



NANYANG
TECHNOLOGICAL
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MS4671 – High Throughput Experimental Methods for Materials Discovery

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School of Materials Science and Engineering

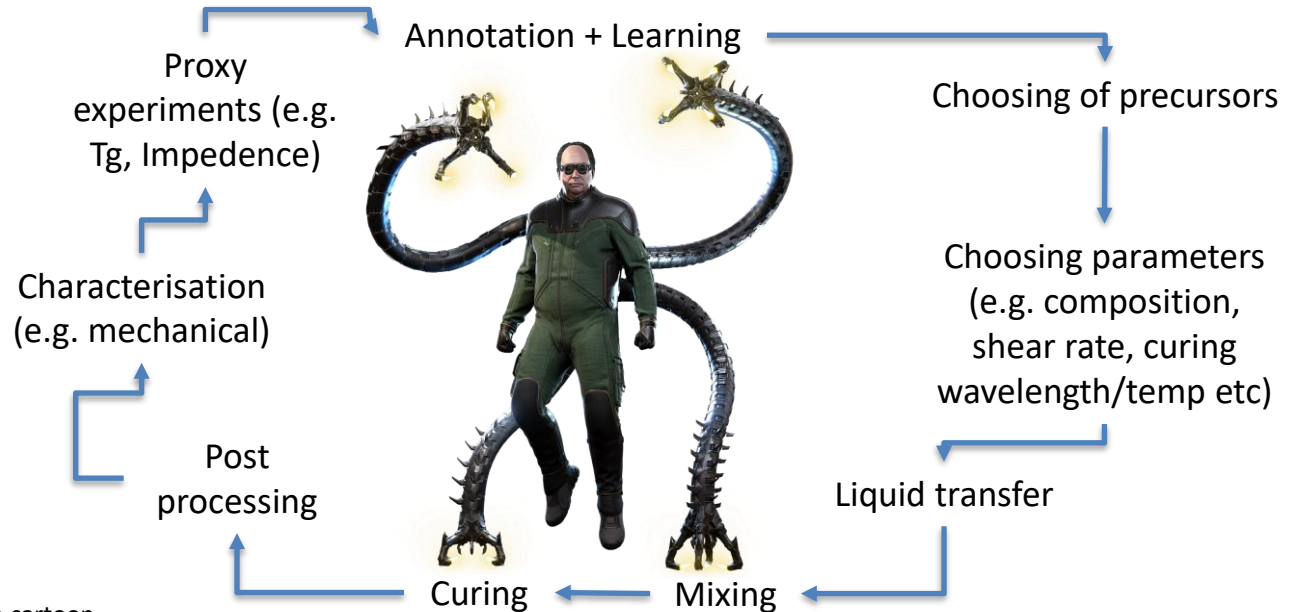


Today's class

- Part 1: Introduction to High-Throughput Experimentation (20 mins)
 - Introduction to High Throughput experimentation (10 mins)
 - Opentrons automated pipetting robots (5 mins)
 - OpenCV framework (5 mins)
- Part 2: Automated mixing of food die using Opentrons
 - Opentrons automated solution mixing (1hr)
 - Producing rainbow colors via automated mixing code (In-class quiz) (1hr)
 - OpenCV image recognition (30mins)
 - Homework (Making a target color via BO and automated solution mixing) (30mins)

High Throughput Experimentation

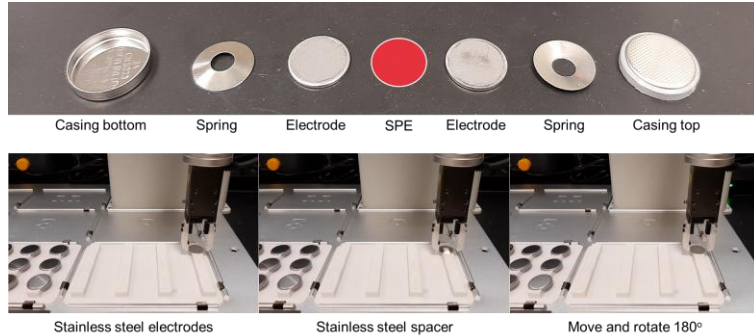
What is high throughput experimentation and why is it important?



