

Stress tests for Raspberry Pi 4 and 3B+

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This is a test abstract.

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1 Introduction

The aim of this notebook is to stress the Raspberry Pi 4 for deciding between different cases and cooling types.

Sources:

- <https://github.com/nschloe/stressberry>
- <https://www.pragmaticlinux.com/2020/06/check-the-raspberry-pi-cpu-temperature/>

2 Implementation of helper functions

2.1 Load globally used libraries and set plot parameters

```
[1]: import subprocess
import os
import threading
import time

import smbus2
import bme280

import pandas as pd
import numpy as np
import prettytable as pt

import matplotlib.pyplot as plt
import matplotlib.dates as mdates
%matplotlib inline

# FutureWarning: Using an implicitly registered datetime converter for a matplotlib_
→plotting method.
# The converter was registered by pandas on import.
# Future versions of pandas will require you to explicitly register matplotlib_
→converters.
from pandas.plotting import register_matplotlib_converters
register_matplotlib_converters()

from IPython.display import set_matplotlib_formats
set_matplotlib_formats('pdf', 'png')

plt.rcParams['savefig.dpi'] = 80
plt.rcParams['savefig.bbox'] = "tight"

plt.rcParams['figure.autolayout'] = False
plt.rcParams['figure.figsize'] = 10, 6
plt.rcParams['axes.labelsize'] = 18
plt.rcParams['axes.titlesize'] = 20
plt.rcParams['font.size'] = 16
plt.rcParams['lines.linewidth'] = 2.0
plt.rcParams['lines.markersize'] = 8
plt.rcParams['legend.fontsize'] = 14

# Need to install dependent package first via 'apt install cm-super'
plt.rcParams['text.usetex'] = True
plt.rcParams['font.family'] = "serif"
plt.rcParams['font.serif'] = "cm"
```

```
/home/bk/jupyter-env/lib/python3.7/site-packages/ipykernel_launcher.py:24:
DeprecationWarning: `set_matplotlib_formats` is deprecated since IPython 7.23,
directly use `matplotlib_inline.backend_inline.set_matplotlib_formats()``
```

2.2 Variant 1: Function for reading the CPU core temperature

This implementation retrieves the temperature information from the system file `/sys/class/thermal/thermal_zone0/temp`.

```
[2]: # Function for reading the CPU core temperature
# Found here: https://www.pragmaticlinux.com/2020/06/
# →check-the-raspberry-pi-cpu-temperature/
def get_cpu_temp_old():
    """
    Obtains the current value of the CPU temperature.
    :returns: Current value of the CPU temperature if successful, zero value_
    →otherwise.
    :rtype: float
    """
    # Initialize the result.
    result = 0.0
    # The first line in this file holds the CPU temperature as an integer times_
    →1000.
    # Read the first line and remove the newline character at the end of the string.
    if os.path.isfile('/sys/class/thermal/thermal_zone0/temp'):
        with open('/sys/class/thermal/thermal_zone0/temp') as f:
            line = f.readline().strip()
            # Test if the string is an integer as expected.
            if line.isdigit():
                # Convert the string with the CPU temperature to a float in degrees_
                →Celsius.
                result = float(line) / 1000
            # Give the result back to the caller.
    return result
```

2.3 Variant 2: Function for reading the CPU core temperature (used here)

This implementation retrieves the temperature information from the command line tool `vcgencmd`. In the bash console you can get the same result by issuing:

```
$ vcgencmd measure_temp
```

```
[3]: # Function for reading the CPU core temperature
# Found here: https://github.com/nschloe/stressberry/blob/main/stressberry/main.py
def get_cpu_temp(filename=None):
    """Returns the core temperature in Celsius."""
    if filename is not None:
        with open(filename) as f:
            temp = float(f.read()) / 1000
    else:
        # Using vcgencmd is specific to the raspberry pi
        out = subprocess.check_output(["vcgencmd", "measure_temp"]).decode("utf-8")
        temp = float(out.replace("temp=", "").replace("'C", ""))

    return temp
```

2.4 Function for reading the CPU core frequency

The frequency information is retrieved from the command line tool `vcgencmd` also. In the bash console you can get the same result by issuing:

```
$ vcgencmd measure_clock arm
```

Issue regarding the **Raspberry Pi 3B+** (2021-06-01):

With the latest Raspbian updates there seems to be a bug in reading the CPU frequency with the otherwise propagated command line call `vcgencmd measure_clock arm`. With this call only frequencies

around 600 MHz are displayed even under full load of the CPU. The direct query of the `/sys` device tree provides the correct results for the first core:

```
$ cat /sys/devices/system/cpu/cpu0/cpufreq/scaling_cur_freq
```

