

Smartphone Based Colour Ratio Pyrometry for Flame Temperature Measurement

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Goals and Major References

Goals

- Study the colour ratio pyrometry (CRP) technique
- Develop and validate the CRP procedure based on smartphone images
- Develop a product (possibly smartphone application) capable of analyzing flame temperature based on captured RAW images

Major references

- Anand Sankaranarayanan, Ph.D., IIT Bombay (2020)-'Droplet combustion studies on novel energetic propellants'
- Md. Saif Ansari, M.Tech., IIT Bombay (2022)-'Sooty Flame Temperature Measurement using Smartphone and DSLR Camera powered by Color Ratio Pyrometry Technique'



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- Thermocouple Measurements
- Candle Flame
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- Application Developed
- RPI Product

5 Conclusions and Future Work



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Pyrometry Techniques

- Intrusive
 - Thermocouple based: Flow obstruction, finite points measurement
 - Thin Filament Pyrometry: Flow obstruction, maintenance issues
- Non-intrusive
 - Rayleigh thermometry: Interference caused by particles in sooty flames[6]
 - CARS based: Expensive and only single point measurements[3]
 - Interferometry based: Expensive, complex and bulky setup[5]
 - Infrared Camera based: Convenient, but less accurate
 - Soot Pyrometry



Two Colour Pyrometry

- Planck's Law for blackbody emission

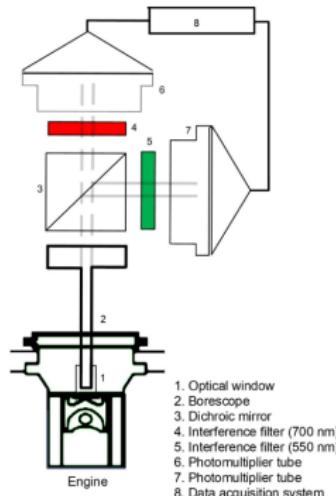
$$I(\lambda, T) = \epsilon(\lambda) \frac{2\pi hc^2}{hc} \frac{-KL}{\lambda^5(e^{\lambda k_B T} - 1)} \quad (1)$$

- Hottel and Broughton Model

$$\epsilon_\lambda(KL, \lambda) = 1 - e^{-\frac{KL}{\lambda^\alpha}} \quad (2)$$

- KL= Optical thickness
- α = soot dispersion coefficient
- Combining both-

$$I(\lambda, T) = 1 - e^{-\frac{KL}{\lambda^\alpha}} \frac{\frac{2\pi hc^2}{hc}}{\lambda^5(e^{\lambda k_B T} - 1)} \quad (3)$$



Example implementation of Two Colour Pyrometry taken from [2][7][4]

- Narrow band technique
- Passive, fast response time and reliable



Color Ratio Pyrometry

- Signal detected on a pixel S_f is **NOT** the intensity at a specific wavelength

$$S_F = 2\pi hc^2 \tau \int_{\lambda_1}^{\lambda_2} \frac{\epsilon(\lambda)\eta(\lambda)}{\lambda^5(\exp(hc/\lambda k_B T) - 1)} d\lambda \quad (4)$$

- η measures the contribution of intensities of different wavelength towards the signal (property of a sensor, calibration required)
- Wide band technique
- The ratio of these signals is a function of T and soot dispersion coefficient α when ϵ is taken to vary as $\lambda^{-\alpha}$

$$\frac{S_F1}{S_F2} = \frac{\int_{\lambda_1}^{\lambda_2} \frac{\epsilon(\lambda)\eta_{F1}(\lambda)}{\lambda^5(\exp(hc/\lambda k_B T) - 1)} d\lambda}{\int_{\lambda_1}^{\lambda_2} \frac{\epsilon(\lambda)\eta_{F2}(\lambda)}{\lambda^5(\exp(hc/\lambda k_B T) - 1)} d\lambda} \quad (5)$$



