

# **Module 3 - Foundations of computer vision system (2) - Local feature and representation, part 1**

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# TAN Jen Hong



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sg

## Profile

Jen Hong develops algorithms. He specializes in deep learning, image processing and medical image diagnosis. He designs illustrations, web page and posters. He plays piano.

He invented a mathematical model to analyze dry eye. He used deep learning to correct medical images. He trained deep learning models to identify pathologies in retinal images. And he made deep learning to draw anatomical features.

He was the co-Principal Investigator of 6 research grants and 3 clinical trials. He and his team member co-developed algorithms to diagnose breast cancer, ovarian cancer, heart attack, fatty liver, diabetic retinopathy, epilepsy and glaucoma. He has published more than 90 journal articles, 12 of which are deep learning related.

Worldwide his publications are cited more than 2000 times.

### Educational Qualifications

- Ph.D. (Biomedical Engineering), Nanyang Technological University
- Bachelor of Engineering (Mechanical & Production Engineering), Minor in Chinese, Nanyang Technological University

### Selected Publications







jen hong, tan

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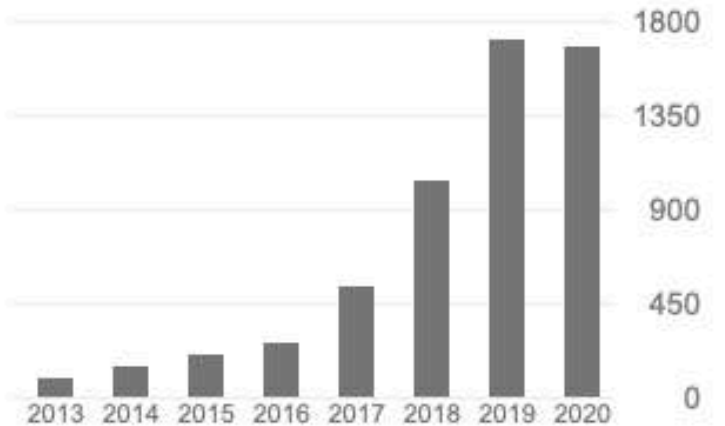
image processing automated segmentation deep learning infrared thermography  
fundus image

<input type="checkbox"/>	TITLE	CITED BY	YEAR
<input type="checkbox"/>	<b>Deep convolutional neural network for the automated detection and diagnosis of seizure using EEG signals</b> UR Acharya, SL Oh, Y Hagiwara, JH Tan, H Adeli Computers in biology and medicine 100, 270-278	563	2018
<input type="checkbox"/>	<b>A deep convolutional neural network model to classify heartbeats</b> UR Acharya, SL Oh, Y Hagiwara, JH Tan, M Adam, A Gertych, R San Tan Computers in biology and medicine 89, 389-396	336	2017
<input type="checkbox"/>	<b>Application of deep convolutional neural network for automated detection of myocardial infarction using ECG signals</b> UR Acharya, H Fujita, SL Oh, Y Hagiwara, JH Tan, M Adam Information Sciences 415, 190-198	324	2017
<input type="checkbox"/>	<b>Deep learning for healthcare applications based on physiological signals: A review</b> O Faust, Y Hagiwara, TJ Hong, OS Lih, UR Acharya Computer methods and programs in biomedicine 161, 1-13	322	2018
<input type="checkbox"/>	<b>Automated detection of arrhythmias using different intervals of tachycardia ECG segments with convolutional neural network</b> UR Acharya, H Fujita, OS Lih, Y Hagiwara, JH Tan, M Adam Information sciences 405, 81-90	293	2017
<input type="checkbox"/>	<b>Thermography based breast cancer detection using texture features and support vector machine</b> UR Acharya, EYK Ng, JH Tan, SV Sree Journal of medical systems 36 (3), 1503-1510	266	2012
<input type="checkbox"/>	<b>Infrared thermography on ocular surface temperature: a review</b> JH Tan, EYK Ng, UR Acharya, C Chee Infrared physics & technology 52 (4), 97-108	216	2009

Cited by

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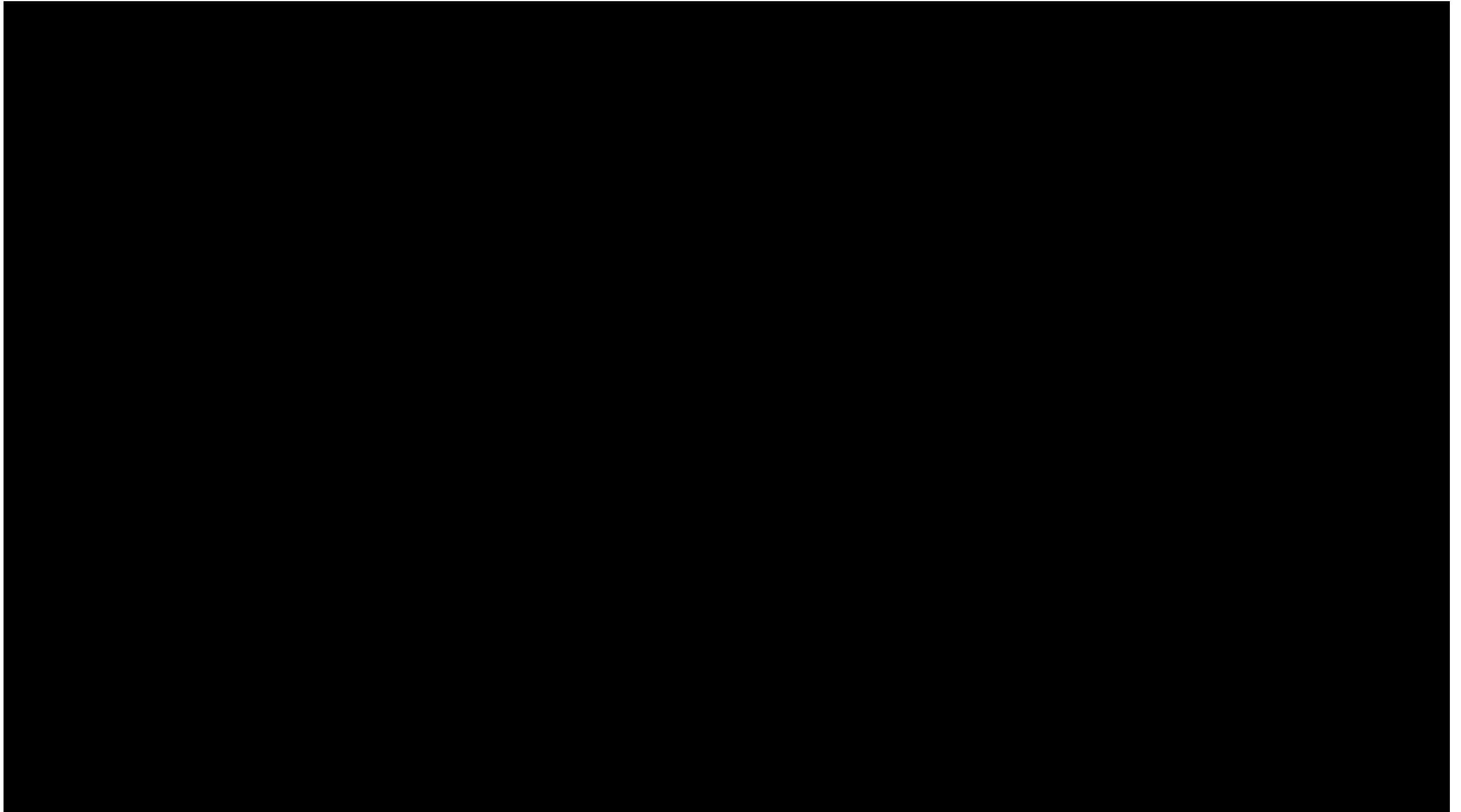
Co-authors