Therefore, the function has been extended to first query which Raspberry Pi hardware is present. If it is a **RPi 3B+**, the current CPU frequency is queried directly from the device tree instead of via the `vcgencmd` tools.

```
[4]: # Function for reading the CPU core frequency
def get_cpu_freq(filename=None):
    if os.path.isfile('/sys/firmware/devicetree/base/model'):
        with open('/sys/firmware/devicetree/base/model') as f:
            hw_version = f.readline().strip()

    # RPi 3B+: there seems to be a bug in reading CPU frequency with 'vcgencmd'
    if (hw_version.startswith('Raspberry Pi 3 Model B Plus')):
        if os.path.isfile('/sys/devices/system/cpu/cpu0/cpufreq/scaling_cur_freq'):
            with open('/sys/devices/system/cpu/cpu0/cpufreq/scaling_cur_freq') as f:
                line = f.readline().strip()
                # Test if the string is an integer as expected.
                if line.isdigit():
                    # Convert the string with the CPU frequency to a float in MHz.
                    frequency = float(line) / 1000
    # RPi 4B: 'vcgencmd' does work as expected ...
    else:
        """Returns the CPU frequency in MHz"""
        if filename is not None:
            with open(filename) as f:
                frequency = float(f.read()) / 1000
        else:
            # Only vcgencmd measure_clock arm is accurate on Raspberry Pi.
            # Per: https://www.raspberrypi.org/forums/viewtopic.php?f=63&t=219358&start=25
            out = subprocess.check_output(["vcgencmd", "measure_clock arm"]).
            decode("utf-8")
            frequency = float(out.split("=")[1]) / 1000000

    return frequency
```

2.5 Function for reading the ambient temperature

In order to compare the recorded CPU core temperatures of the different housing and cooling scenarios, the temperature curves must be normalized with the curves of the simultaneously measured ambient temperature.

However, only the curves of the so-called “overtemperature” are comparable, which is the difference between the curves of the CPU core temperature and the ambient temperature.

The external Bosch sensor *BME280* is used to measure the ambient temperature. This is connected to the Raspberry Pi via a USB-I2C adapter. The installation of the required kernel module is described in the Jupyter notebook [BME280.ipynb](#).

```
[5]: # i2c bus on /dev/i2c-11
port = 11
# i2c address of BME280
address = 0x76
bus = smbus2.SMBus(port)

# Function for reading the ambient temperature
```

```
# Found here: https://github.com/nschloe/stressberry/blob/main/stressberry/main.py
def get_ambient_temp():
    """Returns the ambient temperature in Celsius."""

    calibration_params = bme280.load_calibration_params(bus, address)

    # the sample method will take a single reading and return
    # a compensated reading object
    data_obj = bme280.sample(bus, address, calibration_params)

    return data_obj.temperature
```

2.6 Helper functions for stressing all cores of the CPU

Stress is created by the command line tool `stress`. It has to be installed first by issuing:

```
$ sudo apt install stress
```

```
[6]: # Helper function to call the 'stress' command line tool
def stress_cpu(num_cpus, time):
    subprocess.check_call(["stress", "--cpu", str(num_cpus), "--timeout",
        →f"{time}s"])
    return

[7]: # Function for stressing all cores of the CPU
# Found here: https://github.com/nschloe/stressberry/blob/main/stressberry/main.py
def run_stress(stress_duration=300, idle_duration=120, cores=None):
    """Run stress test for specified duration with specified idle times
    at the start and end of the test.
    """
    if cores is None:
        cores = os.cpu_count()

    print(f"Preparing to stress [{cores}] CPU Cores for [{stress_duration}]
    →seconds")
    print(f"Idling for {idle_duration} seconds...")
    time.sleep(idle_duration)

    print(f"Starting the stress load on [{cores}] CPU Cores for [{stress_duration}]
    →seconds")
    stress_cpu(num_cpus=cores, time=stress_duration)

    print(f"Idling for {idle_duration} seconds...")
    time.sleep(idle_duration)
```