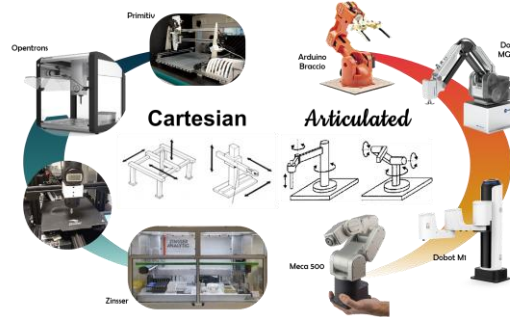
<https://www.vecteezy.com/free-vector/octopus-cartoon>

Types of modules used in HTE

Machines for making things out of stuff



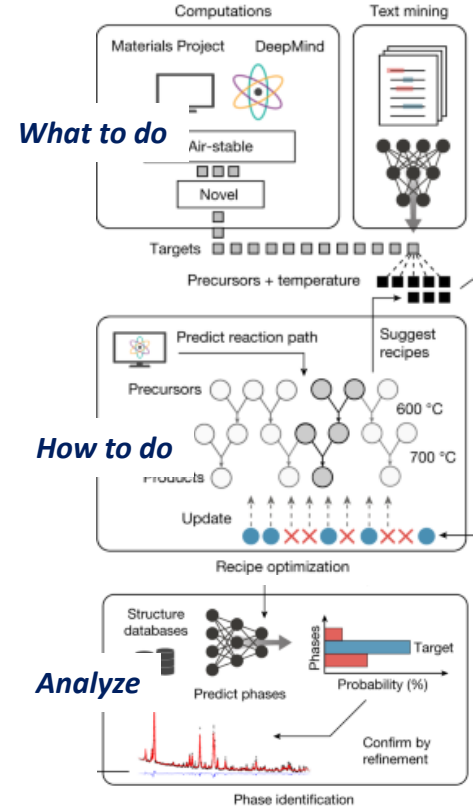
Machines for moving stuff



Machine for Testing

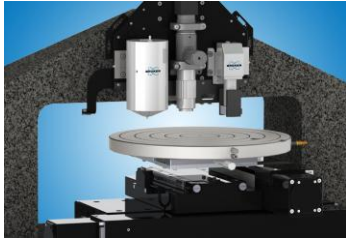


Decision-making brain



Types of experimental techniques in HTE

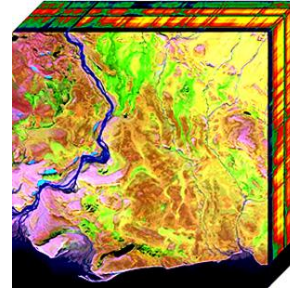
- Point-wise experiments (e.g. mechanical, spectrum analysis, electrical etc...)
- Parallel/Simultaneous experiments (e.g. impedance spectroscopy, gas adsorption etc...)
- Proxy experiments (Optical, electrical measurements)
- Ultrafast analysis



Nanoindenter

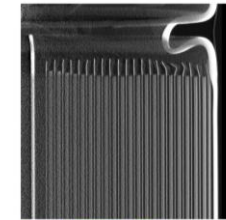


Potentiostat

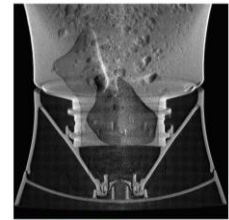


Hyperspectrum

High-resolution scans, 100x faster than conventional CT



18650 BATTERY CELL
10 second Ultra-Fast CT scan



PLASTIC BOTTLE
24 second Ultra-Fast CT scan

Ultrafast CT

<https://www.bruker.com/en/products-and-solutions/test-and-measurement/nanomechanical-test-systems/hysitron-ti-980-nanoindenter.html>