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# Image segmentation

## Active spline model



Active spline model: A shape based model-interactive segmentation

# Learning objectives

- Read, display and write image
- Convert image's colour format
- Expand image's border
- Draw objects on image

# Read image

- In opencv, use `imread()` to load an image

```
> import cv2
```

```
> imgfile = 'yoshida1.jpg'
```

```
> img      = cv2.imread(imgfile)
```

- Or simply just

```
> img      = cv2.imread('yoshida1.jpg')
```

- Supported formats: jpg, bmp, png, tif, tiff, pbm, ppm, hdr, pic

- Check the below link for more detail:  
[https://docs.opencv.org/3.4.2/d4/da8/group\\_\\_imgcodecs.html](https://docs.opencv.org/3.4.2/d4/da8/group__imgcodecs.html)



yoshida1.jpg



# Check basic info



yoshida1.jpg

- Many times it is beneficial / required to check basic information about the image loaded

- In Spyder, that can be done in **Variable explorer**

		$i$	$j$	
img		uint8		(700, 477, 3)
				height width channel
				$y$ $x$

- To access through code, do

```
> img.shape  
: (700, 477, 3)
```

```
> img.dtype  
: dtype('uint8')
```

```
> print('img height: %d' % (img.shape[0]))  
: img height: 700
```

# Display image

Through opencv

- To display an image in opencv for `img`, we do

```
> cv2.imshow('a drawing',img)
> cv2.waitKey(0)
> cv2.destroyAllWindows()
```

- On some platforms, it needs the below 4 lines to prevent freezing of the window:

```
> cv2.waitKey(1)
> cv2.waitKey(1)
> cv2.waitKey(1)
> cv2.waitKey(1)
```





# Display image

Through opencv

- `imshow()` does the display of image

```
cv2.imshow('a drawing',img)
```

name of the  
window

name of  
the  
variable

- `imshow()` should be followed by function `waitKey()`, which specifies how long the image should be specified in milliseconds

```
cv2.waitKey(0)
```

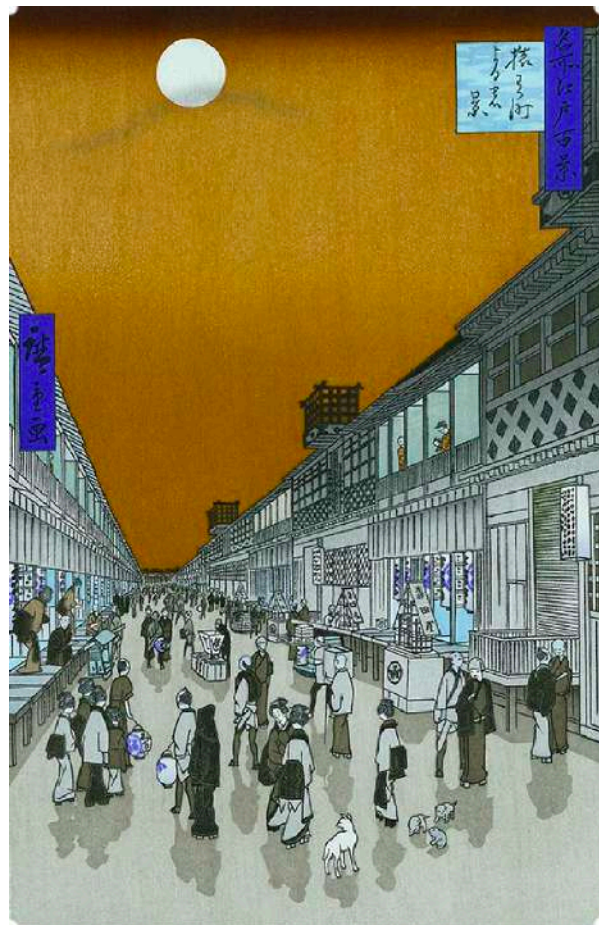
value zero stands for  
waiting infinitely