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Camera Sensors

CCD and CMOS sensors as wide (visible range) band pyrometers

Feature	CCD(Charge-Coupled Device)	CMOS(Complementary Metal-Oxide-Semiconductor)
Sensitivity	Higher sensitivity, better performance	Lower sensitivity, but significant advancements made
Noise Levels	Lower noise levels, cleaner images	Higher noise levels, but improved with noise reduction techniques
Power Consumption	Higher power consumption	Lower power consumption, more power-efficient
Speed	Slower readout and processing	Faster readout and processing
Application Range	High-end professional cameras	Consumer electronics, smartphones, and more



Smartphone Camera

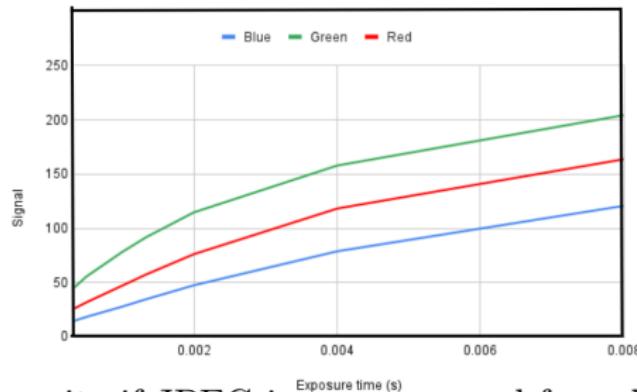
Google Camera API for Android to take images: v2 includes RAW image capabilities

Parameter	Details
ISO	Camera sensor sensitivity to light. Higher values for better low-light performance, but more noise. Lower values require more light for exposure.
Shutter Speed	Duration of the camera's shutter being open. Fast speeds freeze motion, slow speeds create motion blur or long-exposure shots.
Aperture	Opening of the camera's lens that controls light and depth of field. Wider aperture lets in more light and creates shallow depth of field.
White Balance	Adjustment of color response for accurate reproduction under different lighting conditions. Corrects color casts caused by varying temperatures.
Focus Modes	Different focus settings: Single Autofocus, Continuous Autofocus, Manual Focus, and Automatic Autofocus.



Importance of RAW for CRP

Formats: JPEG, RAW, TIFF, DNG



Non linearity if JPEG images are used for calibration

63	1023	63	1023
258	64	266	64
64	1023	63	1023
273	65	263	64

Sample RAW bayer data from a 16 pixel image:

Green is at black level with thermal noise.

Blue is saturated or at white level



Sensors Used

Number	Device	Sensor	Specifications
1	One Plus 9RT 5G	Sony IMX766	50 MP resolution 1.67" image sensor
2	Realme X3 Superzoom	Samsung GW1 sensor	64 MP resolution 1/1.72" image sensor
3	Motorola Moto G82	Samsung S5KJN1	50 MP resolution 1/2.76" image sensor
4	Raspberry Pi Camera Module V2	Sony IMX708	12 MP resolution 1/1.3" image sensor



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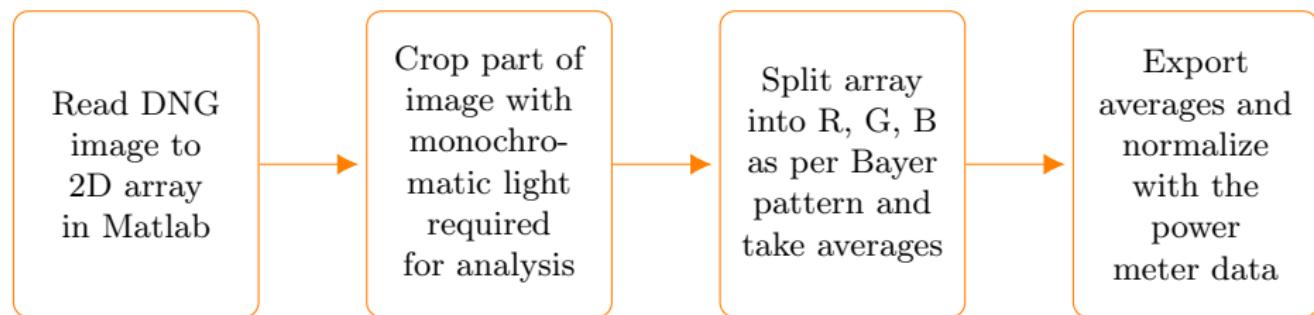
- Application Developed
- RPI Product