2.7 Helper function to let the CPU cool down

This function is used to let the CPU cool down first to find a stable baseline.

```
[8]: def cpu_cooldown(interval=60, filename=None):
    """Lets the CPU cool down until the temperature does not change anymore."""
    prev_tmp = get_cpu_temp()
    while True:
        time.sleep(interval)
        tmp = get_cpu_temp()
        print(
```

```

        f"Current temperature: {tmp:4.1f}°C - "
        f"Previous temperature: {prev_tmp:4.1f}°C"
    )
    if abs(tmp - prev_tmp) < 0.2:
        break
    prev_tmp = tmp
    return tmp

```

2.8 Helper function for handling dataframes

First, a dataframe is created and at the same time the column headers are set. The function `dataframe_add_row()` is used to add the measured values to the dataframe in the form of new rows.

```

[9]: # Dataframe for the measuring values
df_meas_values = pd.DataFrame(columns=['Time', 'CPU Temperature', 'CPU Frequency',
    ↪ 'Ambient Temperature'])

```

```

[10]: def dataframe_add_row(df=None, row=[]):
        if (df is None):
            return

        # Add a row
        df.loc[-1] = row

        # Shift the index
        df.index = df.index + 1

        # Reset the index of dataframe and avoid the old index being added as a column
        df.reset_index(drop=True, inplace=True)

```

2.9 Main worker function

```

[11]: # Function for running the stress test in another thread while measuring CPU
    ↪ temperature and frequency
# Found here: https://github.com/nschloe/stressberry/blob/main/stressberry/cli/run.
    ↪ py
def run(argv=None):
    # Cool down first
    print("Awaiting stable baseline temperature ...")
    cpu_cooldown(interval=60)

    # Start the stress test in another thread
    t = threading.Thread(
        target=lambda: run_stress(stress_duration=900, idle_duration=300, cores=4),
    ↪ args=()
    )
    # Init event handler for killing the thread
    t.event = threading.Event()
    # Start the thread
    t.start()

    # Init row array
    values_row = []
    # Get starting time
    start_time = time.time()
    while t.is_alive():

```

```

try:
    # Get time relative to starting time and round to 1 decimal
    timestamp = float("{:.1f}".format(time.time() - start_time))
    # Get CPU temperature and round to 1 decimal
    temperature_cpu = float("{:.1f}".format(get_cpu_temp()))
    # Get ambient temperature and round to 1 decimal
    temperature_ambient = float("{:.1f}".format(get_ambient_temp()))
    # Get CPU frequency and round to 1 decimal
    frequency = float("{:.1f}".format(get_cpu_freq()))

    values_row = [ timestamp,
                   temperature_cpu,
                   frequency,
                   temperature_ambient
                 ]

    dataframe_add_row(df_meas_values, values_row)

    print(
        f"Time: {timestamp} s,\t"
        f"CPU Temperature: {temperature_cpu} °C,\t"
        f"Ambient Temperature: {temperature_ambient} °C,\t"
        f"Frequency: {frequency} MHz"
    )

    # Choose the sample interval such that we have a respectable number of
    ↪ data points
    t.join(2.0)

except:
    print("Keyboard Interrupt ^C detected.")
    print("Bye.")
    # Stop the thread by calling the event
    t.event.set()
    break

# Normalize times so we are starting at '0 s'
#time0 = df_meas_values['Time'][0]
# It's a really fancy oneliner - but not necessary at all ...
#df_meas_values['Time'] = [tm - time0 for tm in df_meas_values['Time']]

```

3 Run the heating test

```

[ ]: # Clear all data in dataframe
df_meas_values = df_meas_values.iloc[0:0]

run()

```

```

[13]: display(df_meas_values)

```

	Time	CPU Temperature	CPU Frequency	Ambient Temperature
0	0.0	35.5	1000.2	24.3
1	2.1	35.5	1000.2	24.3
2	4.3	35.5	800.2	24.3
3	6.4	35.5	800.2	24.3
4	8.5	34.0	1000.3	24.3


```

...      ...      ...      ...      ...
694  1490.6      36.0      900.2      24.5
695  1492.7      36.5      800.2      24.6
696  1494.8      36.5      900.2      24.6
697  1497.0      36.0      800.2      24.6
698  1499.1      37.0      900.2      24.6

```

[699 rows x 4 columns]