- `destroyAllWindows()` shuts down all windows opened through opencv

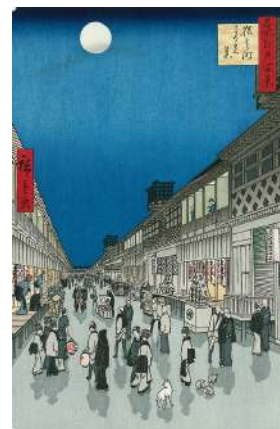
```
> cv2.imshow('a drawing',img)
> cv2.waitKey(0)
> cv2.destroyAllWindows()
```

# Colour format

BGR



BGR format displayed by  
function that expects RGB  
format



- The output of `imread()` is a numpy array
- This implies that we can manipulate the output variable using numpy's function/method
- For a colour image `img`, `imread()` gives a 3D numpy array, in BGR format

`img[:, :, 0]` → Blue channel

`img[:, :, 1]` → Green channel

`img[:, :, 2]` → Red channel

- However, many other libraries process image array only in RGB format

# Colour format conversion

- Use `cvtColor()` to convert colour format

name of  
the  
variable

```
> imgc = cv2.cvtColor(img,  
                        cv2.COLOR_BGR2GRAY)
```

colour  
conversion  
code

- Other conversion codes:

```
cv2.COLOR_GRAY2BGR  
cv2.COLOR_RGB2BGR  
cv2.COLOR_BGR2RGB  
cv2.COLOR_BGR2YUV  
cv2.COLOR_YUV2BGR  
cv2.COLOR_BGR2Luv  
cv2.COLOR_Luv2BGR  
...
```

- Check the below link for more detail

[https://docs.opencv.org/3.4.2/d7/d1b/group\\_imgproc\\_misc.html](https://docs.opencv.org/3.4.2/d7/d1b/group_imgproc_misc.html)





# Colour format conversion

- When we convert a colour image to gray, the output is no longer a 3D numpy array

```
> imgc.shape  
: (700, 477)
```

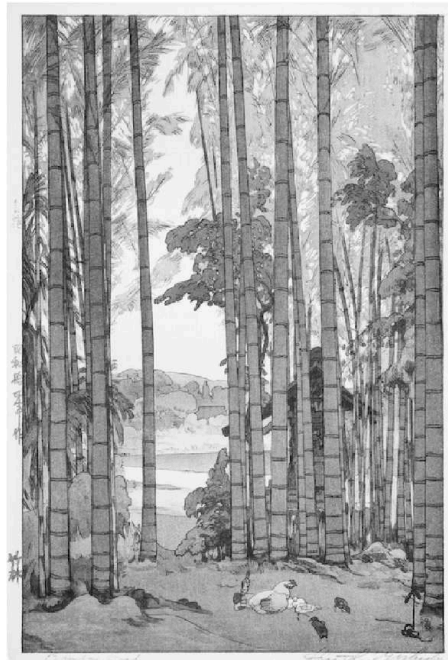
- To get back a 3D BGR array, we can do

```
> imgd = cv2.cvtColor(imgc,  
                        cv2.COLOR_GRAY2BGR)
```

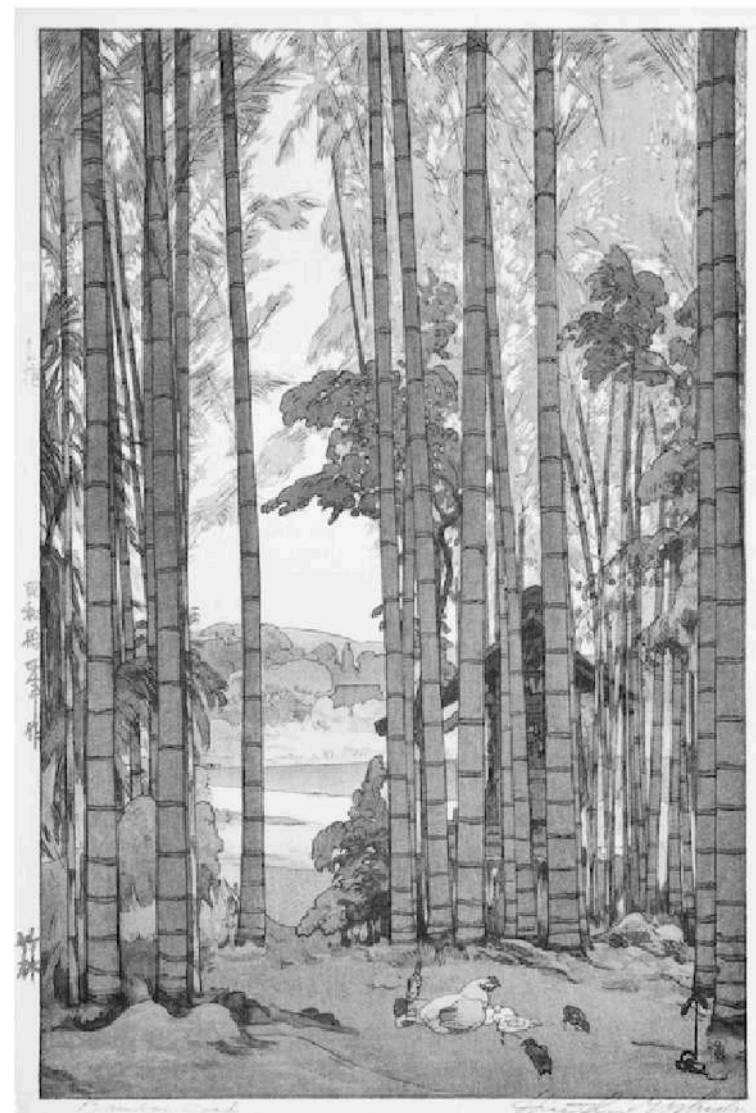
- Or we can do

```
> imge = cv2.merge((imgc, imgc, imgc))  
                        for blue channel  
                        for red channel  
                        for green channel
```

