

# 電腦視覺應用

# Applications of Computer Vision

擴增實境 i

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# HMD with AR



- AR Helmet, Microsoft Hololens, 2021
  - [https://www.youtube.com/watch?v=Yfp0ajL8n\\_c](https://www.youtube.com/watch?v=Yfp0ajL8n_c)
- AR smart Glass, Epson BT-300, 2016
  - <https://www.youtube.com/watch?v=hhYPqF3aHUs>
- O-Displaying, 2017 (SA, tnua)
  - <https://youtu.be/GUoxKL4NXFI>
- AR survey, 1997 <https://www.cs.unc.edu/~azuma/ARpresence.pdf>



Figure 12: Two optical see-through HMDs, made by Hughes Electronics



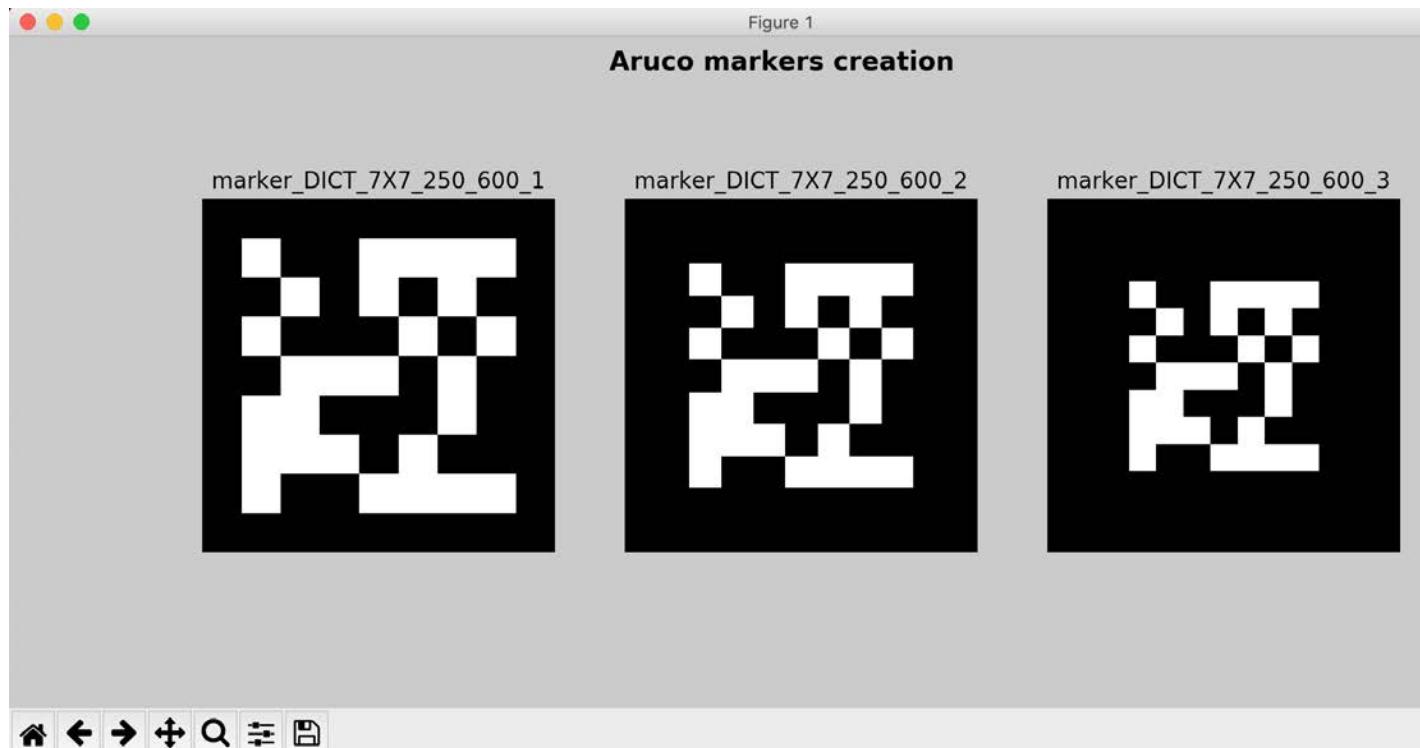
Figure 16: External view of the ARGOS system, an example of monitor-based AR. (Courtesy David Drascic and Paul Milgram, U. Toronto.)