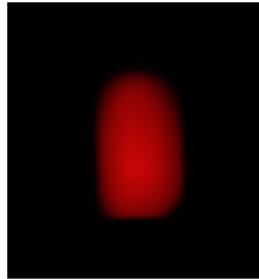
5 Conclusions and Future Work



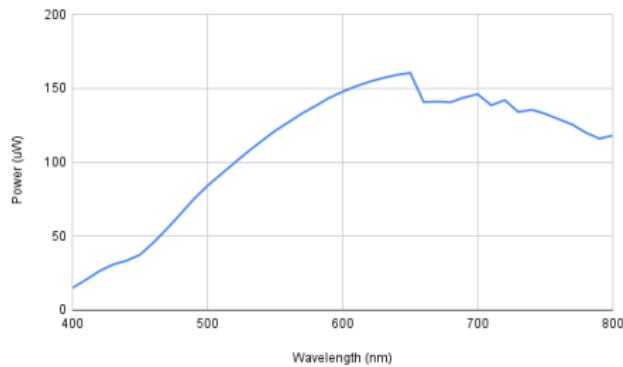
Monochromator and Power Meter

Holmarc HO-SP-SQR200F and HO-OPM-01UV
Readings at 10 nm intervals from 400 to 700 nm





Monochromator light captured by Sensor 2

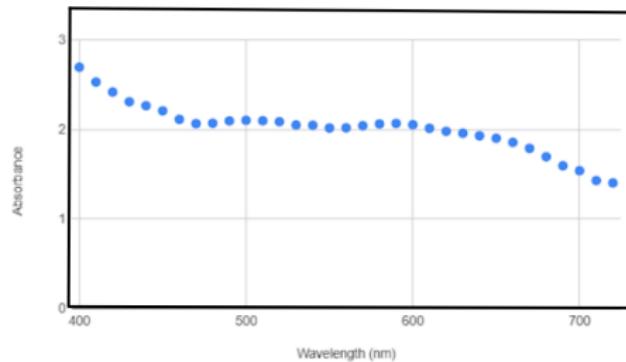


Variation of power of light emitted by monochromator
with wavelength



ND filter

- Used to reduce saturation of images of monochromatic light because of very bright source

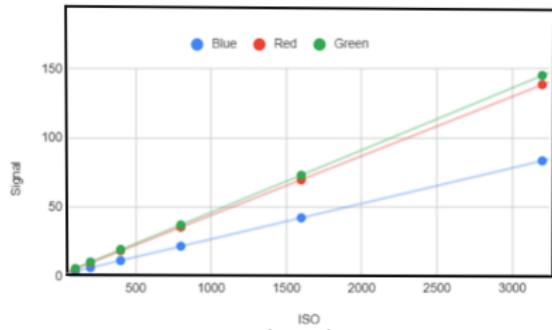
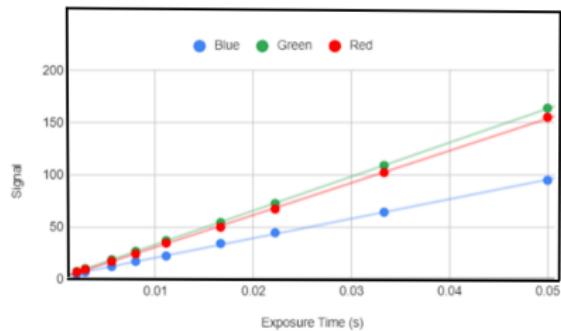