A gray is simply a colour that has the same value in R,G and B



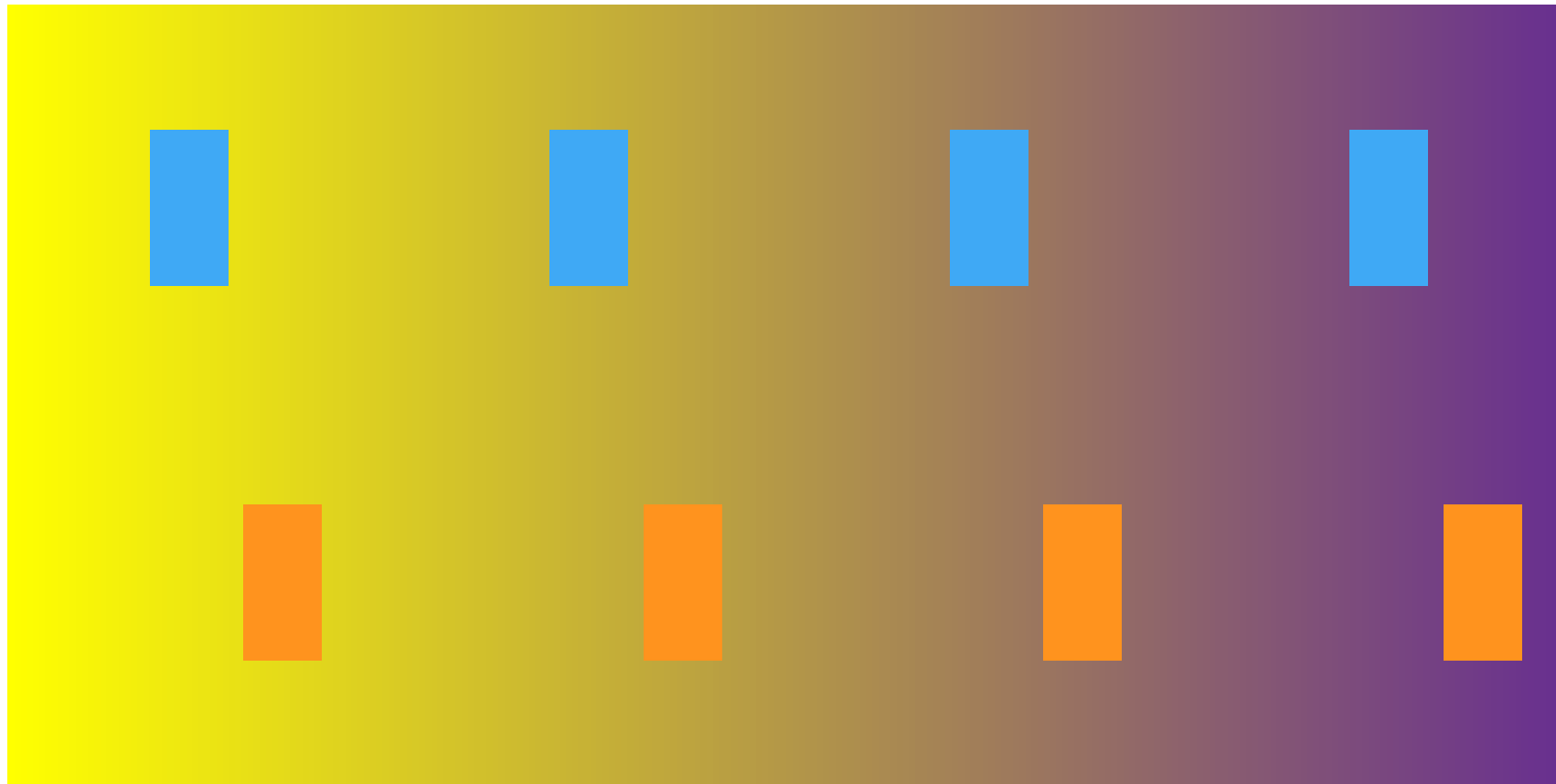
# Why often do we need to convert colour image into gray scale image?



# Something about colour

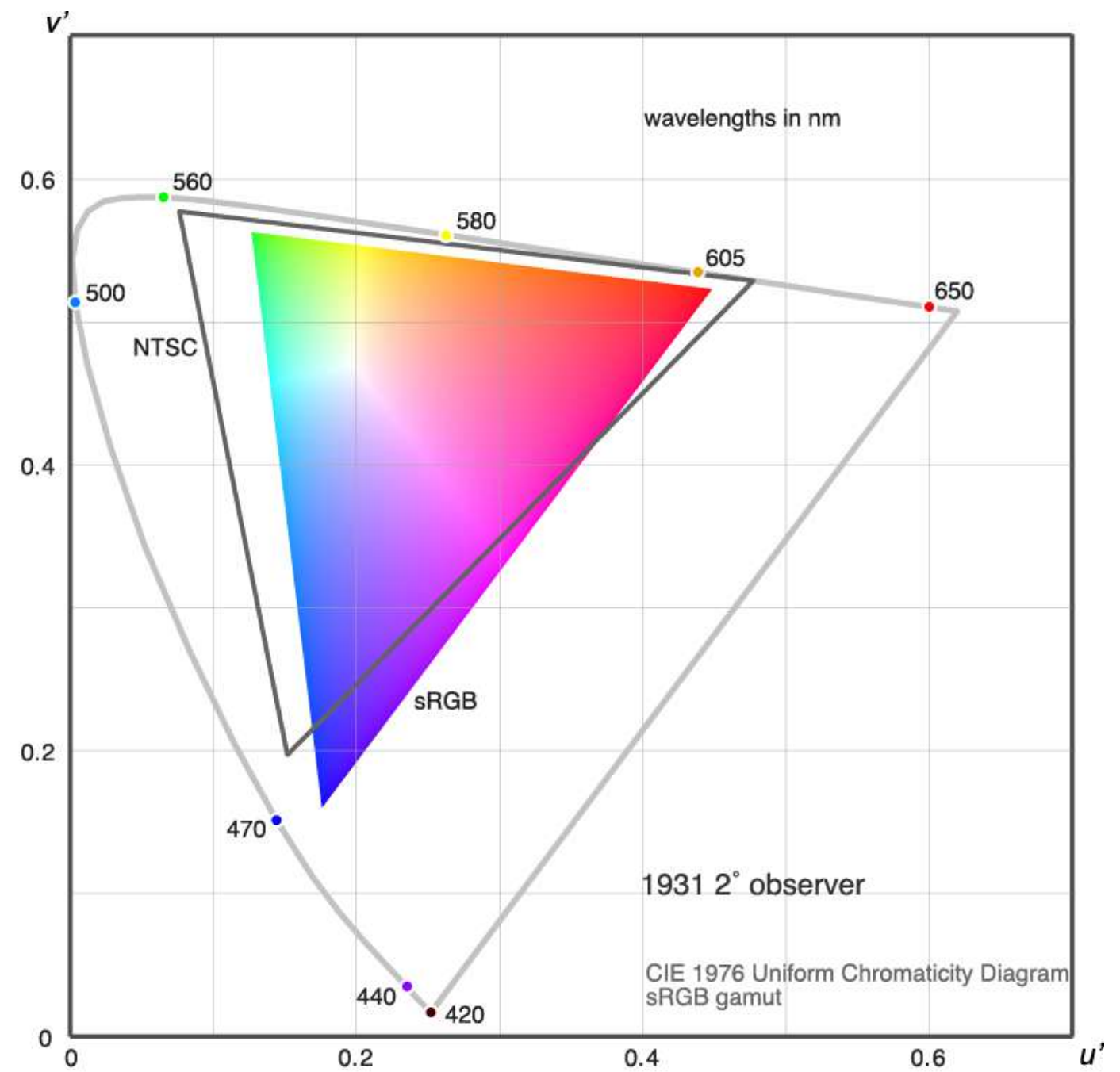
...

