBRi2NfoVl2MB?usp=chrome_ntp#printMode=true)

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2/28/24, 9:55 AM

segment image nutrisi - Colaboratory

```

# Membuat masker warna untuk rentang warna yang ingin dihindari
avoid_color_mask = np.zeros(image_array.shape[:2], dtype=bool)
for lower_color, upper_color in avoid_ranges:
    avoid_color_mask |= np.all((image_array >= lower_color) & (image_array <= upper_color), axis=-1)

# Membuat masker warna untuk rentang warna yang ingin disegmentasi
color_mask = np.zeros(image_array.shape[:2], dtype=bool)
for lower_color, upper_color in color_ranges:
    color_mask |= np.all((image_array >= lower_color) & (image_array <= upper_color), axis=-1)

# Menghilangkan area yang ingin dihindari dari masker warna hasil segmentasi
color_mask &= ~avoid_color_mask

return color_mask

def show_image(image_array, color_mask):
    # Buat gambar hasil segmentasi
    segmented_array = np.zeros_like(image_array)
    segmented_array[color_mask] = image_array[color_mask]

    # Tampilkan gambar asli dan gambar yang telah disegmentasi
    fig, axes = plt.subplots(1, 2, figsize=(10, 5))
    axes[0].imshow(image_array)
    axes[0].set_title('Original Image')
    axes[0].axis('off')

    axes[1].imshow(segmented_array)
    axes[1].set_title('Segmented Image')
    axes[1].axis('off')

    plt.show()

def upload_image(filename):
    try:
        image = Image.open(filename)
        image_array = np.array(image)
        color_mask = segment_image(image_array)
        return image_array, color_mask
    except Exception as e:
        print(e)
        return None, None

test = [
    "/content/bayan_merah/content/week4/2023-12-06_22:53:49_1170.07_6.65_24.8_79.8.jpg",
    "/content/bayan_merah/content/week4/2023-12-07_09:56:05_1159.02_6.3_24.8_79.8.jpg",
    "/content/drive/MyDrive/new_malnutrisi/Copy of 2024-02-20_07:38:27.jpg",
    "/content/drive/MyDrive/new_malnutrisi/Copy of 2024-02-21_08:45:34.jpg",
    "/content/drive/MyDrive/new_overnutrisi/Copy of 2024-02-24_18:58:00.jpg",
]

for loop in test:
    image_array, color_mask = upload_image(loop)
    num_pixels = np.sum(color_mask)
    print(num_pixels)
    print(loop)
    show_image(image_array, color_mask)

```

[https://colab.research.google.com/drive/1bfeRbBeGo2OCyruUcEIBRj2NfoV2MB?usp=chrome\\_ntp#printMode=true](https://colab.research.google.com/drive/1bfeRbBeGo2OCyruUcEIBRj2NfoV2MB?usp=chrome_ntp#printMode=true)

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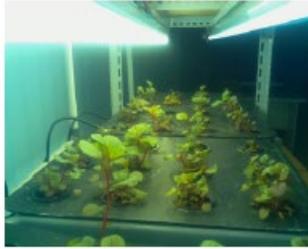
2/28/24, 9:55 AM

segment image nutrisi - Colaboratory

178918

/content/bayam\_merah/content/week4/2023-12-06\_22:53:49\_1170.07\_6.65\_24.8\_79.8.jpg

Original Image



Segmented Image



125016

/content/bayam\_merah/content/week4/2023-12-07\_09:56:05\_1159.02\_6.3\_24.8\_79.8.jpg