# Outline

- Creating markers
- Detecting markers
- Camera calibration
- Camera pose estimation

# Creating markers

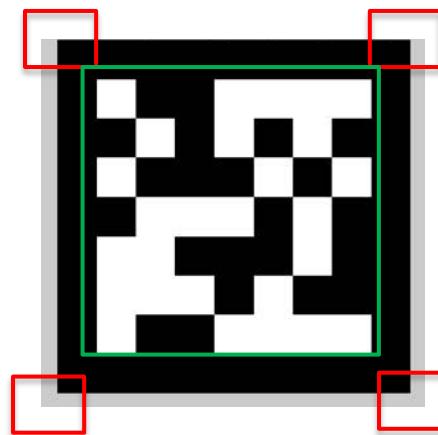


# Marker-based AR

- ArUco marker
  - [Garrido-Jurado et al., 2014] (Pattern Recogn.)

S. Garrido-Jurado, R. Muñoz-Salinas, F. J. Madrid-Cuevas, and M. J. Marín-Jiménez. 2014.  
"Automatic generation and detection of highly reliable fiducial markers under occlusion",  
Pattern Recogn. 47, 6 (June 2014), 2280-2292.

- Detect markers: 4 corners
- Correct possible errors
  - Occlusion problem
- External cell: black
- Internal cell: marker codes



[https://docs.opencv.org/master/d5/dae/tutorial\\_aruco\\_detection.html](https://docs.opencv.org/master/d5/dae/tutorial_aruco_detection.html)  
<http://www.uco.es/investiga/grupos/ava/node/26>

# Importing libraries, plot preparing

```
1 import cv2
2 from matplotlib import pyplot as plt
```

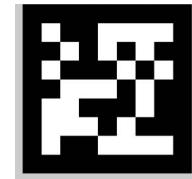
Define a function for plotting

```
5 def show_img_with_matplotlib(color_img, title, pos):
6     # Convert BGR image to RGB
7     img_RGB = color_img[:, :, ::-1]
8
9     ax = plt.subplot(1, 3, pos)
10    plt.imshow(img_RGB)
11    plt.title(title)
12    plt.axis('off')
13
14 # Create the dimensions of the figure and set title:
15 fig = plt.figure(figsize=(12, 5))
16 plt.suptitle("Aruco markers creation", fontsize=14,
17               fontweight='bold')
18 fig.patch.set_facecolor('silver')
```

Setting figure size, title texts, font size, color

# ArUco

- First step:
  - Creation of **markers** and **dictionaries**
- Second step
  - Generating markers
    - With desired number/number of internal cells
- Predefined dictionaries with markers
  - Print the markers / **show in on your phone**
  - Ex: DICT\_7X7\_250 = 14,

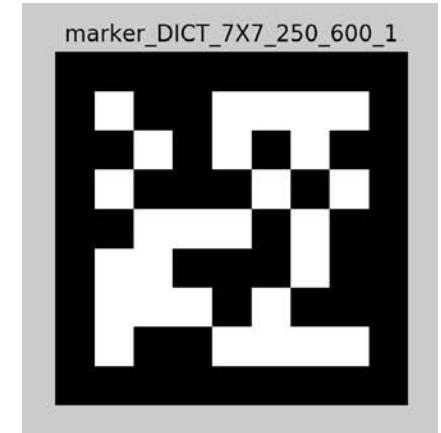


```
19 aruco_dictionary = cv2.aruco.Dictionary_get(cv2.aruco.DICT_7X7_250)
```

```
20 Get the dictionary,  
Compose of 250 markers, each marker has a size of 7x7
```

# DrawMarker

- Draw Marker
  - cv2.aruco.drawMarker( )



```
21 aruco_marker_1 =  
    cv2.aruco.drawMarker(dictionary=aruco_dictionary, id=2,  
    sidePixels=600, borderBits=1)
```

- 1<sup>st</sup> parameter: **dictionary** (output of L20)
- 2<sup>nd</sup> parameter: **marker id**, 0~249 (total 250)
- 3<sup>rd</sup> parameter: **pixel size**/marker image
- 4<sup>th</sup> parameter: **borderBits**/number of bits (cells)

# Generating Markers

- Draw 3 Markers
  - cv2.aruco.drawMarker( )
  - The same id
  - Different borderBits

```
21 aruco_marker_1 =
    cv2.aruco.drawMarker(dictionary=aruco_dictionary, id=2,
    sidePixels=600, borderBits=1)
22 aruco_marker_2 =
    cv2.aruco.drawMarker(dictionary=aruco_dictionary, id=2,
    sidePixels=600, borderBits=2)
23 aruco_marker_3 =
    cv2.aruco.drawMarker(dictionary=aruco_dictionary, id=2,
    sidePixels=600, borderBits=3)
-
```