4 Save all to CSV files

```

[14]: # Write dataframe to CSV file
str_file_prefix_b4 = 'RaspiB4JupyterLab_stress_measurement'
str_file_prefix_b3plus = 'RaspiB3plusEPaper_stress_measurement'

#df_meas_values.to_csv(r'./data_files/' + str_file_prefix_b4 +
    ↳ '_PlasticCase_woHeatSinks.csv', sep = '\t', index = False, header=True)
#df_meas_values.to_csv(r'./data_files/' + str_file_prefix_b4 +
    ↳ '_PlasticCase_wHeatSinks.csv', sep = '\t', index = False, header=True)
#df_meas_values.to_csv(r'./data_files/' + str_file_prefix_b4 +
    ↳ '_PlasticCase_wHeatSinks_siliconPad.csv', sep = '\t', index = False, header=True)
#df_meas_values.to_csv(r'./data_files/' + str_file_prefix_b4 +
    ↳ '_PlasticCase_wCopperHeatSink_siliconPad.csv', sep = '\t', index = False,
    ↳ header=True)
#df_meas_values.to_csv(r'./data_files/' + str_file_prefix_b4 +
    ↳ '_PlasticCase_wHeatSinksAndFan5V.csv', sep = '\t', index = False, header=True)
#df_meas_values.to_csv(r'./data_files/' + str_file_prefix_b4 +
    ↳ '_PlasticCase_wHeatSinksAndFan3V.csv', sep = '\t', index = False, header=True)
#df_meas_values.to_csv(r'./data_files/' + str_file_prefix_b4 +
    ↳ '_PlasticCase_wHeatSinksAndFan5Vrev.csv', sep = '\t', index = False, header=True)
#df_meas_values.to_csv(r'./data_files/' + str_file_prefix_b4 +
    ↳ '_pinkRaspiCase_wHeatSinks.csv', sep = '\t', index = False, header=True)
#df_meas_values.to_csv(r'./data_files/' + str_file_prefix_b4 +
    ↳ '_PlasticCase_wHeatSinksAndNoctuaFan5V.csv', sep = '\t', index = False,
    ↳ header=True)
#df_meas_values.to_csv(r'./data_files/' + str_file_prefix_b4 +
    ↳ '_PlasticCase_wHeatSinksAndNoctuaFan3V.csv', sep = '\t', index = False,
    ↳ header=True)
df_meas_values.to_csv(r'./data_files/' + str_file_prefix_b4 +
    ↳ '_PlasticCase_wCopperHeatSinkAndNoctuaFan3V.csv', sep = '\t', index = False,
    ↳ header=True)
#df_meas_values.to_csv(r'./data_files/' + str_file_prefix_b4 +
    ↳ '_PlasticCase_wHeatSinksAndNoctuaFan5Vrev.csv', sep = '\t', index = False,
    ↳ header=True)
#df_meas_values.to_csv(r'./data_files/' + str_file_prefix_b4 +
    ↳ '_woCase_wHeatSinksAndCtrlFan5V_70C.csv', sep = '\t', index = False, header=True)
#df_meas_values.to_csv(r'./data_files/' + str_file_prefix_b4 +
    ↳ '_woCase_wHeatSinksAndCtrlFan5V_65C.csv', sep = '\t', index = False, header=True)

#df_meas_values.to_csv(r'./data_files/' + str_file_prefix_b3plus +
    ↳ '_PlasticCase_wHeatSinks.csv', sep = '\t', index = False, header=True)