https://www.biologic.net/product_category/potentiostats-galvanostats/

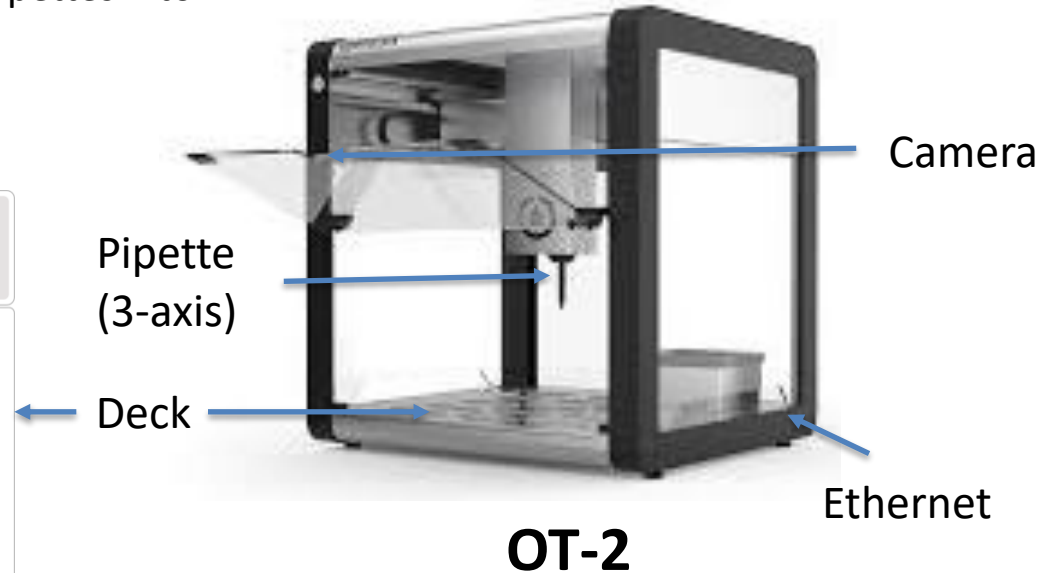
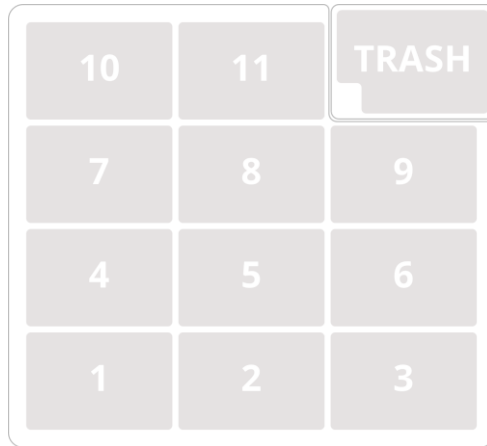
<https://www.lumafield.com/product-feature/ultra-fast-ct-scanning>

Wikipedia

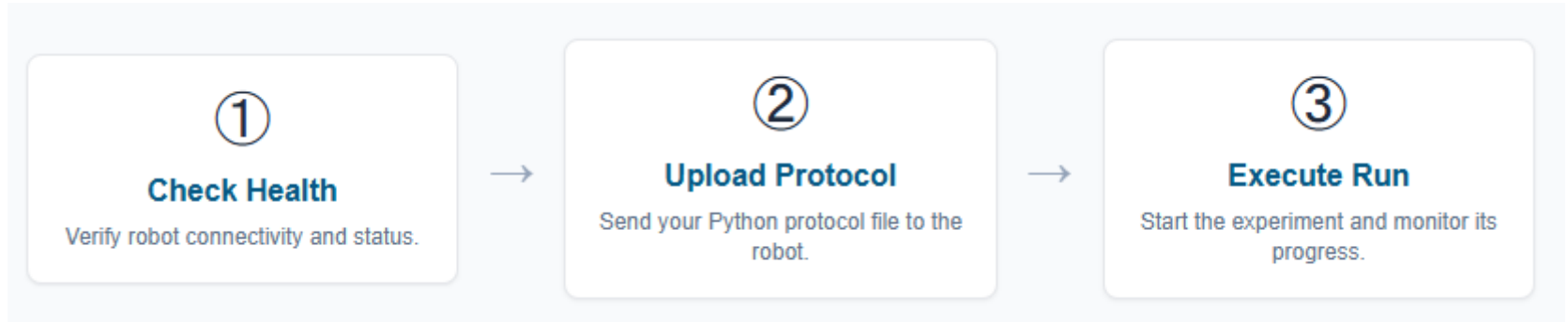


Introduction to Opentrons

- 3-axis Liquid handling robot
- Picks liquid from reservoir (resource), pipettes into receptacle, disposes tips in trash
- Python controlled
- Standardized labware