# Save the Markers

- cv2.imwrite( )
- Save the images to disk

Target file path  
for saving

```
25 # We save the created markers using 'cv2.imwrite()':  
26 cv2  
    .imwrite  
        ("~/Users/swsun/Documents/python/Chapter09/01-chapter-content/  
         marker_DICT_7X7_250_600_1.png", aruco_marker_1)  
27 cv2  
    .imwrite  
        ("~/Users/swsun/Documents/python/Chapter09/01-chapter-content/  
         marker_DICT_7X7_250_600_2.png", aruco_marker_2)  
28 cv2  
    .imwrite  
        ("~/Users/swsun/Documents/python/Chapter09/01-chapter-content/  
         marker_DICT_7X7_250_600_3.png", aruco_marker_3)
```

# Plot the markers

- Plot the images
  - show\_img\_with\_matplotlib( )
    - written before

```
29
30 # Plot the images:
31 show_img_with_matplotlib(cv2.cvtColor(aruco_marker_1,
32                             cv2.COLOR_GRAY2BGR), "marker_DICT_7X7_250_600_1", 1)
33 show_img_with_matplotlib(cv2.cvtColor(aruco_marker_2,
34                             cv2.COLOR_GRAY2BGR), "marker_DICT_7X7_250_600_2", 2)
35 # Show the Figure:
36 plt.show()
```

Show the figures on the screen

# Full code (1/3)

```
1 import cv2
2 from matplotlib import pyplot as plt
3
4
5 def show_img_with_matplotlib(color_img, title, pos):
6     # Convert BGR image to RGB
7     img_RGB = color_img[:, :, ::-1]
8
9     ax = plt.subplot(1, 3, pos)
10    plt.imshow(img_RGB)
11    plt.title(title)
12    plt.axis('off')
13
14 # Create the dimensions of the figure and set title:
15 fig = plt.figure(figsize=(12, 5))
16 plt.suptitle("Aruco markers creation", fontsize=14,
17               fontweight='bold')
18 fig.patch.set_facecolor('silver')
19 aruco_dictionary =
20         cv2.aruco.Dictionary_get(cv2.aruco.DICT_7X7_250)
```

# Full code (2/3)

```
21 aruco_marker_1 =
    cv2.aruco.drawMarker(dictionary=aruco_dictionary, id=2,
    sidePixels=600, borderBits=1)
22 aruco_marker_2 =
    cv2.aruco.drawMarker(dictionary=aruco_dictionary, id=2,
    sidePixels=600, borderBits=2)
23 aruco_marker_3 =
    cv2.aruco.drawMarker(dictionary=aruco_dictionary, id=2,
    sidePixels=600, borderBits=3)
24
25 # We save the created markers using 'cv2.imwrite()':
26 cv2
    .imwrite
    ("/Users/swsun/Documents/python/Chapter09/01-chapter-content/
marker_DICT_7X7_250_600_1.png", aruco_marker_1)
27 cv2
    .imwrite
    ("/Users/swsun/Documents/python/Chapter09/01-chapter-content/
marker_DICT_7X7_250_600_2.png", aruco_marker_2)
28 cv2
    .imwrite
    ("/Users/swsun/Documents/python/Chapter09/01-chapter-content/
marker_DICT_7X7_250_600_3.png", aruco_marker_3)
```