```

5 Read in the CSV files and plot the measurements

5.1 Read in the CSV files in dataframes

```
[15]: # Helper function for creating dataframes from CSV files
def create_dictionary_from_csv(filename, offset=0, cols_wanted=1):
    my_dataframe = pd.read_csv(filename, sep='\t', index_col=False, decimal='.',
    ↪header=offset)

    # Delete all cloumns after the desired ones
    my_dataframe.drop(my_dataframe.columns[cols_wanted:], axis=1, inplace=True)

    return my_dataframe

[34]: str_file_prefix_b4 = 'RaspiB4JupyterLab_stress_measurement'
str_file_prefix_b3plus = 'RaspiB3plusEPaper_stress_measurement'

str_file_name_1 = str_file_prefix_b4 + '_PlasticCase_woHeatSinks.csv'
str_file_name_2 = str_file_prefix_b4 + '_PlasticCase_wHeatSinks.csv'
str_file_name_13 = str_file_prefix_b4 + '_PlasticCase_wHeatSinks_siliconPad.csv'
str_file_name_14 = str_file_prefix_b4 + '_PlasticCase_wCopperHeatSink_siliconPad.
    ↪.csv'

str_file_name_3 = str_file_prefix_b4 + '_PlasticCase_wHeatSinksAndFan5V.csv'
str_file_name_4 = str_file_prefix_b4 + '_PlasticCase_wHeatSinksAndFan3V.csv'
str_file_name_5 = str_file_prefix_b4 + '_PlasticCase_wHeatSinksAndFan5Vrev.csv'
str_file_name_6 = str_file_prefix_b4 + '_pinkRaspiCase_wHeatSinks.csv'
str_file_name_7 = str_file_prefix_b4 + '_PlasticCase_wHeatSinksAndNoctuaFan5V.csv'
str_file_name_8 = str_file_prefix_b4 + '_PlasticCase_wHeatSinksAndNoctuaFan3V.csv'
str_file_name_15 = str_file_prefix_b4 + '_PlasticCase_wCopperHeatSinkAndNoctuaFan3V.
    ↪.csv'

str_file_name_11 = str_file_prefix_b4 + '_PlasticCase_wHeatSinksAndNoctuaFan5Vrev.
    ↪.csv'

str_file_name_10 = str_file_prefix_b4 + '_woCase_wHeatSinksAndCtrlFan5V_70C.csv'
str_file_name_12 = str_file_prefix_b4 + '_woCase_wHeatSinksAndCtrlFan5V_65C.csv'

str_file_name_9 = str_file_prefix_b3plus + '_PlasticCase_wHeatSinks.csv'

df_1_PC_woHeatSinks = create_dictionary_from_csv(filename="./data_files/" +
    ↪str_file_name_1, offset=0, cols_wanted=4)
df_2_PC_wHeatSinks = create_dictionary_from_csv(filename="./data_files/" +
    ↪str_file_name_2, offset=0, cols_wanted=4)
df_13_PC_wHeatSinks_siliconPad = create_dictionary_from_csv(filename="./data_files/"
    ↪ + str_file_name_13, offset=0, cols_wanted=4)
df_14_PC_wCopperHeatSink_siliconPad = create_dictionary_from_csv(filename="./
    ↪data_files/" + str_file_name_14, offset=0, cols_wanted=4)
df_3_PC_wHeatSinksAndFan5V = create_dictionary_from_csv(filename="./data_files/" +
    ↪str_file_name_3, offset=0, cols_wanted=4)
df_4_PC_wHeatSinksAndFan3V = create_dictionary_from_csv(filename="./data_files/" +
    ↪str_file_name_4, offset=0, cols_wanted=4)
df_5_PC_wHeatSinksAndFan5Vrev = create_dictionary_from_csv(filename="./data_files/"
    ↪ + str_file_name_5, offset=0, cols_wanted=4)
df_6_RC_wHeatSinks = create_dictionary_from_csv(filename="./data_files/" +
    ↪str_file_name_6, offset=0, cols_wanted=4)
df_7_PC_wHeatSinksAndNoctuaFan5V = create_dictionary_from_csv(filename="./
    ↪data_files/" + str_file_name_7, offset=0, cols_wanted=4)
```

```

df_8_PC_wHeatSinksAndNoctuaFan3V = create_dictionary_from_csv(filename="./
↳data_files/" + str_file_name_8, offset=0, cols_wanted=4)
df_15_PC_wCopperHeatSinkAndNoctuaFan3V = create_dictionary_from_csv(filename="./
↳data_files/" + str_file_name_15, offset=0, cols_wanted=4)
df_11_PC_wHeatSinksAndNoctuaFan5Vrev = create_dictionary_from_csv(filename="./
↳data_files/" + str_file_name_11, offset=0, cols_wanted=4)

df_10_woC_wHeatSinksAndCtrlFan5V_70C = create_dictionary_from_csv(filename="./
↳data_files/" + str_file_name_10, offset=0, cols_wanted=4)
df_12_woC_wHeatSinksAndCtrlFan5V_65C = create_dictionary_from_csv(filename="./
↳data_files/" + str_file_name_12, offset=0, cols_wanted=4)

df_9_PC_wHeatSinks = create_dictionary_from_csv(filename="./data_files/" +
↳str_file_name_9, offset=0, cols_wanted=4)

```

```

[17]: #df_1_PC_woHeatSinks.head(6)
      #df_2_PC_wHeatSinks.head(6)
      #df_13_PC_wHeatSinks_siliconPad.head(6)
      #df_14_PC_wCopperHeatSink_siliconPad.head(6)
      #df_3_PC_wHeatSinksAndFan5V.head(6)
      #df_4_PC_wHeatSinksAndFan3V.head(6)
      #df_5_PC_wHeatSinksAndFan5Vrev.head(6)
      #df_6_RC_wHeatSinks.head(6)
      #df_7_PC_wHeatSinksAndNoctuaFan5V.head(6)
      #df_8_PC_wHeatSinksAndNoctuaFan3V.head(6)
      df_15_PC_wCopperHeatSinkAndNoctuaFan3V.head(6)
      #df_11_PC_wHeatSinksAndNoctuaFan5Vrev.head(6)

      #df_10_woC_wHeatSinksAndCtrlFan5V_70C.head(6)
      #df_12_woC_wHeatSinksAndCtrlFan5V_65C.head(6)

      #df_9_PC_wHeatSinks.head(6)