Original Image



Segmented Image



182262

/content/drive/MyDrive/new mlNutrisi/Copy of 2024-02-20 07:38:27.jpg

Original Image



Segmented Image



#evaluate the algorithm to classify

```
def classify_image(filename):
    _, color_mask = upload_image(filename)
    if color_mask is None:
        return "wrong data"
    num_pixels = np.sum(color_mask)

    if num_pixels <= 180000:
        return (0, num_pixels, filename)
    elif num_pixels <= 240000:
        return (1, num_pixels, filename)
    else:
        return (2, num_pixels, filename)
```

```

2/26/24, 9:55 AM segment image nutrisi - Colaboratory
image_pixels = []
image_groups = []
predict_groups = []
wrong_image = []

import os

for image in os.listdir("/content/drive/MyDrive/new_malnutrisi"):
    results = classify_image("/content/drive/MyDrive/new_malnutrisi/"+image)

    # untuk clustering, 1 kali saja hehe
    image_pixels.append(results[1])
    image_groups.append(1)
    predict_groups.append(results[0])

    if results[0] != 0:
        wrong_image.append([image, results[2]])

week4_files = os.listdir("/content/bayan_merah/content/week4")
# week4_files.sort(reverse=True)

for image in week4_files[:50]:
    results = classify_image("/content/bayan_merah/content/week4/"+image)
    if results == "wrong data":
        continue

    # untuk clustering, 1 kali saja hehe
    image_pixels.append(results[1])
    image_groups.append(0)
    predict_groups.append(results[0])

    if results[0] != 1:
        wrong_image.append([image, results[2]])

for image in os.listdir("/content/drive/MyDrive/new_overnutrisi"):
    results = classify_image("/content/drive/MyDrive/new_overnutrisi/"+image)

    # untuk clustering, 1 kali saja hehe
    image_pixels.append(results[1])
    image_groups.append(2)
    predict_groups.append(results[0])

    if results[0] != 2:
        wrong_image.append([image, results[2]])

# Import necessary libraries
import numpy as np
from sklearn.metrics import confusion_matrix, accuracy_score
import matplotlib.pyplot as plt

print(confusion_matrix(image_groups, predict_groups))
print(f"Accuracy (might need rearrangement): {accuracy_score(image_groups, predict_groups)}")

[[47  3  0]
 [ 4 21 18]
 [ 1 12 34]]
Accuracy (might need rearrangement): 0.7285714285714285

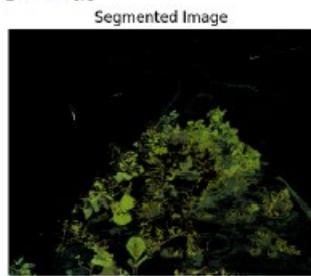
# show the wrong data
for image, filename in wrong_image:
    image_array, color_mask = upload_image(filename)
    num_pixels = np.sum(color_mask)
    print(num_pixels)
    print(filename)
    show_image(image_array, color_mask)

```

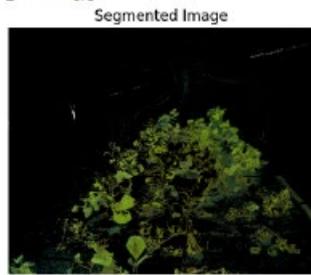
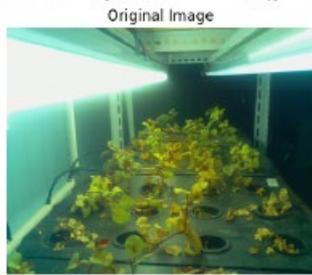
2/26/24, 9:55 AM

segment image nutris - Colaboratory

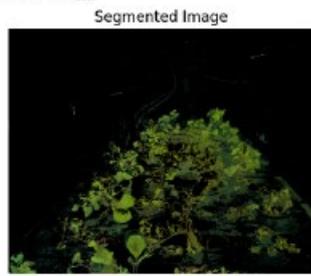
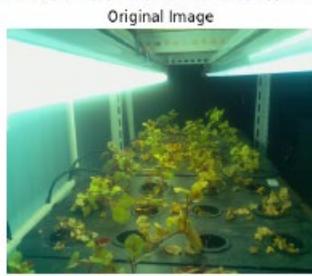
211168  
/content/drive/myDrive/new malnutrisi/Copy of 2024-02-21\_06:44:56.jpg