Core Workflow Overview of OT2

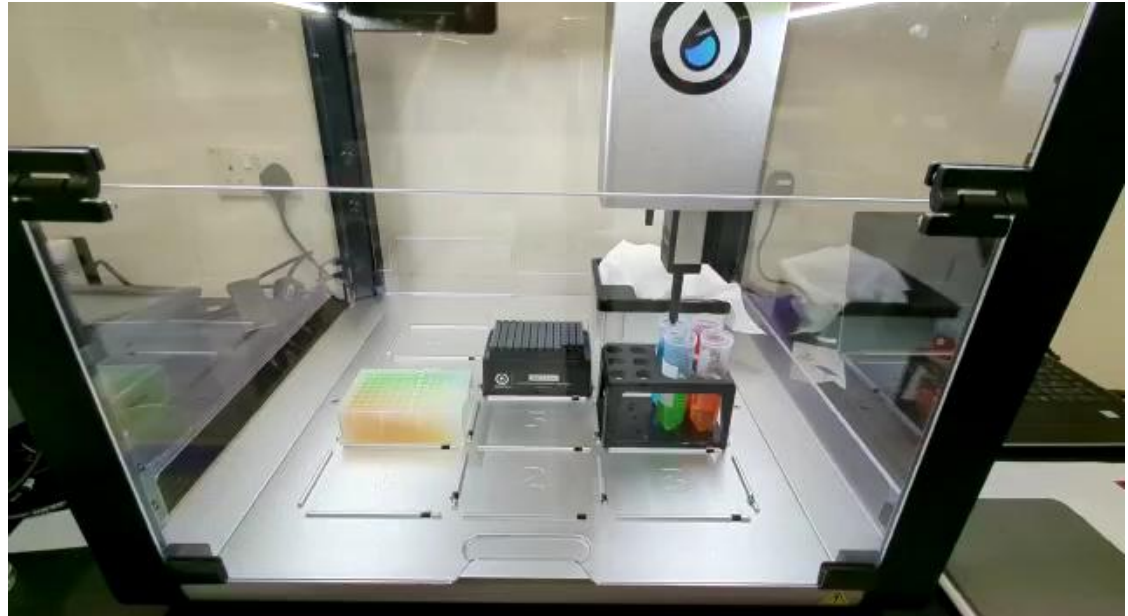
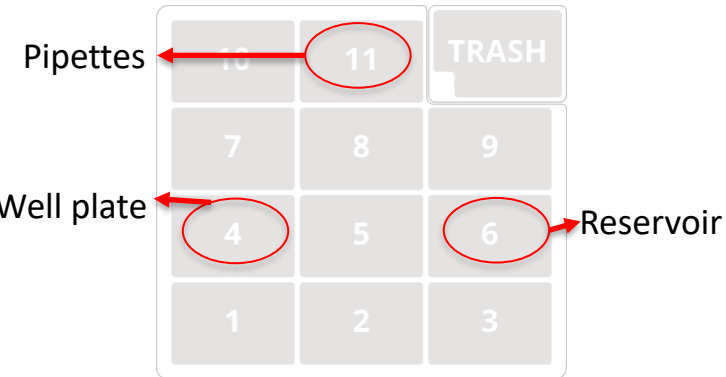
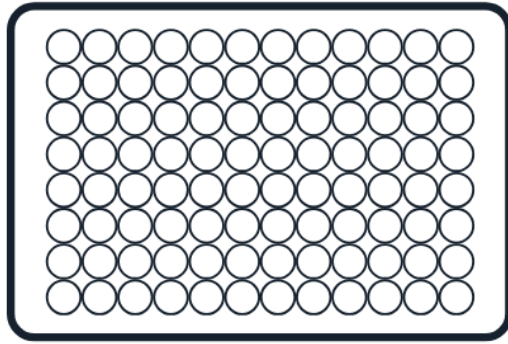


Communication protocol using Rest API



- The interaction between your computer (the client) and the OT-2 (the server) is managed through a REST API.
- Scripts sends HTTP requests to specific URLs on the robot, and the robot responds with JSON-formatted data.

