Proposal for IoT Mesh Network Weather Monitoring System Proof of Concept

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Summary

I propose to build four (4) small weather stations with cameras to track clouds and weather conditions as a proof of concept. It's open source, modular and cheap. Other systems cost USD 30K+, my proof of concept costs ~3900kr and will take until the end of July 2023 to build.

Background

Quick yet accurate Weather prediction is imperative for certain industries to now only survive, but simply exist. An important factor of these is the ability to track, categorize and predict movements of clouds within a given area. Ceilometers use a laser/light source to determine a cloud's base or ceiling height. A Ceilometer usually can also measure aerosol concentration in air [1]. The downside is that ceilometers have a relatively small area of measurement directly above the unit which would not be an issue, however, as of 2020 they can cost around USD \$30 000 per unit [3].

There exists however, high quality satellite data made available by NASA. The new MISR Level 2 Cloud product contains height-resolved, cloud motion vectors at 17.6 km resolution; cloud top heights at 1.1 km resolution; and cross-track cloud motion components at 1.1 km resolution [2]. Now this data is made available to be used by software engineers to visualize as needed. The issue? This data is not meant for real-time application on a local area level. These products are made for global application, collecting data only on the sunlit side of earth over the course of 9 days [4].

A better solution for the local-area level must be thought of then, to better predict cloud movement and category.

Proposal

In the case of local cloud monitoring, what I propose is needed is real-time, modular, and opensource as to avoid contractual right to repair issues. My plan is a mesh network comprised of simple esp32-based devices, equipped with a medium-resolution camera, hygrometer, altimeter, and gyroscope. I propose that with these devices, environmental readings and pictures of the sky can be transmitted to a central server in set time intervals for processing in essentially real-time. These measurements and images, in theory, can be used to determine cloud characteristics and movement in a way not done anywhere else. This system can then be used in conjunction with existing systems to provide more accurate weather data for a local area.

Cloud Height

An important factor for cloud monitoring is obtaining the cloud base height. The cloud base is the lowest point of the visible portion of a cloud, usually expressed in meters above sea level/planet surface. This can be calculated in close estimation by finding the lifted condensate level. The lifted condensation level or lifting condensation level (LCL) is formally defined as the height or pressure at which the relative humidity (RH) of an air parcel will reach 100% with respect to liquid water when it is cooled by dry adiabatic lifting. [5] The LCL can be approximated using the dew point,humidity and temperature a few different ways. The most popular being Espy's equation, which has been shown to be satisfactory for accurate readings within 200m. [6]

Cloud Identification

I have discovered it possible through a previous proof of concept, that it is theoretically possible to identify clouds from images of the sky, using only the visual colour space. In short, clouds are can be shown to be quite different in their colour content from the surrounding sky or landmarks (obviously). This can be seen in the below graph, showing the differences in the BGR colour space of clouds versus the sky.

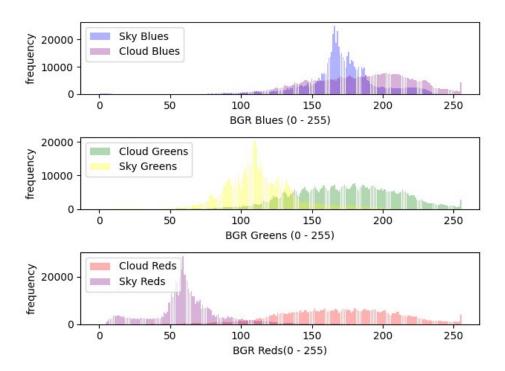


Figure showing frequency distribution in BGR colour channels of Sky versus Cloud Image set

This separation can also be seen in the HSV colour space, as shown below.

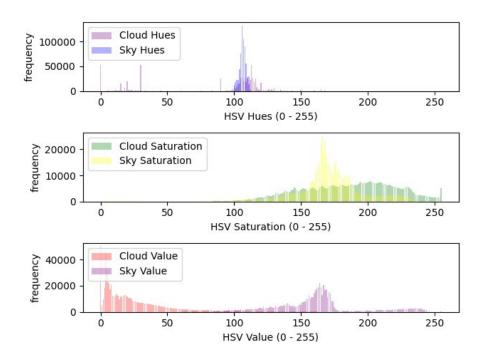


Figure showing frequency distribution in HSV colour channels of Sky versus Cloud Image set

Using singular value decomposition, we can view each colour channel separately as a principle component. Here we can see that two of each of our channels can be used to separate the cloud versus sky pixel values. Scree plots showing these can be seen below.