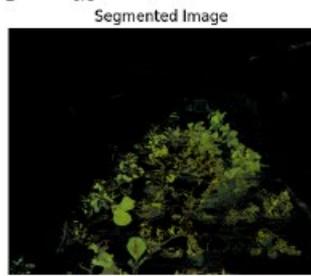
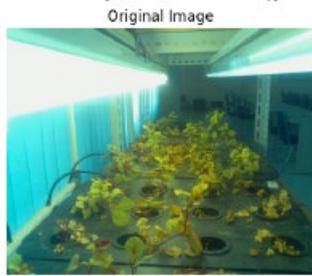
218427  
/content/drive/myDrive/new malnutrisi/Copy of 2024-02-21\_06:44:43.jpg



252989  
/content/drive/myDrive/new malnutrisi/Copy of 2024-02-21\_02:43:58.jpg



183883  
/content/drive/myDrive/new malnutrisi/Copy of 2024-02-21\_08:45:24.jpg

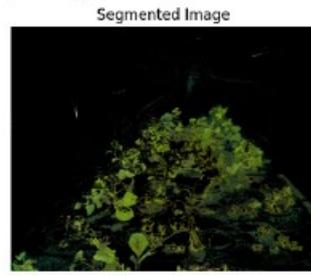
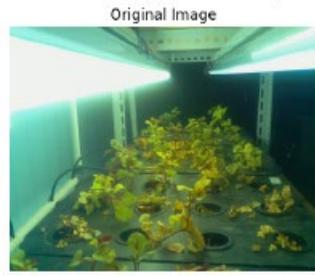


239934  
/content/drive/myDrive/new malnutrisi/Copy of 2024-02-21\_03:44:16.jpg

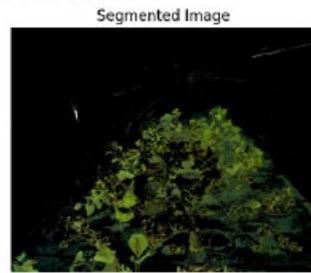
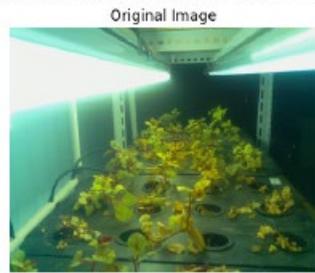
[https://colab.research.google.com/drive/1bfeRbBeGo2OCyraUcEIBR02NfoV12MB?usp=chrome\\_ntp#printMode=true](https://colab.research.google.com/drive/1bfeRbBeGo2OCyraUcEIBR02NfoV12MB?usp=chrome_ntp#printMode=true)

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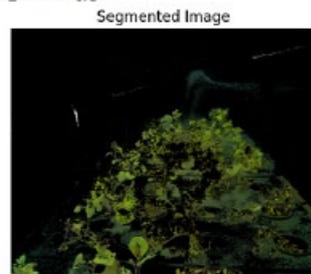
segment image nutrisi - Colaboratory



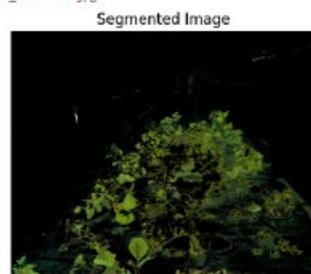
261384  
/content/drive/MyDrive/new maInutrisi/Copy of 2024-02-21\_04:44:30.jpg



278388  
/content/drive/MyDrive/new maInutrisi/Copy of 2024-02-20\_19:42:19.jpg



245887  
/content/drive/MyDrive/new maInutrisi/Copy of 2024-02-20\_18:42:06.jpg

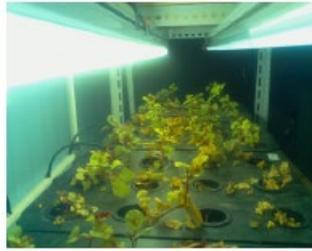


252218  
/content/drive/MyDrive/new maInutrisi/Copy of 2024-02-20\_23:43:15.jpg

Original Image                      Segmented Image  
[https://colab.research.google.com/drive/1bfeRbBeGo2OCyraUcEIBRj2NfoVl2MB?usp=chrome\\_ntp#printMode=true](https://colab.research.google.com/drive/1bfeRbBeGo2OCyraUcEIBRj2NfoVl2MB?usp=chrome_ntp#printMode=true)