Absorbance of ND filter (log scale)

- Need to include the wavelength dependent transmittance factor in calibration
- Discarded as alternative solution by changing aperture of monochromator was found



Linearity



Variation of signal with variation in exposure time (ET) and ISO

Read DNG image to 2D array in Matlab

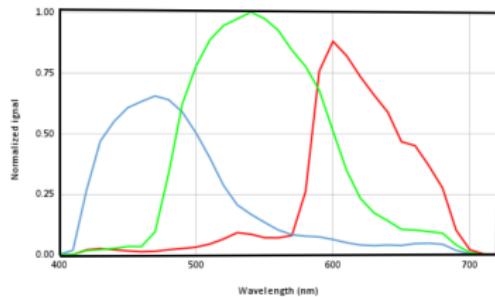
Split array into R, G, B as per Bayer pattern and take averages

Take average of all non-zero elements in the arrays

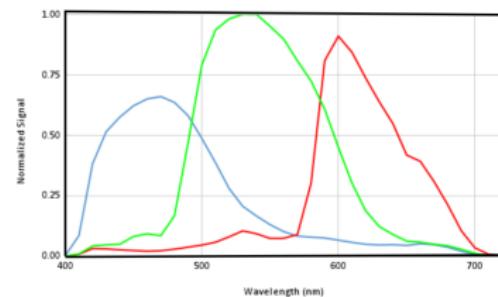
Repeat the procedure by changing ET or ISO keeping the frame constant



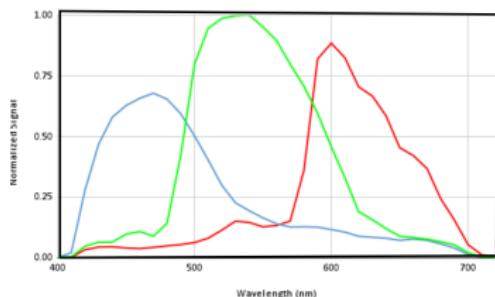
Spectral Response Curves



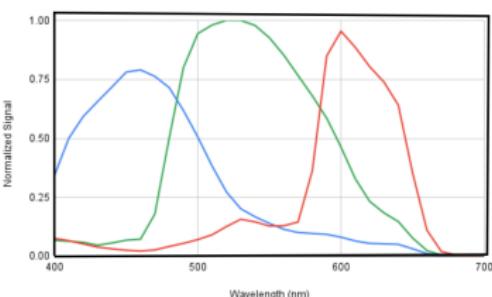
Spectral response curve
of sensor 1



Spectral response curve
of sensor 2

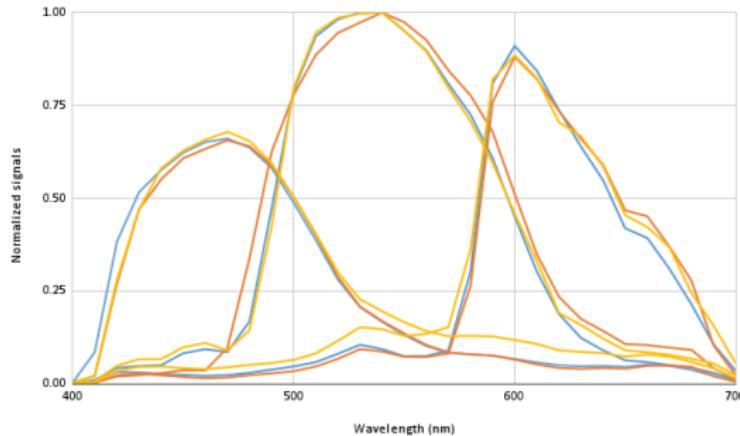


Spectral response curve
of sensor 3



Spectral response curve
of sensor 4





3 SRCs of smart phone cameras with different sensors compiled in one graph

- Possibility of coming up with a common SRC
- Limitations of monochromator, sharp edges in SRC