- Illustration of simultaneous colour contrast





# The theory of colour



# Display image, again

Through matplotlib

- We can use matplotlib to display an image `img`, to do that, we write

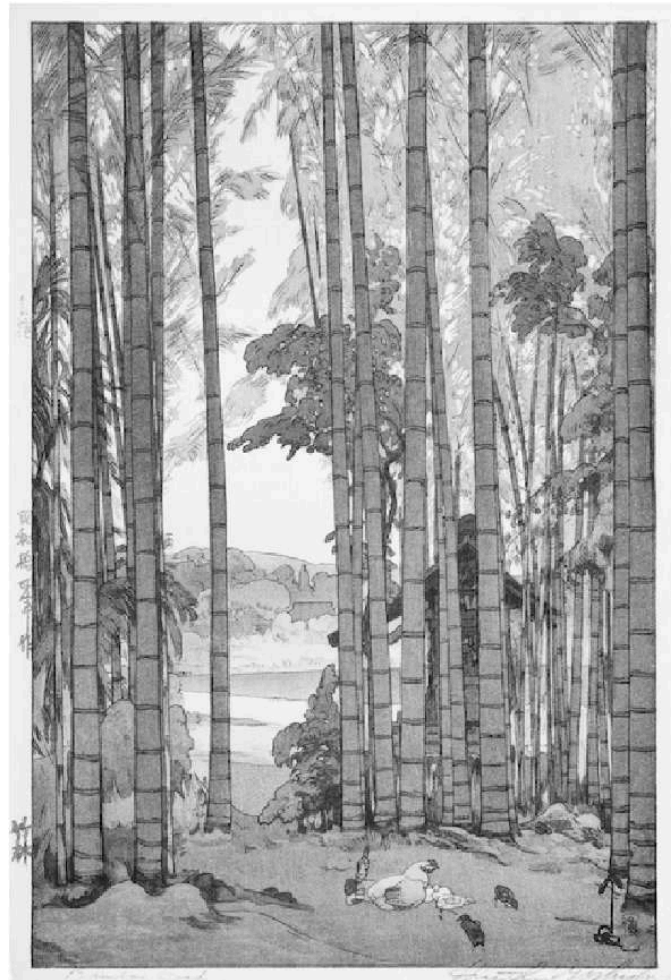
```
> import matplotlib.pyplot as plt
> plt.axis('off')
> plt.imshow(cv2.cvtColor(img,
                        cv2.COLOR_BGR2RGB))
> plt.show()
```

- In the above codes, we first turn off axis in the plot
- Then use `plt.imshow()` to display image, but that function expects image in RGB format
- Thus need to use `cv2.cvtColor()` to convert `img` into RGB format
- Finally, use `plt.show()` to get the plot displayed



# Display image, again

Through matplotlib



- To display a grayscale image `imgc`, we need extra settings on `plt.imshow()`

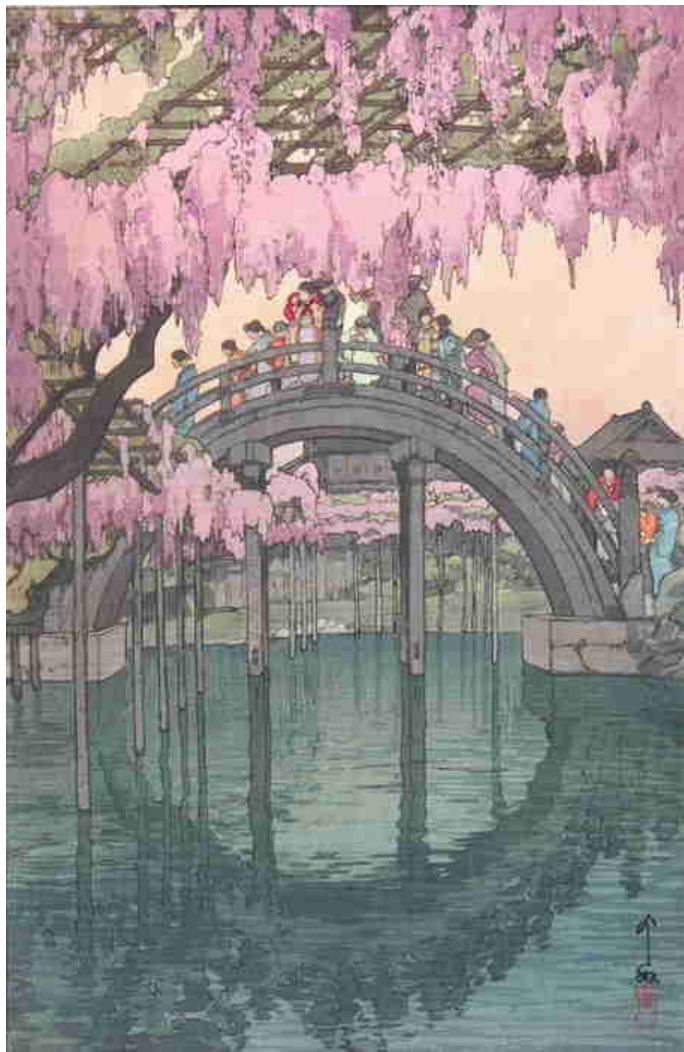
```
> plt.axis('off')  
> plt.imshow(imgc,  
               cmap='gray',  
               vmin=0,  
               vmax=255)  
  
> plt.show()
```