2/28/24, 9:55 AM

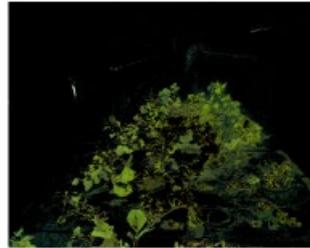
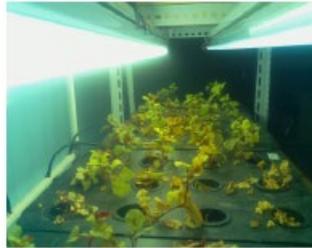
segment image nutrisii - Colaboratory



243828  
/content/drive/MyDrive/new malnutrisii/Copy of 2024-02-28 21:42:45.jpg

Original Image

Segmented Image



274196  
/content/drive/MyDrive/new malnutrisii/Copy of 2024-02-28 17:41:51.jpg

Original Image

Segmented Image



239761  
/content/drive/MyDrive/new malnutrisii/Copy of 2024-02-28 20:42:32.jpg

Original Image

Segmented Image



258373  
/content/drive/MyDrive/new malnutrisii/Copy of 2024-02-21 00:43:29.jpg

Original Image

Segmented Image

## Lampiran 5. Arduino Code untuk Pengambilan Data Sensor

```

1. #include <EEPROM.h>
2. #include "DFRobot_PH.h"
3. #include "DHT.h"
4. #include "DFRobot_EC.h"
5. #include "GravityTDS.h"
6.
7. #define EcSensorPin A2
8. #define TdsSensorPin A1
9. #define PhSensorPin A0
10. #define DHTSensorPin 7
11. #define DHTTYPE DHT22
12.
13. GravityTDS gravityTds;
14.
15. int phval = 0;
16. unsigned long int avgval;
17. int buffer_arr[10],temp;
18.
19. float voltage,ec_value,ph_value,temperature = 25;
20. DFRobot_EC ec;
21. DFRobot_PH ph;
22. DHT dht(DHTSensorPin, DHTTYPE);
23.
24. void setup() {
25.     // put your setup code here, to run once:
26.     Serial.begin(115200);
27.     Serial.setTimeout(100);
28.
29.     gravityTds.setPin(TdsSensorPin);
30.     gravityTds.setAref(5.0);
31.     gravityTds.setAdcRange(1024);
32.     gravityTds.begin();
33.
34.     ec.begin();
35.     ph.begin();
36.     dht.begin();
37. }
38.
39. void loop() {
40.     // put your main code here, to run repeatedly:
41.     float tds, ph, ec, temp, hum;
42.     String data;
43.
44.     tds = tdsValue();
45.     ph = phValue();
46.     ec = ecValue();
47.     temp = dht.readTemperature();
48.     hum = dht.readHumidity();
49.
50.     reportToRaspi(tds, ph, ec, temp, hum);
51.     delay(1000);
52. }
53.
54. void reportToRaspi(float tds, float ph, float ec, float temp, float hum){
55.     Serial.print(tds);
56.     Serial.print("-");
57.     Serial.print(ph);
58.     Serial.print("-");
59.     Serial.print(ec);
60.     Serial.print("-");
61.     Serial.print(temp);
62.     Serial.print("-");
63.     Serial.print(hum);
64.     Serial.println("");
65. }
66.
67. float tdsValue(){

```

```
68.  gravityTds.setTemperature(temperature); // set the temperature and execute
temperature compensation
69.  gravityTds.update(); //sample and calculate
70.  float tdsValue = gravityTds.getTdsValue(); // then get the value
71.  return(tdsValue);
72. }
73.
74. float pHValue(){
75.     static unsigned long timepoint = millis();
76.     if(millis()-timepoint>1000U){ //time interval: 1s
77.         timepoint = millis();
78.         //temperature = readTemperature(); // read your temperature
sensor to execute temperature compensation
79.         voltage = analogRead(PhSensorPin)/1024.0*5000; // read the voltage
80.         ph_value = ph.readPH(voltage,temperature); // convert voltage to pH
with temperature compensation
81.     }
82.     ph.calibration(voltage,temperature); // calibration process by
Serial CMD
83.     return(ph_value);
84. }
85.
86. float ecValue(){
87.     static unsigned long timepoint = millis();
88.     if(millis()-timepoint>1000U) //time interval: 1s
89.     {
90.         timepoint = millis();
91.         voltage = analogRead(EcSensorPin)/1024.5*5000; // read the voltage
92.         //temperature = readTemperature(); // read your temperature sensor
to execute temperature compensation
93.         ec_value = ec.readEC(voltage,temperature); // convert voltage to EC with
temperature compensation
94.     }
95.     }
96.     ec.calibration(voltage,temperature);
97.     return(ec_value);
98. }
99. }
```