```

```

[17]:   Time  CPU Temperature  CPU Frequency  Ambient Temperature
0   0.0             35.5           1000.2             24.3
1   2.1             35.5           1000.2             24.3
2   4.3             35.5             800.2             24.3
3   6.4             35.5             800.2             24.3
4   8.5             34.0           1000.3             24.3
5  10.7             35.5             800.2             24.3

```

```

[18]: #df_1_PC_woHeatSinks.dtypes
      #df_2_PC_wHeatSinks.dtypes
      #df_13_PC_wHeatSinks_siliconPad.dtypes
      #df_14_PC_wCopperHeatSink_siliconPad.dtypes
      #df_3_PC_wHeatSinksAndFan5V.dtypes
      #df_4_PC_wHeatSinksAndFan3V.dtypes
      #df_5_PC_wHeatSinksAndFan5Vrev.dtypes
      #df_6_RC_wHeatSinks.dtypes
      #df_7_PC_wHeatSinksAndNoctuaFan5V.dtypes
      #df_8_PC_wHeatSinksAndNoctuaFan3V.dtypes
      df_15_PC_wCopperHeatSinkAndNoctuaFan3V.dtypes
      #df_11_PC_wHeatSinksAndNoctuaFan5Vrev.dtypes

      #df_10_woC_wHeatSinksAndCtrlFan5V_70C.dtypes
      #df_12_woC_wHeatSinksAndCtrlFan5V_65C.dtypes

```

```
#df_9_PC_wHeatSinks.dtypes
```

```
[18]: Time                float64
      CPU Temperature      float64
      CPU Frequency        float64
      Ambient Temperature  float64
      dtype: object
```

5.2 Smoothing with a moving average filter

```
[35]: # Smooth temperature column only!
      i_window =10

      df_1_PC_woHeatSinks['CPU Temperature'] = df_1_PC_woHeatSinks['CPU Temperature'].
        ↳rolling(window=i_window).mean()
      df_2_PC_wHeatSinks['CPU Temperature'] = df_2_PC_wHeatSinks['CPU Temperature'].
        ↳rolling(window=i_window).mean()
      df_13_PC_wHeatSinks_siliconPad['CPU Temperature'] =_
        ↳df_13_PC_wHeatSinks_siliconPad['CPU Temperature'].rolling(window=i_window).mean()
      df_14_PC_wCopperHeatSink_siliconPad['CPU Temperature'] =_
        ↳df_14_PC_wCopperHeatSink_siliconPad['CPU Temperature'].rolling(window=i_window).
        ↳mean()
      df_3_PC_wHeatSinksAndFan5V['CPU Temperature'] = df_3_PC_wHeatSinksAndFan5V['CPU_
        ↳Temperature'].rolling(window=i_window).mean()
      df_4_PC_wHeatSinksAndFan3V['CPU Temperature'] = df_4_PC_wHeatSinksAndFan3V['CPU_
        ↳Temperature'].rolling(window=i_window).mean()
      df_5_PC_wHeatSinksAndFan5Vrev['CPU Temperature'] =_
        ↳df_5_PC_wHeatSinksAndFan5Vrev['CPU Temperature'].rolling(window=i_window).mean()
      df_6_RC_wHeatSinks['CPU Temperature'] = df_6_RC_wHeatSinks['CPU Temperature'].
        ↳rolling(window=i_window).mean()
      df_7_PC_wHeatSinksAndNoctuaFan5V['CPU Temperature'] =_
        ↳df_7_PC_wHeatSinksAndNoctuaFan5V['CPU Temperature'].rolling(window=i_window).
        ↳mean()
      df_8_PC_wHeatSinksAndNoctuaFan3V['CPU Temperature'] =_
        ↳df_8_PC_wHeatSinksAndNoctuaFan3V['CPU Temperature'].rolling(window=i_window).
        ↳mean()
      df_15_PC_wCopperHeatSinkAndNoctuaFan3V['CPU Temperature'] =_
        ↳df_15_PC_wCopperHeatSinkAndNoctuaFan3V['CPU Temperature'].
        ↳rolling(window=i_window).mean()
      df_11_PC_wHeatSinksAndNoctuaFan5Vrev['CPU Temperature'] =_
        ↳df_11_PC_wHeatSinksAndNoctuaFan5Vrev['CPU Temperature'].rolling(window=i_window).
        ↳mean()

      df_10_woC_wHeatSinksAndCtrlFan5V_70C['CPU Temperature'] =_
        ↳df_10_woC_wHeatSinksAndCtrlFan5V_70C['CPU Temperature'].rolling(window=i_window).
        ↳mean()
      df_12_woC_wHeatSinksAndCtrlFan5V_65C['CPU Temperature'] =_
        ↳df_12_woC_wHeatSinksAndCtrlFan5V_65C['CPU Temperature'].rolling(window=i_window).
        ↳mean()

      df_9_PC_wHeatSinks['CPU Temperature'] = df_9_PC_wHeatSinks['CPU Temperature'].
        ↳rolling(window=i_window).mean()
```

```
[24]: df_15_PC_wCopperHeatSinkAndNoctuaFan3V
```

```
[24]:
```