- `cmap='gray'` : inform the function to use grayscale colour map
- `vmin=0` : map value 0 to black
- `vmax=255` : map value 255 to white



# Expand image border

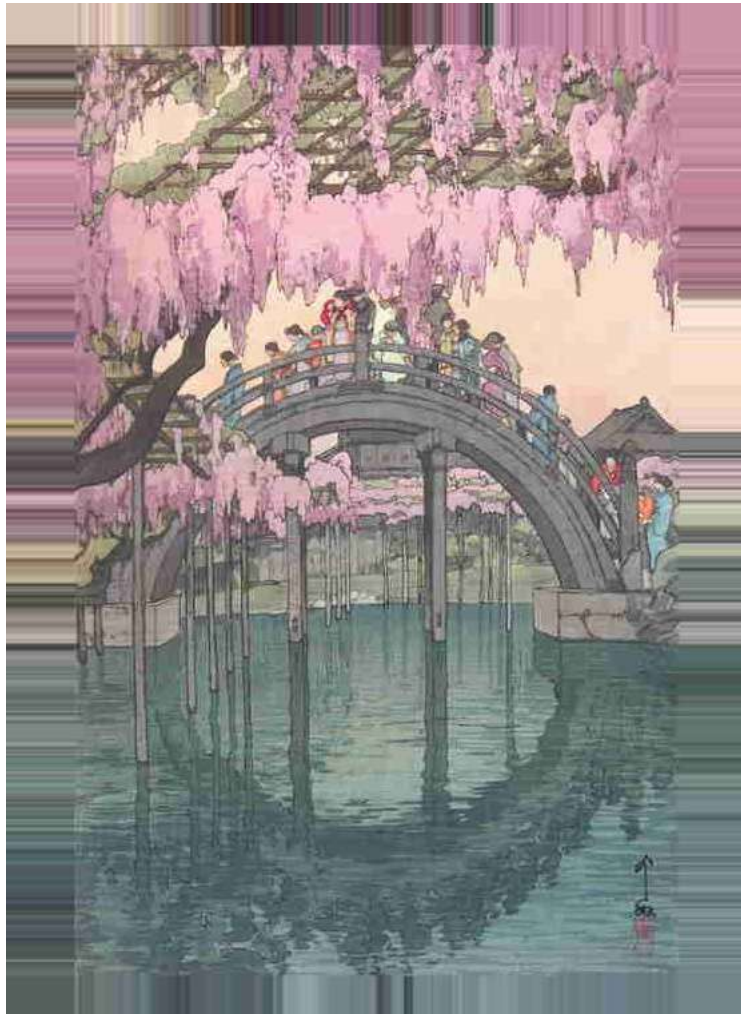
- Often in image processing it is necessary to expand image border to avoid undesired effect
- Use `cv2.copyMakeBorder()` to expand border



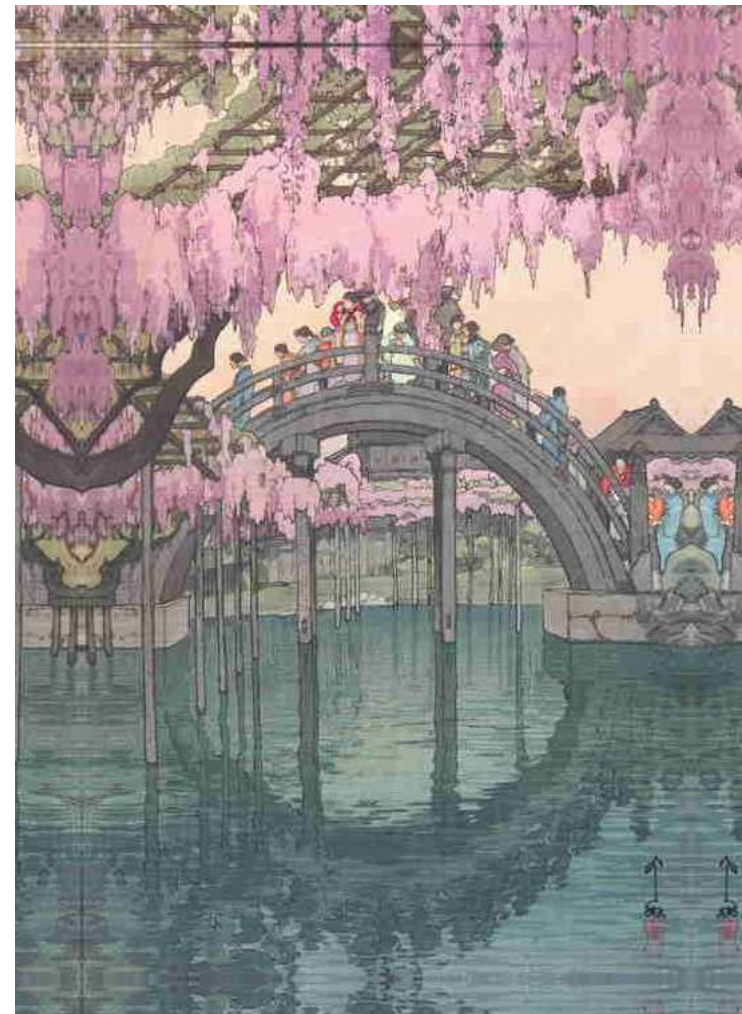
```
> imgf = cv2.imread('yoshida2.jpg')
> bdrx = cv2.copyMakeBorder(imgf,
                             30,      top
                             30,      bottom
                             50,      left
                             right    50,
                             borderType cv2.BORDER_REPLICATE)
```