## Lampiran 6. Kode Klasifikasi Tingkat Pertumbuhan Tanaman

```

1. import pickle
2.
3. from picamera import PiCamera
4. from PIL import Image
5. import RPi.GPIO as GPIO
6. import numpy as np
7. import time
8. import requests
9. import json
10.
11. def set_relay(condition, relay):
12.     if condition:
13.         GPIO.setmode(GPIO.BCM)
14.         GPIO.setup(relay, GPIO.OUT)
15.     else:
16.         GPIO.cleanup()
17.
18.
19. def take_image():
20.     filename = "/home/pi/tmp/image.jpg"
21.     time.sleep(1)
22.     with PiCamera() as camera:
23.         camera.rotation = 180
24.         camera.capture(filename)
25.     image = Image.open(filename)
26.     image_array = np.array(image)
27.     return image_array
28.
29.
30. def segment_image(image_array):
31.     # Tentukan rentang warna yang ingin disegmentasi dalam format RGB
32.     color_ranges = [
33.         # Rentang warna minggu 2
34.         (np.array([16, 83, 1]), np.array([107, 133, 86])),
35.         (np.array([21, 61, 0]), np.array([64, 147, 56])),
36.         (np.array([112, 156, 0]), np.array([151, 205, 10])),
37.         (np.array([72, 90, 74]), np.array([89, 112, 87])),
38.         # Rentang warna minggu 3
39.         (np.array([28, 114, 29]), np.array([72, 182, 83])),
40.         (np.array([48, 193, 106]), np.array([80, 205, 161])),
41.         # Rentang warna minggu 4
42.         (np.array([92, 207, 47]), np.array([240, 247, 239])),
43.         (np.array([57, 145, 15]), np.array([157, 246, 116])),
44.         (np.array([12, 166, 102]), np.array([40, 226, 151])),
45.         (np.array([5, 113, 71]), np.array([34, 175, 126])),
46.         (np.array([0, 121, 73]), np.array([8, 144, 124])),
47.         (np.array([0, 110, 66]), np.array([14, 138, 69])),
48.         (np.array([1, 105, 58]), np.array([18, 118, 79])),
49.         (np.array([27, 237, 187]), np.array([142, 243, 233])),
50.         (np.array([0, 167, 132]), np.array([9, 193, 157])),
51.         (np.array([0, 87, 55]), np.array([3, 111, 71])),
52.         (np.array([0, 129, 108]), np.array([14, 199, 153]))    ]
53.
54.     # Rentang warna yang ingin dihindari dalam format RGB
55.     avoid_ranges = [
56.         # Rentang warna minggu 2
57.         (np.array([3, 180, 186]), np.array([73, 215, 217])),
58.         (np.array([54, 112, 77]), np.array([70, 133, 99])),
59.         (np.array([57, 106, 81]), np.array([74, 125, 92])),
60.         (np.array([40, 92, 75]), np.array([74, 130, 101])),
61.         (np.array([23, 93, 79]), np.array([47, 104, 87])),
62.         (np.array([69, 112, 69]), np.array([82, 125, 81])),
63.         (np.array([30, 85, 80]), np.array([40, 90, 90])),
64.         (np.array([96, 128, 82]), np.array([116, 149, 93])),
65.         (np.array([62, 100, 76]), np.array([106, 138, 93])),
66.         (np.array([183, 234, 168]), np.array([191, 241, 186])),
67.         (np.array([110, 137, 79]), np.array([187, 212, 103])),
68.         (np.array([137, 154, 79]), np.array([197, 201, 130])),