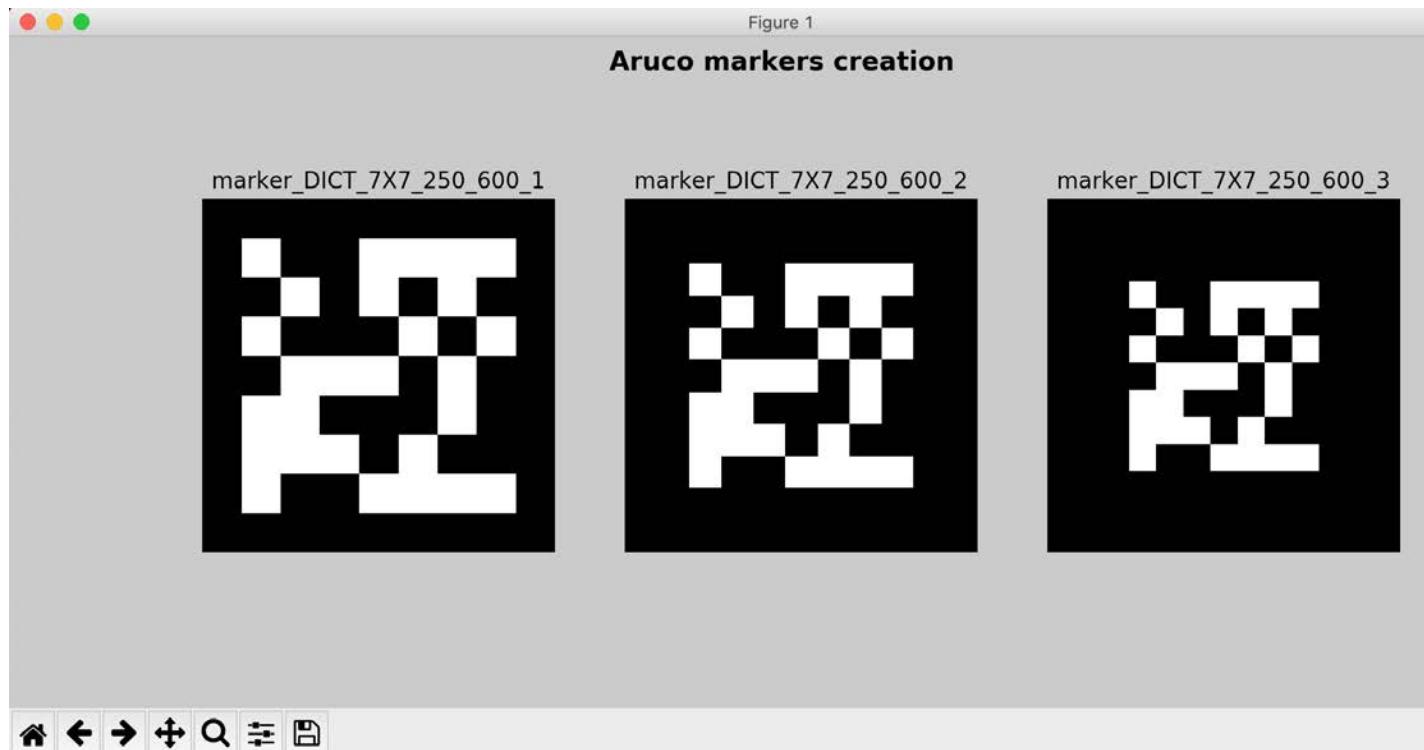
# Full code (3/3)

```
29
30 # Plot the images:
31 show_img_with_matplotlib(cv2.cvtColor(aruco_marker_1,
32                             cv2.COLOR_GRAY2BGR), "marker_DICT_7X7_250_600_1", 1)
33 show_img_with_matplotlib(cv2.cvtColor(aruco_marker_2,
34                             cv2.COLOR_GRAY2BGR), "marker_DICT_7X7_250_600_2", 2)
35 show_img_with_matplotlib(cv2.cvtColor(aruco_marker_3,
36                             cv2.COLOR_GRAY2BGR), "marker_DICT_7X7_250_600_3", 3)
37
38 # Show the Figure:
39 plt.show()
```

# Practice 2

- Creating the marker:

Results:

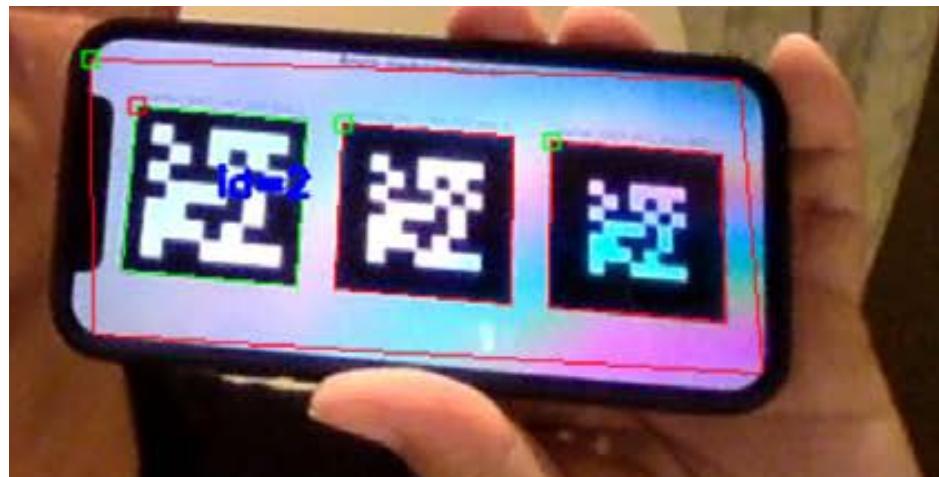


Saved files:

- marker\_DICT\_7X7\_250\_600\_3.png
- marker\_DICT\_7X7\_250\_600\_2.png
- marker\_DICT\_7X7\_250\_600\_1.png

# Detecting markers

- Take a picture for the markers
  - from the screen
- Show it on your phone!