	Time	CPU Temperature	CPU Frequency	Ambient Temperature
0	0.0	NaN	1000.2	24.3
1	2.1	NaN	1000.2	24.3
2	4.3	NaN	800.2	24.3
3	6.4	NaN	800.2	24.3
4	8.5	NaN	1000.3	24.3
..
694	1490.6	36.706667	900.2	24.5
695	1492.7	36.706667	800.2	24.6
696	1494.8	36.673333	900.2	24.6
697	1497.0	36.626667	800.2	24.6
698	1499.1	36.596667	900.2	24.6

[699 rows x 4 columns]

5.3 Helper function for plotting the single measurements

This function is used to plot the CPU temperature, the CPU frequency and the ambient temperature from a single measurement.

```
[25]: # Function for plotting the single measurements
def plot_single_measurement(df_to_plot, str_title, str_image_file_name):
    """Plot the CPU temperature, the CPU frequency and
    the ambient temperature from a single measurement.
    """

    # Figsize: a tuple (width, height) in inches
    # Create figure and axis objects with subplots()
    fig, ax1 = plt.subplots(num=0, figsize=(20, 10), dpi=80, facecolor='w',
    ↪edgecolor='k')

    axes = plt.gca()

    plt.title(str_title)

    # List of named colors: https://matplotlib.org/stable/gallery/color/
    ↪named_colors.html
    line1 = ax1.plot(df_to_plot['Time'], df_to_plot['CPU Temperature'],
    ↪color='navy', label='CPU Temperature')
    line2 = ax1.plot(df_to_plot['Time'], df_to_plot['Ambient Temperature'],
    ↪color='lightseagreen', label='Ambient Temperature')

    #df_10_woC_wHeatSinksAndCtrlFan5V_70C
    #df_12_woC_wHeatSinksAndCtrlFan5V_65C

    # Set x-axis label
    ax1.set_xlabel('Time [s]', fontsize=14)
    # Set y-axis label
    ax1.set_ylabel('CPU core temperature [°C]', fontsize=16)
    ax1.set_ylim(0, 102)
    ax1.grid(True)
    plt.xticks(rotation=50)

    # Twin object for two different y-axis on the same plot
    ax2 = ax1.twinx()
```

```

line3 = ax2.plot(df_to_plot['Time'], df_to_plot['CPU Frequency'],
→color='limegreen', label='CPU Frequency')

# Set y-axis label
ax2.set_ylabel('CPU core frequency [MHz]', fontsize=16)
ax2.set_ylim(500, 1510)
ax2.grid(True)

# Add all lines to the same legend box
lines_all = line1+line2+line3
labels = [l.get_label() for l in lines_all]
ax1.legend(lines_all, labels, loc='lower center')

# Save plot to PNG and PDF
str_image_name = str_image_file_name
#plt.savefig(r'./data_files/' + str_image_name + '.png')
plt.savefig(r'./data_files/' + str_image_name + '.pdf')

plt.show()