```

```

69.         (np.array([103, 211, 197]), np.array([135, 241, 232])),
70.         (np.array([43, 87, 66]), np.array([78, 100, 78])),
71.         (np.array([18, 83, 79]), np.array([28, 90, 86])),
72.         (np.array([85, 87, 32]), np.array([95, 115, 66])),
73.         (np.array([20, 78, 71]), np.array([41, 93, 79])),
74.         (np.array([86, 129, 89]), np.array([115, 159, 101])),
75.         (np.array([121, 202, 158]), np.array([127, 214, 182])),
76.         (np.array([46, 83, 52]), np.array([111, 126, 65])),
77.         (np.array([31, 82, 64]), np.array([73, 115, 90])),
78.         (np.array([85, 87, 32]), np.array([95, 115, 66])),
79.         (np.array([20, 78, 71]), np.array([41, 93, 79])),
80.         (np.array([86, 129, 89]), np.array([115, 159, 101])),
81.         (np.array([121, 202, 158]), np.array([127, 214, 182])),
82.         (np.array([46, 83, 52]), np.array([111, 126, 65])),
83.         (np.array([31, 82, 64]), np.array([73, 115, 90])),
84.         (np.array([146, 222, 177]), np.array([198, 243, 233])),
85.         (np.array([70, 232, 231]), np.array([111, 245, 243])),
86.         (np.array([86, 124, 67]), np.array([117, 162, 93])),
87.         (np.array([9, 83, 72]), np.array([48, 106, 83])),
88.         # Rentang warna minggu 3
89.         (np.array([27, 66, 37]), np.array([40, 83, 53])),
90.         (np.array([20, 65, 45]), np.array([32, 81, 63])),
91.         (np.array([25, 67, 47]), np.array([52, 92, 65])),
92.         (np.array([240, 242, 239]), np.array([240, 242, 239]))
93.     ]
94. ]
95.
96.     # Membuat masker warna untuk rentang warna yang ingin dihindari
97.     avoid_color_mask = np.zeros(image_array.shape[:2], dtype=bool)
98.     for lower_color, upper_color in avoid_ranges:
99.         avoid_color_mask |= np.all((image_array >= lower_color) & (image_array
<= upper_color), axis=-1)
100.     # Membuat masker warna untuk rentang warna yang ingin disegmentasi
101.     color_mask = np.zeros(image_array.shape[:2], dtype=bool)
102.     for lower_color, upper_color in color_ranges:
103.         color_mask |= np.all((image_array >= lower_color) & (image_array <=
upper_color), axis=-1)
104.     # Menghilangkan area yang ingin dihindari dari masker warna hasil
segmentasi
105.     color_mask &= ~avoid_color_mask
106.     return color_mask
107. def classify_image(color_mask):
108.     pickled_model = pickle.load(open("/home/pi/mu_code/bayam_putih.pkl", "rb"))
109.     pickled_model.predict(color_mask)
110.     print(pickled_model)
111. while True:
112.     #take the image then segment it
113.     img_array = take_image()
114.     color_mask = segment_image(img_array)
115.
116.     # after segment, classify it
117.     classify_image(color_mask)
118.
119. time.sleep(2)
120. GPIO.cleanup()
121.

```

## Lampiran 7. Setup Aplikasi Monitoring Data Berbasis Desktop

## App.py

```

1. from process.global_val import data_storage from process.threads import
setup_read_thread from utils.graph import all_graph_update, create_graph from
utils.label import create_label, all_label_update

class App:
    def __init__(self, root):
        root.title("Hydroponic Monitoring App")
        root.configure(bg="white")
        width = 800      height = 800      screenwidth =
root.wininfo_screenwidth()
        screenheight = root.wininfo_screenheight()
        alignstr = "%dx%d+%d+%d" % (width,
                                   height,
                                   (screenwidth - width) / 2,
                                   (screenheight - height) / 2)

        root.geometry(alignstr)
        root.resizable(width=True, height=True)

        root.read_thread = setup_read_thread(data_storage)

        label_1 = create_label(root, 0)
        ax_1, canvas_1 = create_graph(root, 1)

        label_2 = create_label(root, 2)
        ax_2, canvas_2 = create_graph(root, 3)

        label_3 = create_label(root, 4)
        ax_3, canvas_3 = create_graph(root, 5)

        label_4 = create_label(root, 6)
        ax_4, canvas_4 = create_graph(root, 7)

        labels = [label_1, label_2, label_3, label_4]
        texts = ["tds", "ph", "temp", "hum"]
        axes = [ax_1, ax_2, ax_3, ax_4]
        canvas_widgets = [canvas_1, canvas_2, canvas_3, canvas_4]

        all_label_update(root, labels, texts)
        all_graph_update(root, texts, axes, canvas_widgets)
2.
3.