Blackbody calibration

- Validation of CRP on blackbody emissions



Calsys 1500BB furnace

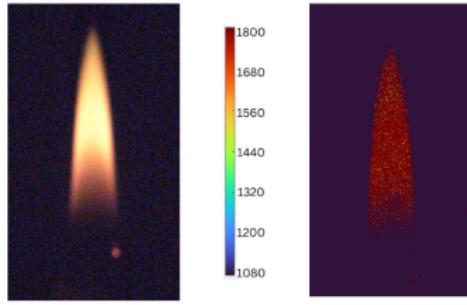
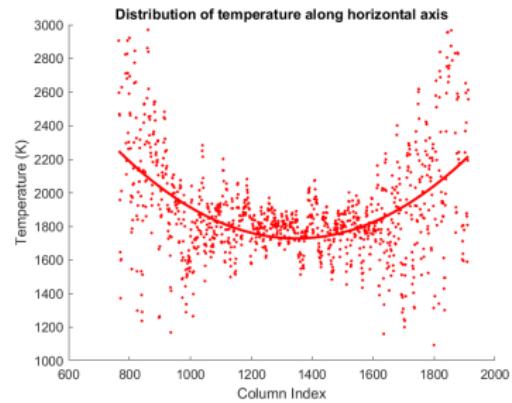
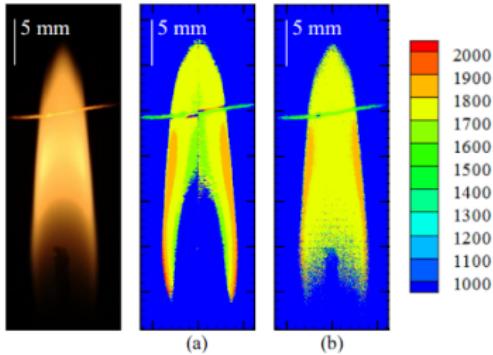
- Because of heater issues, couldn't collect data

Thermocouple Measurements

- One more validation method, Different types of thermocouples used- unsheathed K, sheathed N and unsheathed B
- K and N type thermocouples calibrated in Dry block setup (Fluke Calibration 9173) using DT 9828 DAQ
- The maximum observed error of 5 degrees Celsius at the highest temperature of the calibrator, 700 degrees celsius, but, K and N type thermocouples saturated below flame temperature
- B type thermocouple used to take the temperature measurements of flat flame