# Expand image border

`cv2.BORDER_REPLICATE`



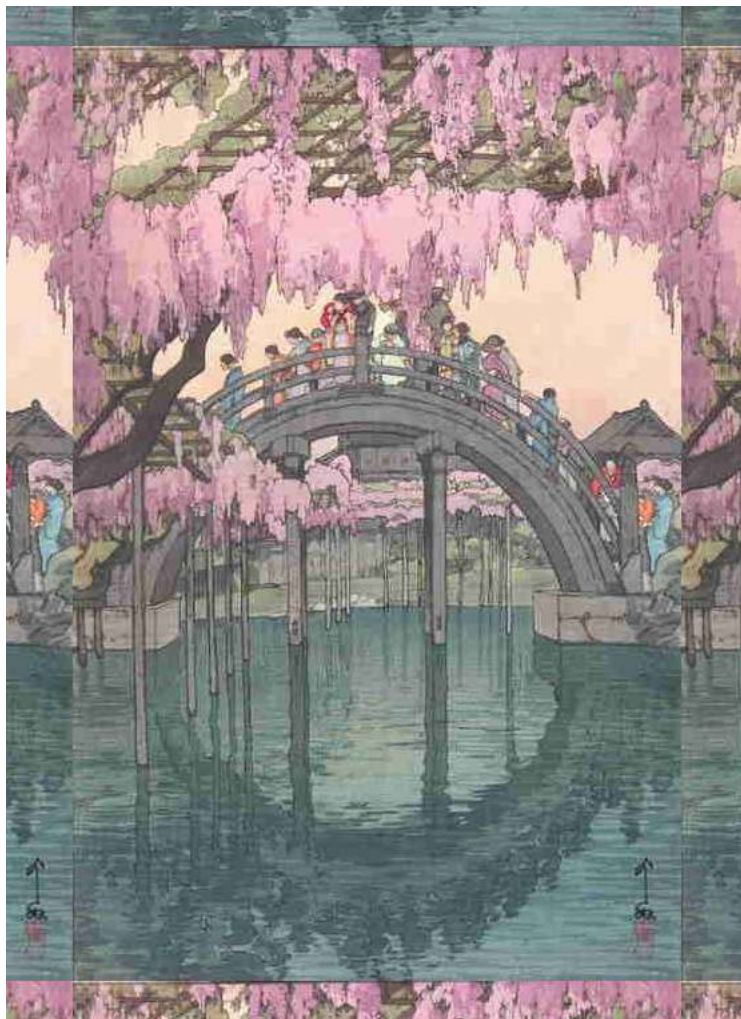
`cv2.BORDER_REFLECT`



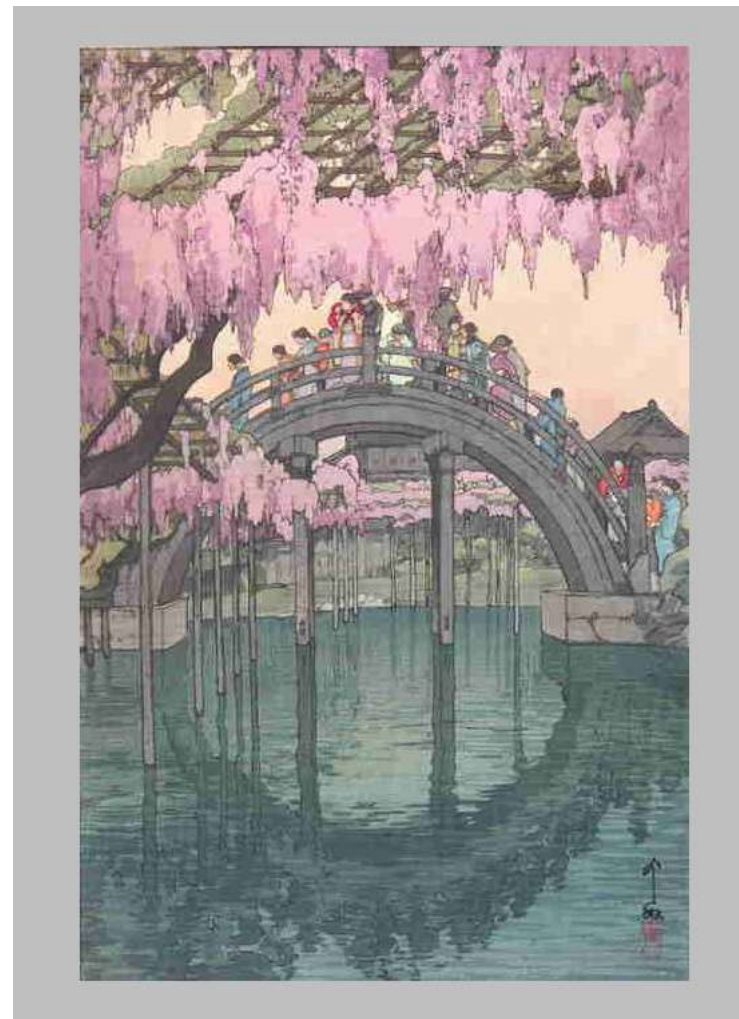


# Expand image border

`cv2.BORDER_WRAP`



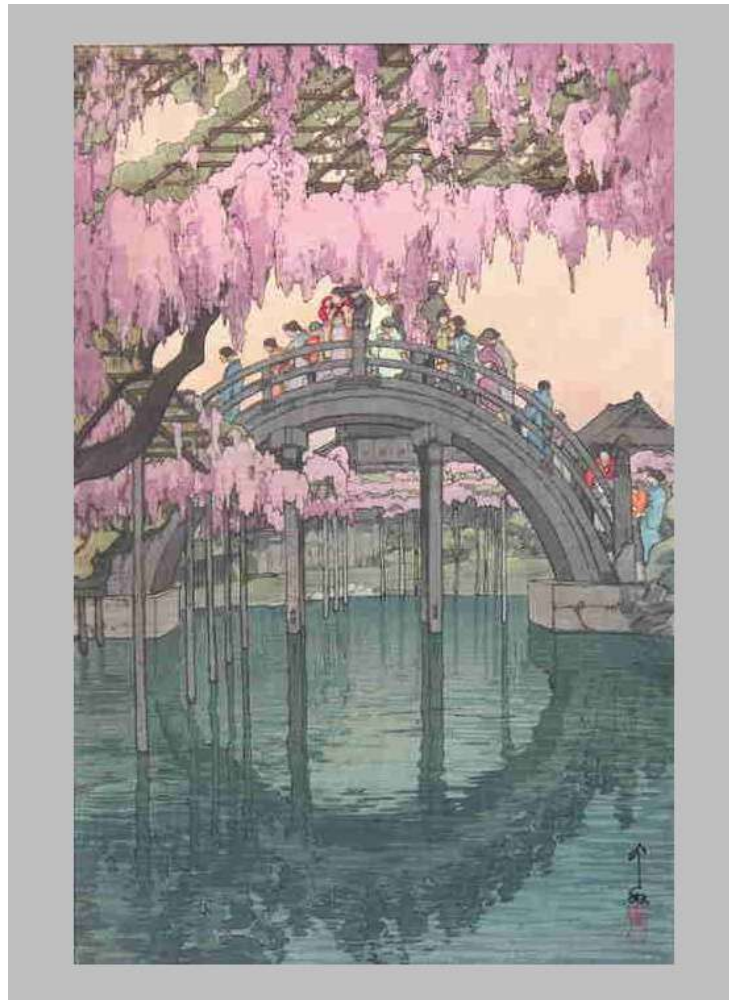
`cv2.BORDER_CONSTANT`





# Expand image border

- When we select `borderType` `cv2.BORDER_CONSTANT`, we need to input one extra parameter:
- The colour we want on the border



```
> bdrx = cv2.copyMakeBorder(imgf,  
                             30,    top  
                             30,    bottom  
                             50,    left  
                             right  50,  
borderType cv2.BORDER_CONSTANT,  
colour     value=(191,191,191))  
                        B    G    R
```

# Draw objects

- We can draw objects on image using API provided by opencv
- Generally in computer vision we use these API to make annotations on image

- Some of the functions available:

```
cv2.line()  
cv2.circle()  
cv2.rectangle()  
cv2.ellipse()  
cv2.putText()  
...
```

- After the drawing, we display the product either using `cv2.imshow()` or `plt.imshow()`



# Draw text

- To write words on image, we use `cv2.putText()`