```

## graph.py

```

1. import matplotlib.pyplot as plt import numpy as np from
matplotlib.backends.backend_tkagg import FigureCanvasTkAgg

from database.api import get_data from process.global_val import data_storage

def plot_data(data, ax):
    """Create a visualization graph for the data"""      graph_data = data

    value = np.flipud(np.array(graph_data, dtype="float"))

    ax.plot(value)
    return ax

def all_graph_update(root, kinds, axes, canvas_widgets):
    """update the contents of the graph every 10 second"""      data =
get_data("get_all", data_storage)
    print(data)
    if data:

```

```

    for kind, ax, canvas in zip(kinds, axes, canvas_widgets):
        if kind in data:
            ax.clear()
            plot_data(data[kind], ax)
            canvas.draw()
        else:
            print("No data kind: "+kind)
    else:
        print("No data acquired")

root.after(10000, lambda: all_graph_update(
    root, kinds, axes, canvas_widgets
))

def create_graph(root, loc):
    """create a sample figure for graph"""    fig = plt.figure(figsize=(7.9, 1.6))
    ax = fig.add_subplot(111)
    canvas = FigureCanvasTkAgg(fig, root)
    canvas.get_tk_widget().grid(row=loc, column=0)
    canvas.draw()
    return ax, canvas
2.
3.

```

label.py

```

1. from tkinter import Label from tkinter.font import Font
from database.api import get_data from process.global_val import data_storage

def create_label(root, loc):
    """Create a new label to show the data"""    label = Label(root)
    ft = Font(family="Helvetica", size=20)
    label["font"] = ft    label["fg"] = "#333333"    label["justify"] = "center"
label["bg"] = "white"    label.grid(row=loc, column=0)
    return label

def all_label_update(root, labels, texts):
    """Update the label text"""    data = get_data("get_one", data_storage)
    if data:
        for label, text in zip(labels, texts):
            if text in data:
                label.configure(text=text.upper() + ": " + str(data[text]))
            else:
                print(f"No data for key: {text}")
    else:
        print("No data retrieved from queue.")

    root.after(1000, lambda: all_label_update(root, labels, texts))
2.
3.

```

api.py

```

1. import re

def process_data(data, data_storage):
    """processing the data achieved"""    data = data.decode().rstrip()
    data = re.match(r"(.*)-(.*)-(.*)-(.*)-(.*)", data)

    if data is not None:
        data = data.groups()

        data_json = {
            "tds": data[0],
            "ph": data[1],
            "temp": data[3],

```

```

        "hum": data[4]
    }

    data_storage.add_data_point(data_json)

def get_data(req, data_storage):
    """
    get the data from the api,
    get_one to get last input data,
    get_all to get last 10 data
    """
    if req == "get_one":
        return data_storage.get_single_data()
    elif req == "get_all":
        return data_storage.get_all_data()
2.
3.

```

### DataStorage.py

```

1. class DataStorage:
    def __init__(self):
        self.last_10_data_points = []

    def add_data_point(self, data_point):
        self.last_10_data_points.append(data_point)
        while len(self.last_10_data_points) > 10:
            self.last_10_data_points.pop(0)

    def get_all_data(self):
        try:
            result = {key: [d[key] for d in self.last_10_data_points] for key in
self.last_10_data_points[0]}
            return result
        except IndexError as e:
            print(e)
            return {}

    def get_single_data(self):
        if self.last_10_data_points:
            return self.last_10_data_points[-1]
        return None # or return a default value or raise an exception

    def get_data_by_index(self, index):
        if 0 <= index < len(self.last_10_data_points):
            return self.last_10_data_points[index]
        return None # or return a default value or raise an exception
2.
3.