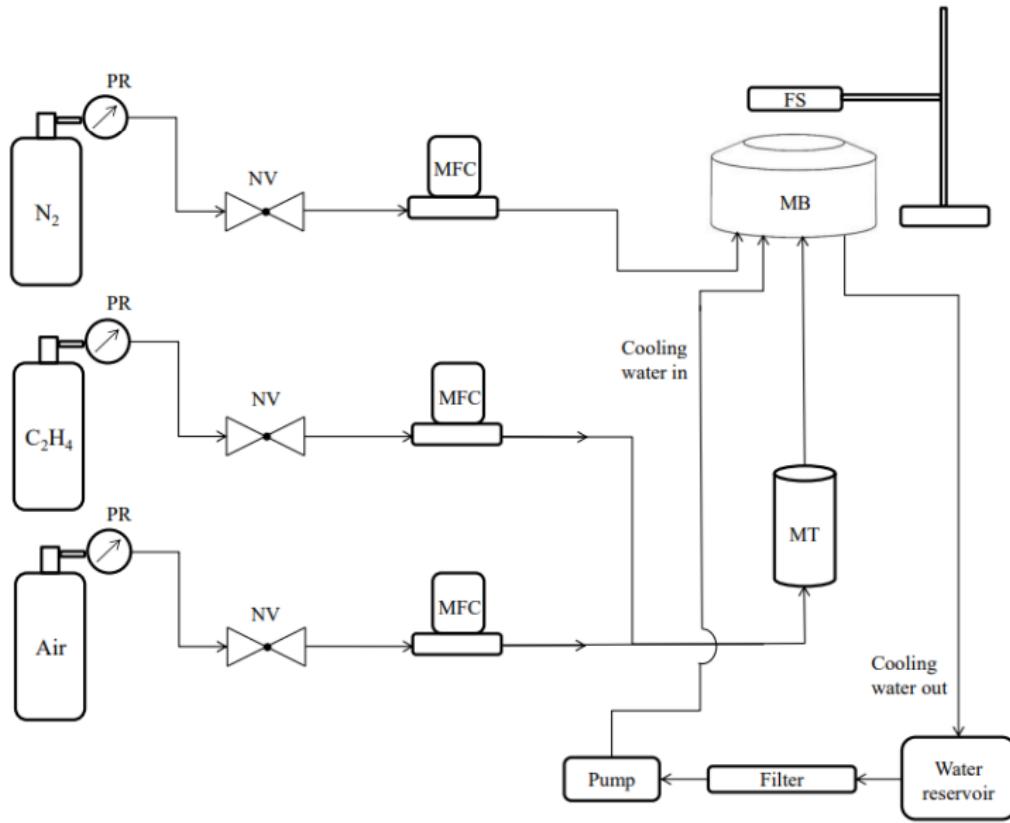
Candle Flame



Further, using Abel inversion, radial temperature profile can be found



Flat Flame



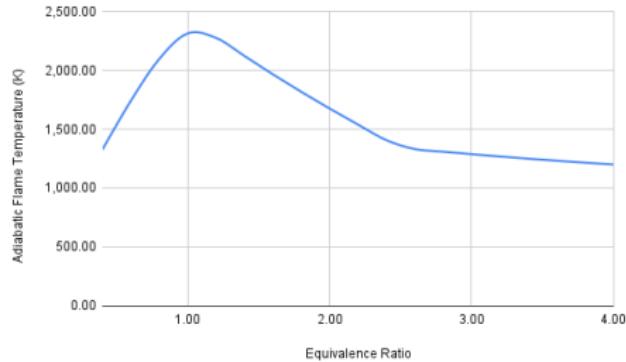
Flat Flame



Experimental Setup



Flat Flame

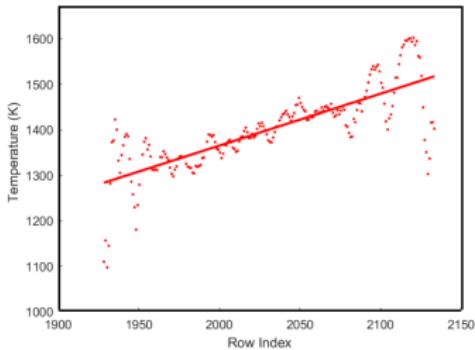
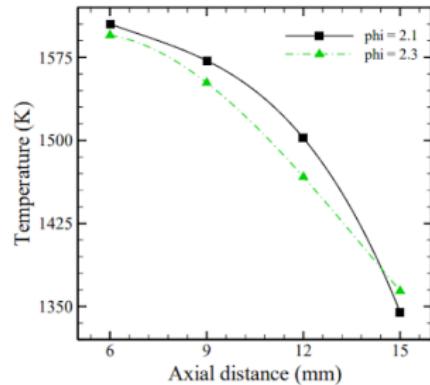