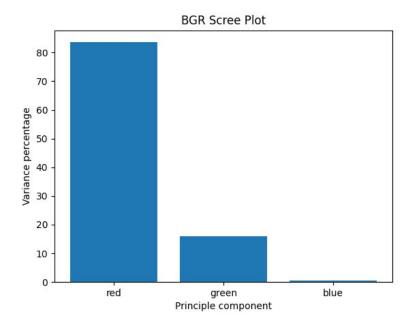


Figure showing ScreePlot of BGR colour channels in Sky versus Cloud Image set

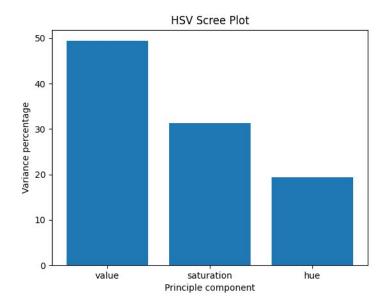


Figure showing ScreePlot of HSV colour channels in Sky versus Cloud Image set

Cloud Type Identification

This information then, can be used to train AI models to identify the cloud type. If we are able to estimate the cloud height, as well as having the environmental readings and a medium-resolution image, this should in theory be simple. I propose training a simple classification model using this data. Once the model is able to classify the cloud type and state its position in the image, we can move onto assigning it a motion vector.

Cloud Movement Information

Assigning motion vectors to identified clouds allows us to determine the direction, speed and even size of the cloud formation. This is done after undistorting the image using the camera's intrinsic distortion matrix, then mapping the cloud image onto 3D space given the angle of the camera to the sky. A cloud's size can be assigned from the image. This is important not only to keep a record of for tracking weather changes, but also determining the future cloud shade on the ground. A motion vector can be assigned to a cloud by comparing two images taken within the set time interval. In a situation where a cloud is larger than the viewing area of the camera, this idea of assigning motion vectors breaks down, however, this is where the idea of the mesh network comes into play.

Device arrangement

A mesh network is needed, not only to properly analyse very large clouds, but also to track them across large distances. I propose a grid arrangement, where, while the controllers may be placed at different heights, the edge of the view of one controller at a pre-determined height, must be the beginning of the viewing area of another.

For example: If a minimum viewing height of 1.98km is chosen (the average minimum height of cumuli-nimbus clouds) [7], and a camera with a 90 deg angle of view (relatively small) at that height is used, then an area of ~3.96km can be covered by a single camera. This means that for continuous viewing, cameras must be placed every ~4km in all directions. In reality, cameras with wider FOVs exist, making this a somewhat worst case scenario.

Bill of materials

- 1. 4 esp-32 CAM boards to arrange in a grid pattern. I chose these at ~200kr each
- 2. 4 medium-quality cameras. I chose the OV5670 at ~300kr each.
- 3. 4 high accuracy humidity sensors. I chose the SHT31-D at ~230kr each.
- 4. 4 high accuracy altimeters. I chose the BMP390 at ~180kr each.
- 5. 4 gyroscopes. I chose the MPU-6050 at ~52kr each.

All other materials are already possessed.

A Total of: 3848 sek

Expected time

If shipping times remain in my favour, I should be able to construct the 4 weather stations by the end of July, 2023.

For the requested parts list, supply is short and resources for usage are sparce.

References

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[4] "Misr: Spatial resolution," NASA, https://misr.jpl.nasa.gov/mission/misr-instrument/spatial-resolution/ (accessed May 19, 2023).

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[5] "tlcl_rh_bolton," Tlcl_rh_bolton, https://www.ncl.ucar.edu/Document/Functions/Contributed/tlcl_rh_bolton.shtml (accessed May 21, 2023)

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[6] Muñoz, Erith & Mundaray, Rafael & Falcon, Nelson. (2015). A Simplified Analytical Method to Calculate the Lifting Condensation Level from a Skew-T Log-P Chart. Avances en Ciencias e Ingenieria. 7. C124-C129

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[7] Wmo, "Cumulonimbus," International Cloud Atlas, https://cloudatlas.wmo.int/en/observation-of-clouds-from-aircraft-descriptions-cumulonimbus.html (accessed May 21, 2023)

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