```

### arduino\_local.py

```

1. import socket from csv import writer from datetime import datetime

import paho.mqtt.publish as publish

from database.api import process_data from process.global_val import data_queue

MQTT_SERVER = "10.1.2.60" MQTT_PATH = "sensor"

def publish_single(payload):
    publish.single(
        topic=MQTT_PATH,
        payload=payload,
        hostname=MQTT_SERVER
    )

def read_arduino(arduino_serial, data_storage):
    while True:
        data = arduino_serial.readline()
        if data:

```

```

data_csv = [str(datetime.now()), data]

try:
    publish_single(data)
except socket.timeout as e:
    print("Socket operation timed out!")

with open("tmp/data_hidroponik.csv", "a") as file:
    writer_obj = writer(file)
    writer_obj.writerow(data_csv)

for _ in range(4):
    processed_data = process_data(data, data_storage)
    data_queue.put(processed_data)
2.
3.

```

### global\_val.py

```

1. from database.DataStorage import DataStorage

import queue import serial

data_queue = queue.Queue()
ser = serial.Serial("/dev/ttyUSB0", baudrate=115200)
data_storage = DataStorage()
2.
3.

```

### threads.py

```

1. import threading

from process.arduino_local import read_arduino from process.global_val import ser

def setup_read_thread(data_storage):
    read_thread = threading.Thread(
        target=read_arduino,
        args=(ser, data_storage)
    )
    read_thread.daemon = True # Close the thread when the application closes
    read_thread.start()
    return read_thread
2.
3.

```

### main.py

```

1. from ui.App import App from tkinter import Tk

# Press the green button in the gutter to run the script.
root = Tk()
app = App(root)

if __name__ == '__main__':
    root.mainloop()

# See PyCharm help at https://www.jetbrains.com/help/pycharm/
2.
3.

```

## Lampiran 8. Bash Script untuk Pengambilan Data Resource Usage

```
1. #!/bin/bash
2.
3. # Set the start time
4. start_time=$(date +%s)
5.
6. while true; do
7.     current_time=$(date +%H:%M:%S)
8.     elapsed_time=$(( $(date +%s) - start_time ))
9.
10.    # Check if 30 minutes have passed
11.    if [ "$elapsed_time" -ge 1800 ]; then
12.        break
13.    fi
14.
15.    cpu_usage=$(top -b -n1 | awk '/^%Cpu/{print $2}')
16.    memory_usage=$(free | awk '/Mem/{printf "%.2f", $3/$2*100}')
17.
18.    echo "$current_time CPU: $cpu_usage% Memory: $memory_usage%"
19.    sleep 1
20. done
21.
```

## Lampiran 9. Python Script untuk Pengambilan Gambar Tanaman

```
1. from picamera import PiCamera
2. import time
3. import datetime
4. import time
5. import os
6. camera = PiCamera()
7. start_time = datetime.time(7, 0) # 7:00 AM
8. end_time = datetime.time(18, 0) # 6:00 PM
9. log_file = '/home/pi/camerapi/error_log.txt'
10. def job():
11.     print("condition1")
12.     now = datetime.datetime.now()
13.     camera.rotation = 180
14.     filename = '/home/pi/camerapi/{}.jpg'.format(now.strftime('%Y-%m-%d_%H:%M:%S'))
15.     # Wait for 1 second before capturing the image
16.     time.sleep(1)
17.     # Capture the image
18.     camera.capture(filename)
19.     # Wait for 1 second before checking the time again
20.     time.sleep(1)
21.     print("condition2")
22.     while True:
23.         try:
24.             cmd = "rclone copy /home/pi/camerapi FauzulIchwan:/Sampel_TA"
25.             os.system(cmd)
26.         except exception as e:
27.             continue
28.         break
29.     print("ok")
30. while True:
31.     job()
32.     time.sleep(3600)
33.
```