NASA CEA simulation results and comparison with actual experimental data

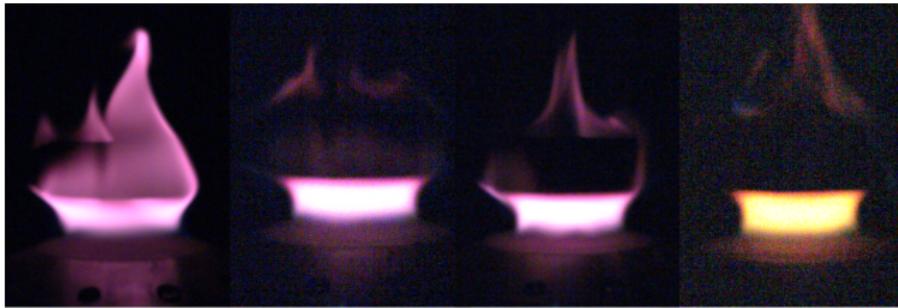
Equivalence Ratio	Median temperature along vertical axis (in K)	Mean temperature along vertical axis (in K)	Expected adiabatic flame temperature
2.1	1420	1425	1550
2.3	1395	1400	1450
2.5	1375	1385	1400



Flat Flame



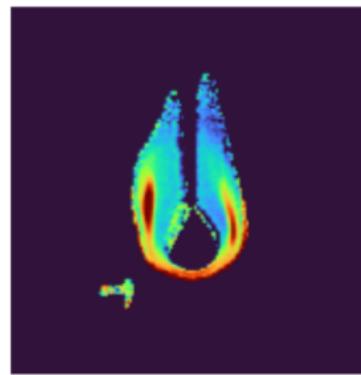
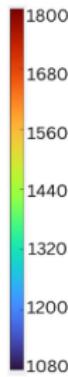
Variation of temperature along vertical axis of flat flame



Change in flame structure with variation in Nitrogen flow rate

Droplet Flame

- Coal tar pitch melted using a hotplate
- Quartz rod dipped in it
- The rod inserted inside the combustion chamber and ignited using



Droplet Flame

Droplet flame and temperature analysis of RP1 surrogate fuel

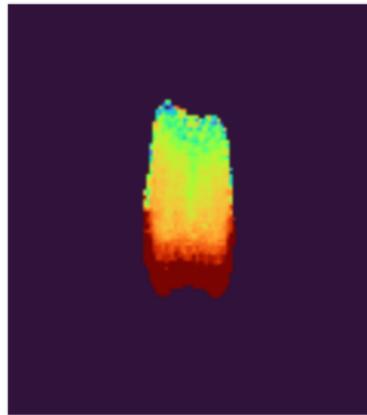
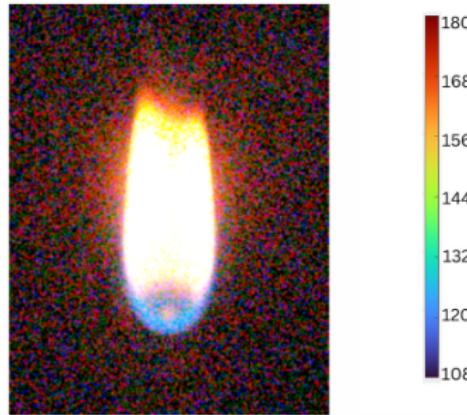


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Different Platforms

- Different platforms- Android Studio Code, Matlab Simulink: Android Support Package, MIT App inventor, Matlab App Designer
- Matlab finalized, as all the codes written in Matlab because of huge matrices
- Issue with Matlab exported code integration in Android Studio Code



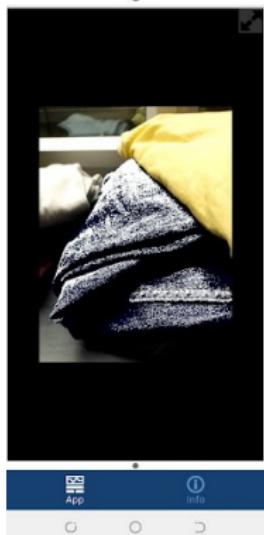
Application Developed



Mathematics operations performer
(Developed on
Android studio)



Camera preview app (Developed on Android studio)



Colour detection app (Developed using Matlab Simulink support package)



Checklist app (Developed using MIT app inventor)