# Detect the markers

- Use the function
  - cv2.aruco.detectMarkers( )

```
13     corners, ids, rejected_corners =  
          cv2.aruco.detectMarkers(gray_frame, aruco_dictionary,  
          parameters=parameters)
```

- 1<sup>st</sup> parameter: gray scale image
- 2<sup>nd</sup> parameter: dictionary object
- 3<sup>rd</sup> parameter: parameters

```
3 aruco_dictionary =  
    cv2.aruco.Dictionary_get(cv2.aruco.DICT_7X7_250)  
4  
5 parameters = cv2.aruco.DetectorParameters_create()
```

# Returned items

- From the function
  - cv2.aruco.detectMarkers( )

```
13     corners, ids, rejected_corners =  
          cv2.aruco.detectMarkers(gray_frame, aruco_dictionary,  
          parameters=parameters)
```

- 1<sup>st</sup> parameter: detected corners
  - 4 corners (top-left, top-right, bottom-right, bottom-left)
- 2<sup>nd</sup> parameter: id
- 3<sup>rd</sup> parameter: rejected corners
  - For debugging purpose; 4 corners



# Detect markers from a camera

- Enable the web camera
  - From your computer

```
1 import cv2  
7 capture = cv2.VideoCapture(0)
```

Enable the camera

---

```
8 while True:
```



Codes L9 – L24

```
27 capture.release()  
28 cv2.destroyAllWindows()
```

Release the camera

# Draw markers

- From the function
  - cv2.aruco.drawDectectMarkers( )
- Detected markers
- Rejected markers

image of the current frame

```
15 # Draw detected markers:  
16 frame = cv2.aruco.drawDectectMarkers(image=frame,  
17 corners=corners, [ids=id], [borderColor=(0, 255, 0)])  
18 corners id B,G,R  
19 # Draw rejected markers:  
20 frame = cv2.aruco.drawDectectMarkers(image=frame,  
21 corners=rejected_corners, [borderColor=(0, 0, 255)])  
22 rejected corners B,G,R
```

# Full code (1/3)

```
1 import cv2  
2  
3 aruco_dictionary =  
    cv2.aruco.Dictionary_get(cv2.aruco.DICT_7X7_250)  
4  
5 parameters = cv2.aruco.DetectorParameters_create()  
6  
7 capture = cv2.VideoCapture(0)
```

# Full code (2/3)

---

```
8 while True:
9     ret, frame = capture.read()
10
11    gray_frame = cv2.cvtColor(frame, cv2.COLOR_BGR2GRAY)
12
13    corners, ids, rejected_corners =
14        cv2.aruco.detectMarkers(gray_frame, aruco_dictionary,
15            parameters=parameters)
16
17    # Draw detected markers:
18    frame = cv2.aruco.drawDetectedMarkers(image=frame,
19        corners=corners, ids=ids, borderColor=(0, 255, 0))
20
21    # Draw rejected markers:
22    frame = cv2.aruco.drawDetectedMarkers(image=frame,
23        corners=rejected_corners, borderColor=(0, 0, 255))
24
25    # Display the resulting frame
26    cv2.imshow('frame', frame)
27    if cv2.waitKey(1) & 0xFF == ord('q'):
28        break
```

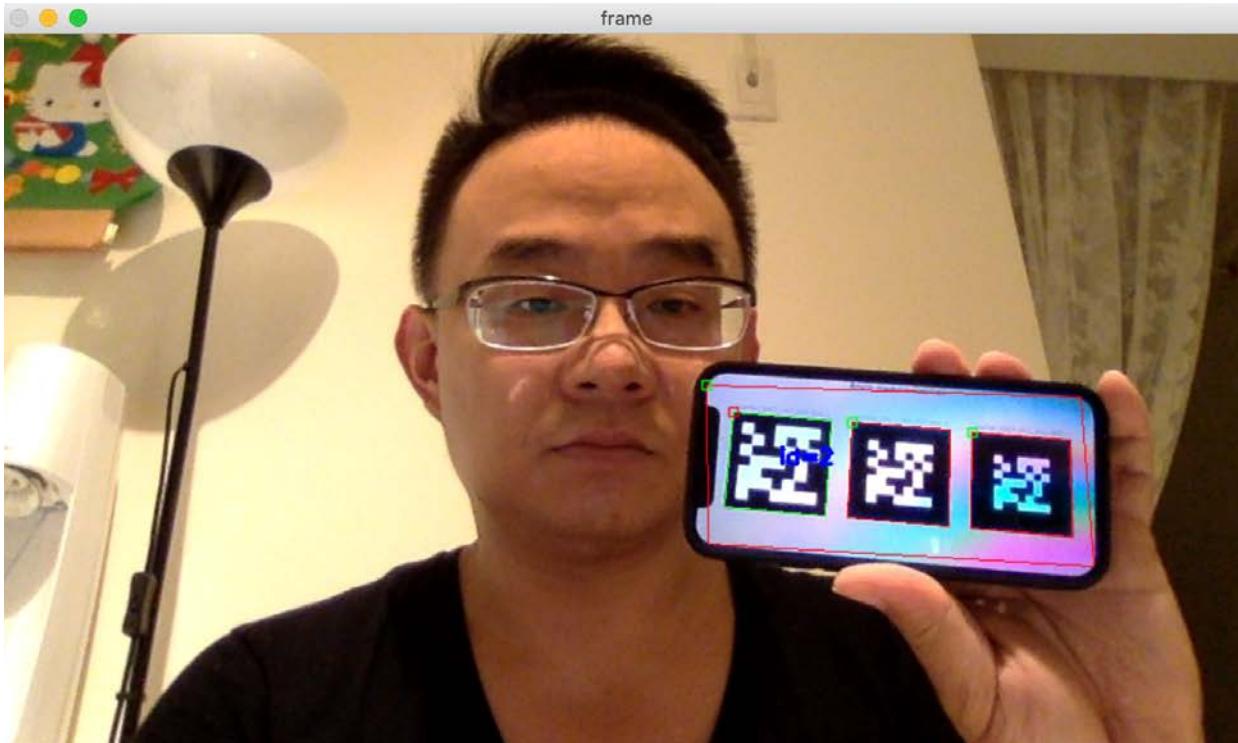
# Full code (3/3)

```
25  
26 # Release everything:  
27 capture.release()  
28 cv2.destroyAllWindows()
```