Automated colour mixing using Opentrons



- Amount of colour x transferred to each well
- Efficiency in liquid transferring

OpenCV Library

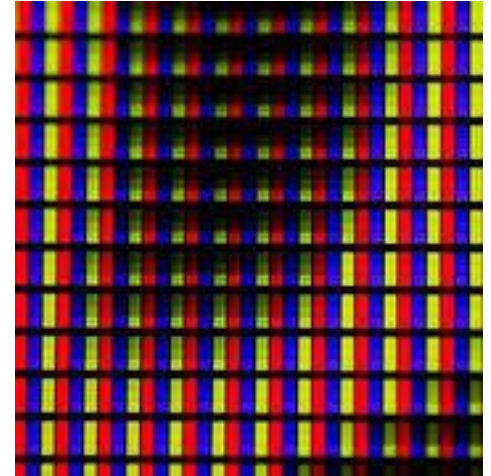
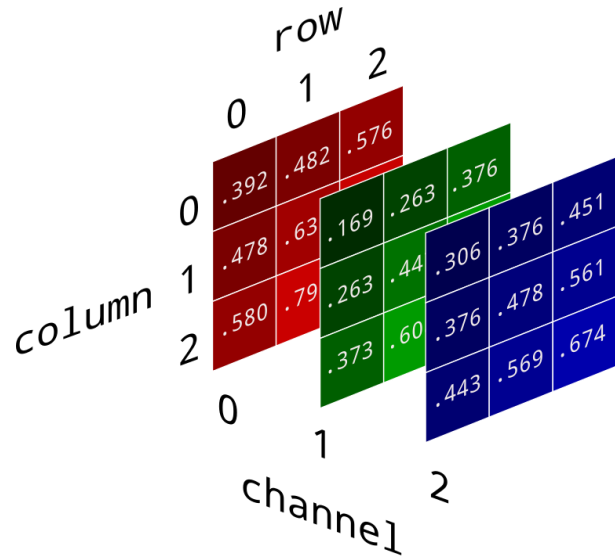
- Image manipulation
 - Read and display
 - Color space and channel manipulation
 - Resize, rescale, cropping
 - Transformations
 - Draw and Masking
- Object and Face detection
 - Contour, thresholding, and edge detection
 - Basic item detection and recognition
- Connecting with AI modules



[Open Computer Vision Library](https://opencv.org/)

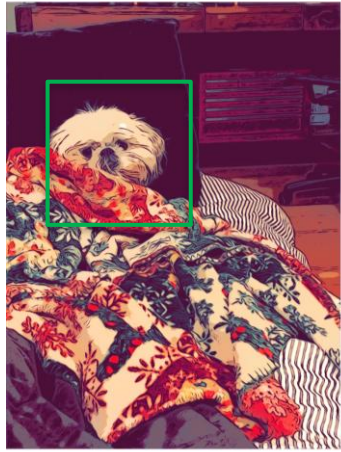
pip install opencv-python
Python >=3.6

Image



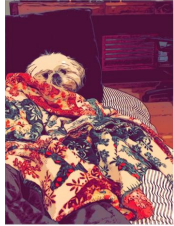
https://brandonrohrer.com/convert_rgb_to_grayscale.html

Functionalities



Img

Resize



Crop



Mask & rotate



Transform



CVT



Contour / Edge

https://brandonrohrer.com/convert_rgb_to_grayscale.html

In-class Quiz (60mins)

(Follow the code provided to achieve automated color mixing)