Application Developed

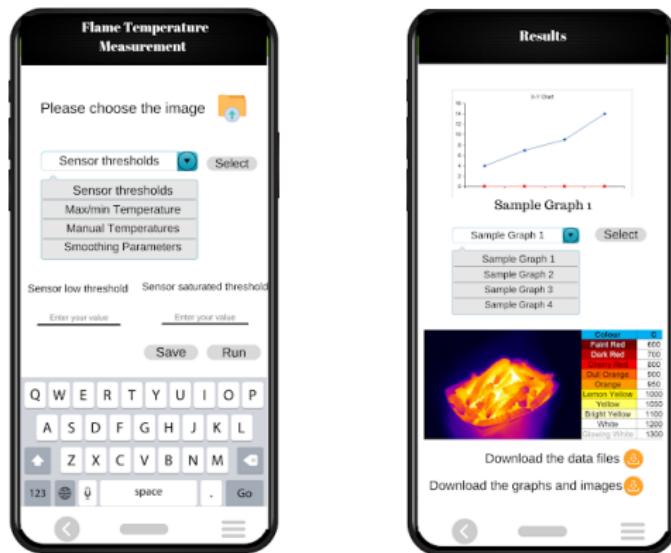
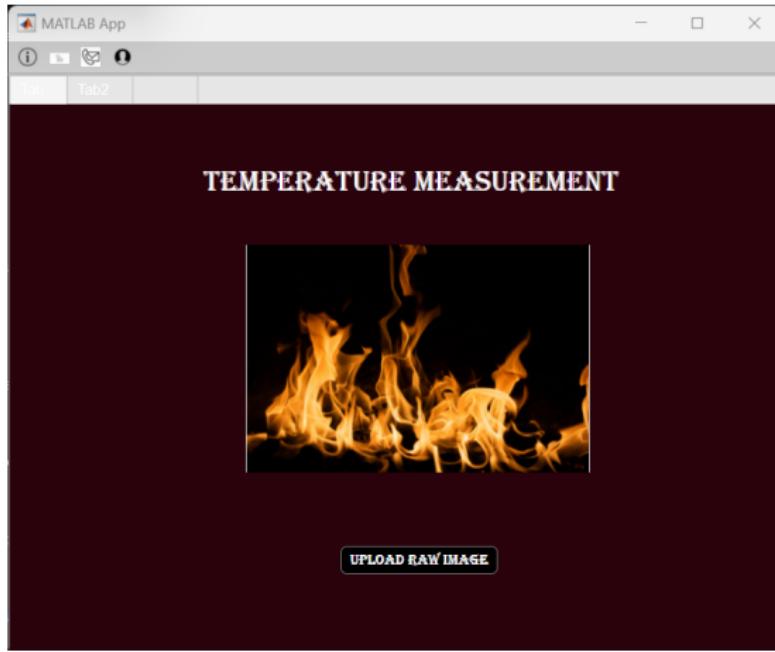


Figure: Future possibility of advanced Android App



Final Application



Final application developed on MATLAB appdesigner



RPI Product

- Need to calibrate every new sensor in case of smartphone
- Because of supply chain issue, RPi with lower specifications was used
- Enough processing power to take images, but not to process them
- Images transferred to desktop and processed
- Once the issue is resolved, the application can be integrated in RPi, too



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Conclusions and Future Work

- Successful development of CRP procedures for smartphone camera images
- Accurate flame temperature analysis with average error $<80\text{K}$
- Reliable results matching with DSLR camera-based CRP technique
- User-friendly and affordable Matlab app-based product
- Potential for future extension to analyze asymmetric and non-sooty flames
- Addressing calibration hurdle with RPi-based product for mass production
- Future possibilities: Abel inversion algorithm for radial temperature distribution and measuring soot fraction in flames
- Contributions to the field of flame temperature analysis and practical applications
- Encouragement for further research and development in smartphone camera-based CRP techniques



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Thank You for Your Attention!