# Practice 3

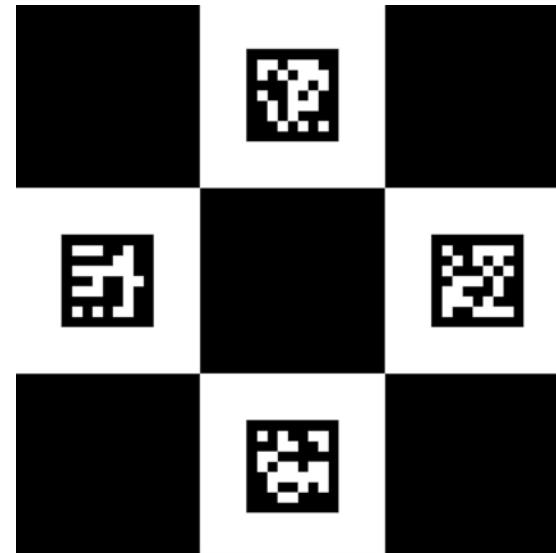
- Draw detected markers

Results:



# Camera calibration

- Before obtaining the camera pose
  - Using the detected markers
- It is necessary to know
  - The **calibration parameters** of the camera
- Performed only once
  - Camera optics
    - Not modified



# Calibration process

- From the **calibration** function
  - cv2.aruco.calibrateCamera**Charuco()**
- Using a set of corners: from **several views**
  - Extracted from a board
- Returns:
  - **Camera matrix** (3x3 matrix)
    - Focal distances, camera center coordinates
    - **intrinsic parameters**
  - Vector with **distortion coefficients**

```
42     cal = cv2.aruco.calibrateCameraCharuco(all_corners, all_ids,  
        board, gray.shape, None, None)
```

# Calibration (1/2)

- Syntax:

```
calibrateCameraCharuco(charucoCorners, charucoIds, board, imageSize,  
cameraMatrix, distCoeffs[, rvecs[, tvecs[, flags[, criteria]]]]) -> retval,  
cameraMatrix, distCoeffs, rvecs, tvecs
```

- **charucoCorners**

- A vector containing detected corners

- **charucoids**: list of identifiers

- **Board**: board layout

- **imageSize**: input image size

# Calibration (2/2)

- Output vectors:

```
calibrateCameraCharuco(charucoCorners, charucoIds, board, imageSize,  
cameraMatrix, distCoeffs[, rvecs[, tvecs[, flags[, criteria]]]]) -> retval,  
cameraMatrix, distCoeffs, rvecs, tvecs
```

- **rvecs**: estimated **rotation vectors**
  - For each board view
- **tvecs**: estimated **translation vectors**
  - For pattern view
- **cameraMatrix**: board layout
- **distCoeffs**: distortion coefficients

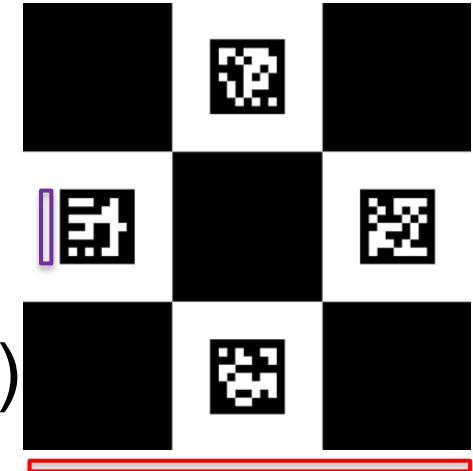
42

```
cal = cv2.aruco.calibrateCameraCharuco(all_corners, all_ids,  
board, gray.shape, None, None)
```