```
> imgg = cv2.imread('kawasei1.jpg')
```

```
> cv2.putText(imgg,  
              'Kawasei', text to display  
              (150,410),  
              font type cv2.FONT_HERSHEY_SIMPLEX,  
              font scale 2.5,  
              colour (0,0,255),  
              font thickness 5,  
              line type cv2.LINE_AA)
```



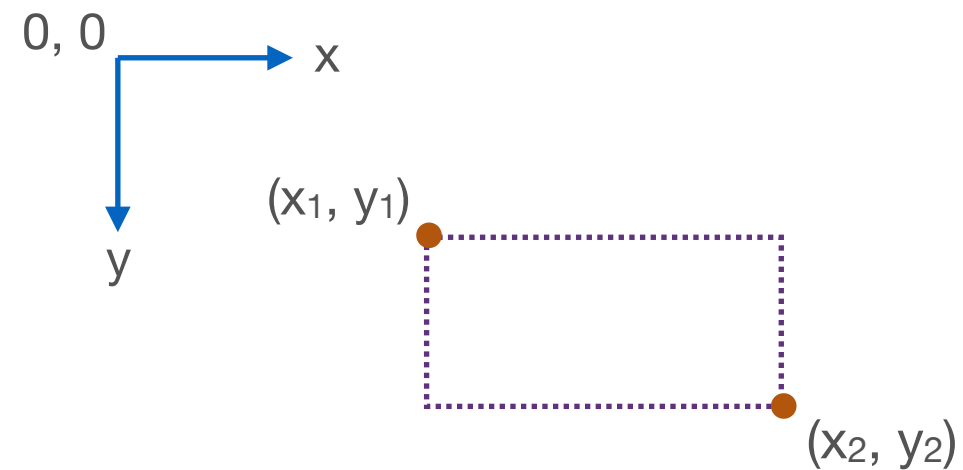
- `cv2.FONT_HERSHEY_SIMPLEX` stands for normal size sans-serif font
- `cv2.LINE_AA` gives anti-aliased line



# Draw rectangle

- To draw rectangle on image, we use `cv2.rectangle()`

```
> cv2.rectangle(imgg,  
                (132,334), (x1, y1)  
                (x2, y2) (480,432),  
                colour (0,0,255),  
                thickness 5)
```



# Saving image

- After all the hard work, it would be useless if we can't save the final output

- To save an image, we use `cv2.imwrite()`

```
> cv2.imwrite('kawas.jpg', file name  
               variable imgg)
```

- Supported formats: jpg, png, tif, tiff, hdr, exr
  - Check the below link for more detail:  
[https://docs.opencv.org/3.4.2/d4/da8/group\\_\\_imgcodecs.html](https://docs.opencv.org/3.4.2/d4/da8/group__imgcodecs.html)