1. Modify the code provided (protocol_modified.py) to achieve automated “rainbow” color mixing in a row.

2. Example code can be found in

<https://github.com/dannyzekunren/MS4671>

Homework

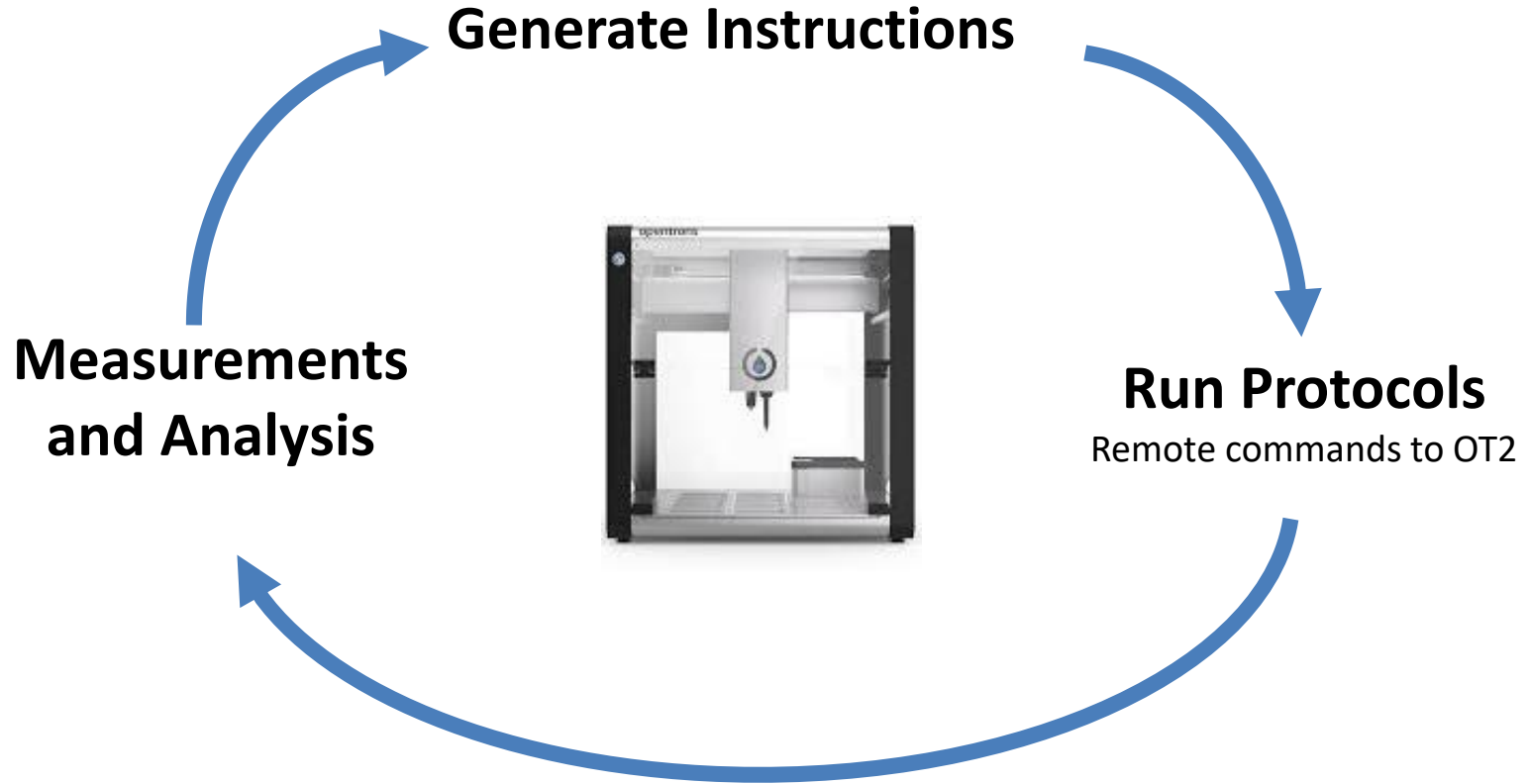
Using active learning to make a target color

Wee4_homework.ipynb can be found in

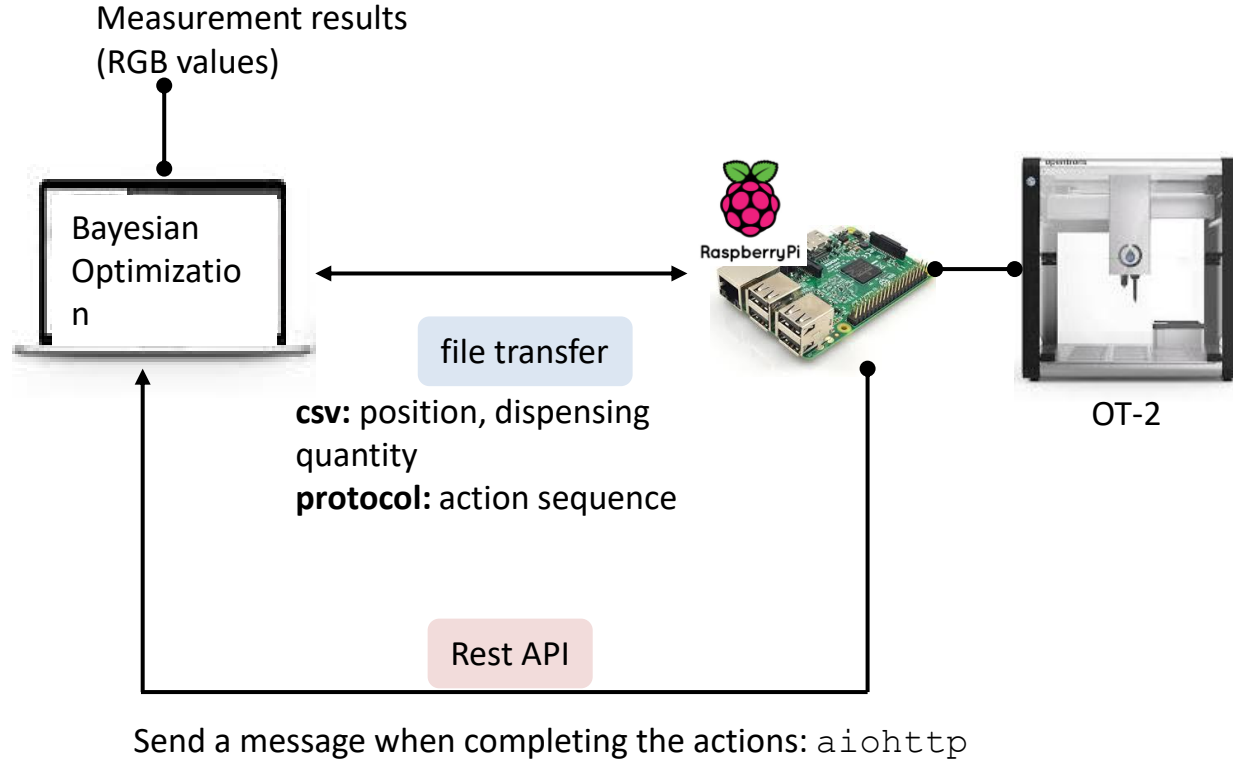
<https://github.com/dannyzekunren/MS4671>