48

```
retval, [cameraMatrix, distCoeffs, rvecs, tvecs] = cal
```

# Board



- From the **calibration** function
  - `cv2.aruco.CharucoBoard_create()`

The signature is as follows:

```
CharucoBoard_create(squaresX, squaresY, squareLength, markerLength,  
dictionary) -> retval  
7 board = cv2.aruco.CharucoBoard_create(3, 3, .025, .0125,  
dictionary)
```

- 1<sup>st</sup> parameter: # of squares in x-direction
- 2<sup>nd</sup> parameter: # of squares in y-direction
- 3<sup>rd</sup> parameter: square side length (meter)
- 4<sup>th</sup> parameter: marker length (meter)
- 5<sup>th</sup> parameter: dictionary

# Assigning the board

- Dictionary and board

```
6 dictionary = cv2.aruco.Dictionary_get(cv2.aruco.DICT_7X7_250)
7 board = cv2.aruco.CharucoBoard_create(3, 3, .025, .0125,
    dictionary)
8
9 image_board = board.draw((200 * 3, 200 * 3))
```

# Save the vectors to a file

- Open file f: L51
- Close file f: L53
- Save for: **cameraMatrix, disCoeffs**

```
50 # Save the camera parameters:  
51 f =  
    open  
        ('/Users/swsun/Documents/python/Chapter09/01-chapter-content/  
            calibration2.pckl', 'wb')  
52 pickle.dump((cameraMatrix, distCoeffs), f)  
53 f.close()
```

# Full code (1/3)

```
1 import time
2 import cv2
3 import numpy as np
4 import pickle
5
6 dictionary = cv2.aruco.Dictionary_get(cv2.aruco.DICT_7X7_250)
7 board = cv2.aruco.CharucoBoard_create(3, 3, .025, .0125,
8                                     dictionary)
9
10 image_board = board.draw((200 * 3, 200 * 3))
11 cv2
12     .imwrite
13         ('/Users/swsun/Documents/python/Chapter09/01-chapter-content/
14             charuco.png', image_board)
15
16 cap = cv2.VideoCapture(0)
17
18 all_corners = []
19 all_ids = []
20 counter = 0
```

0. Target file path  
for saving (1<sup>st</sup> time running)

# Full code (2/3)

```
19 for i in range(300):
20     ret, frame = cap.read()
21     gray = cv2.cvtColor(frame, cv2.COLOR_BGR2GRAY)
22
23 # Detect markers:
24 res = cv2.aruco.detectMarkers(gray, dictionary)
25
26 if len(res[0]) > 0:
27     res2 = cv2.aruco.interpolateCornersCharuco(res[0],
28                                                 res[1], gray, board)
29     if res2[1] is not None and res2[2] is not None and
30         len(res2[1]) > 3 and counter % 3 == 0:
31         all_corners.append(res2[1])
32         all_ids.append(res2[2])
33
34     cv2.aruco.drawDetectedMarkers(gray, res[0], res[1])
35
36     cv2.imshow('frame', gray)
37     if cv2.waitKey(1) & 0xFF == ord('q'):
38         break
39
40     counter += 1
```

1. Detect markers, Draw detected markers

# Full code (3/3)

```
40 # Calibration can fail for many reasons:  
41 try:  
42     cal = cv2.aruco.calibrateCameraCharuco(all_corners, all_ids,  
        board, gray.shape, None, None)  
43 except:  
44     cap.release()  
45     print("Calibration could not be done ...")  
46  
47 # Get the calibration result: Matrix, rotation vector, translation vector  
48 retval, cameraMatrix, distCoeffs, rvecs, tvecs = cal  
49  
50 # Save the camera parameters:  
51 f =  
    open  
        ('/Users/swsun/Documents/python/Chapter09/01-chapter-content/  
            calibration2.pckl', 'wb')  
52 pickle.dump((cameraMatrix, distCoeffs), f)  
53 f.close()  
54  
55 # Release everything:  
56 cap.release()  
57 cv2.destroyAllWindows()
```

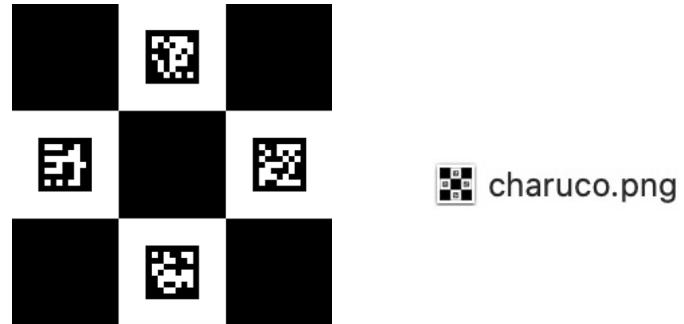
2. Assign the detected marker information:

3. Target file path  
for saving the pckl file  
Camera matrix, disCoeffs

# Practice 4, Calibration

- First run for the code:

Generate the file:



- Second run for the code

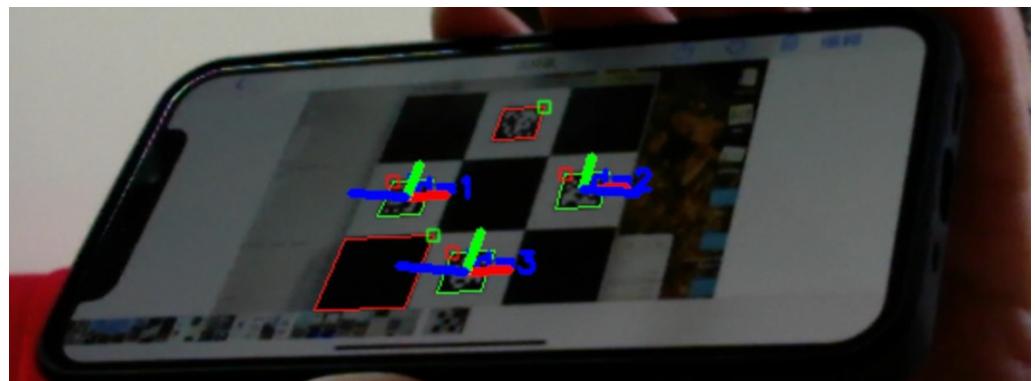
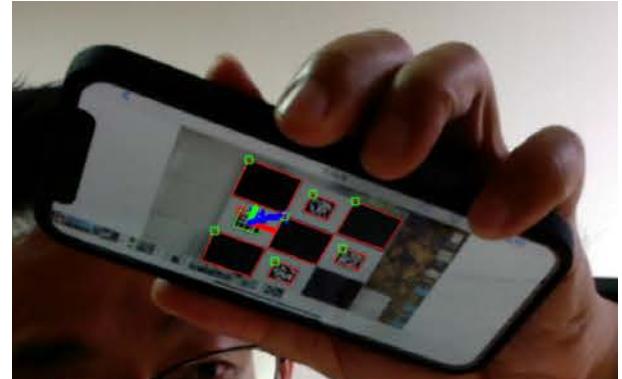
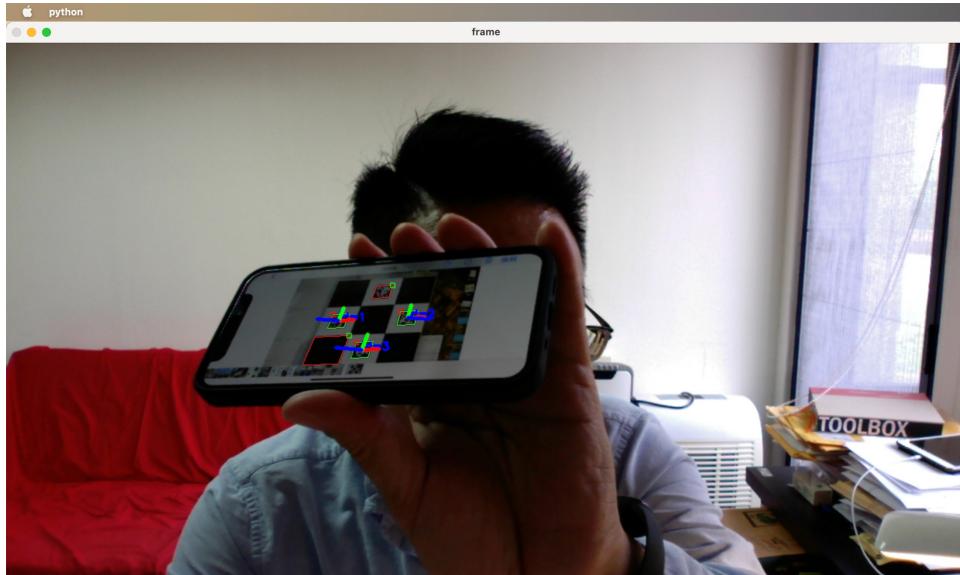


calibration2.pckl

To be used later

# Calibrated matrix used for camera pose estimation

Next week...



# Textbook Reading

- Mastering OpenCV 4 with Python
  - Ch 9, Augmented Reality
    - Marker-based augmented reality
      - p. 268 -p. 273