1. Target color: RGB values. (55,150,40), or you can random generate
2. Active Learning: Design an efficient algorithm to control the Opentrons to mix automatically and approach this color.
3. Operation: Demonstrate the code on Opentrons.

Automated Loops

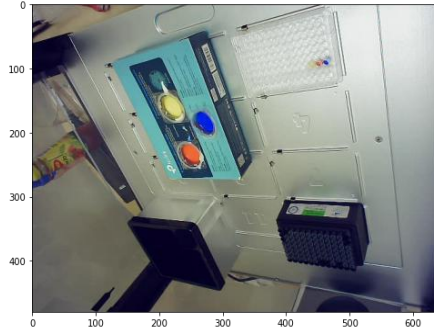


Full Feedback Loop



Color mixing

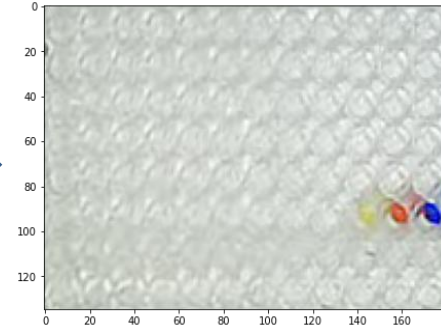
Raw Image



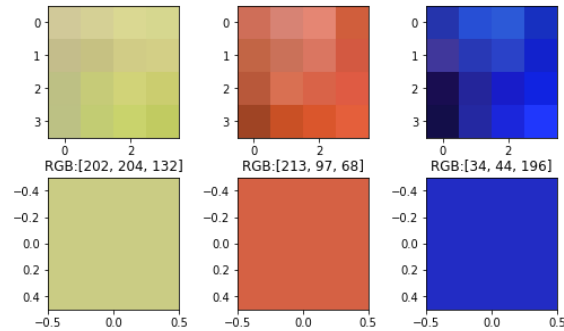
Perspective
Correction



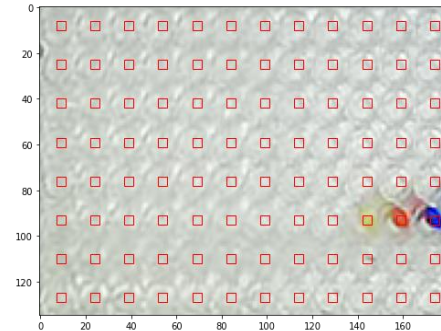
ROI Cropping



RGB Extraction



Sample Isolation



The expected results

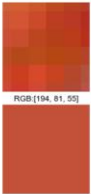
Target



Run 1



Run2



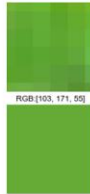
Run3



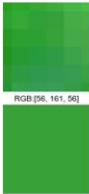
Run4



Run5



Run6



Run7



Run8



Run9



Loss evolution