```

5.4 Display / Plot data from dataframes

5.4.1 Comparative representation of the temperature curves

This is a comparative representation of the temperature curves over all examined cooling variants for Raspberry Pi B4 and 3B+.

```

[36]: # figsize: a tuple (width, height) in inches
plt.figure(num=0, figsize=(20, 10), dpi=80, facecolor='w', edgecolor='k')
axes = plt.gca()

plt.title('RaspiB4JupyterLab / RaspiB3plusEPaper stress measurements with different_
→cooling types')

plt.plot(df_1_PC_woHeatSinks['Time'], df_1_PC_woHeatSinks['CPU Temperature'], '-',
→label='R4, Plastic Case wo heat sinks or fan, AVG')
plt.plot(df_2_PC_wHeatSinks['Time'], df_2_PC_wHeatSinks['CPU Temperature'], '-',
→label='R4, Plastic Case with heat sinks and wo fan, AVG')
plt.plot(df_13_PC_wHeatSinks_siliconPad['Time'],
→df_13_PC_wHeatSinks_siliconPad['CPU Temperature'], '-', label='R4, Plastic Case_
→with heat sinks with silicon pad and wo fan, AVG')
plt.plot(df_14_PC_wCopperHeatSink_siliconPad['Time'],
→df_14_PC_wCopperHeatSink_siliconPad['CPU Temperature'], '-', label='R4, Plastic_
→Case with copper heat sink with silicon pad and wo fan, AVG')
#plt.plot(df_3_PC_wHeatSinksAndFan5V['Time'], df_3_PC_wHeatSinksAndFan5V['CPU_
→Temperature'], '-', label='R4, Plastic Case with heat sinks and cheap fan (5 V),_
→AVG')
#plt.plot(df_4_PC_wHeatSinksAndFan3V['Time'], df_4_PC_wHeatSinksAndFan3V['CPU_
→Temperature'], '-', label='R4, Plastic Case with heat sinks and cheap fan (3.3_
→V), AVG')
#plt.plot(df_5_PC_wHeatSinksAndFan5Vrev['Time'], df_5_PC_wHeatSinksAndFan5Vrev['CPU_
→Temperature'], '-', label='R4, Plastic Case with heat sinks and cheap fan_
→reverted (5 V), AVG')
plt.plot(df_6_RC_wHeatSinks['Time'], df_6_RC_wHeatSinks['CPU Temperature'], '-',
→label='R4, pink Raspi Case with heat sinks and wo fan, AVG')

```

```

plt.plot(df_7_PC_wHeatSinksAndNoctuaFan5V['Time'],
         df_7_PC_wHeatSinksAndNoctuaFan5V['CPU Temperature'], '-', label='R4, Plastic Case
         ↳with heat sinks and Noctua fan (5 V), AVG')
plt.plot(df_8_PC_wHeatSinksAndNoctuaFan3V['Time'],
         df_8_PC_wHeatSinksAndNoctuaFan3V['CPU Temperature'], '-', label='R4, Plastic Case
         ↳with heat sinks and Noctua fan (3.3 V), AVG')
plt.plot(df_15_PC_wCopperHeatSinkAndNoctuaFan3V['Time'],
         df_15_PC_wCopperHeatSinkAndNoctuaFan3V['CPU Temperature'], '-', label='R4,
         ↳Plastic Case with copper heat sink with silicon pad and Noctua fan (3.3 V), AVG')
plt.plot(df_11_PC_wHeatSinksAndNoctuaFan5Vrev['Time'],
         df_11_PC_wHeatSinksAndNoctuaFan5Vrev['CPU Temperature'], '-', label='R4, Plastic
         ↳Case with heat sinks and Noctua fan reverted (5 V), AVG')

plt.plot(df_10_woC_wHeatSinksAndCtrlFan5V_70C['Time'],
         df_10_woC_wHeatSinksAndCtrlFan5V_70C['CPU Temperature'], '-', label='R4, wo Case
         ↳with one big sink and controlled fan (5 V, 70°C), AVG')
plt.plot(df_12_woC_wHeatSinksAndCtrlFan5V_65C['Time'],
         df_12_woC_wHeatSinksAndCtrlFan5V_65C['CPU Temperature'], '-', label='R4, wo Case
         ↳with one big sink and controlled fan (5 V, 65°C), AVG')

plt.plot(df_9_PC_wHeatSinks['Time'], df_9_PC_wHeatSinks['CPU Temperature'], '-',
         label='R3+, Plastic Case with heat sinks and wo fan, AVG')

plt.plot(df_12_woC_wHeatSinksAndCtrlFan5V_65C['Time'],
         df_12_woC_wHeatSinksAndCtrlFan5V_65C['Ambient Temperature'], '-', label='Ambient
         ↳Temperature')

plt.xlabel('Time [s]')
plt.ylabel('CPU core temperature [°C]')

plt.ylim(0, 100)

plt.grid(True)

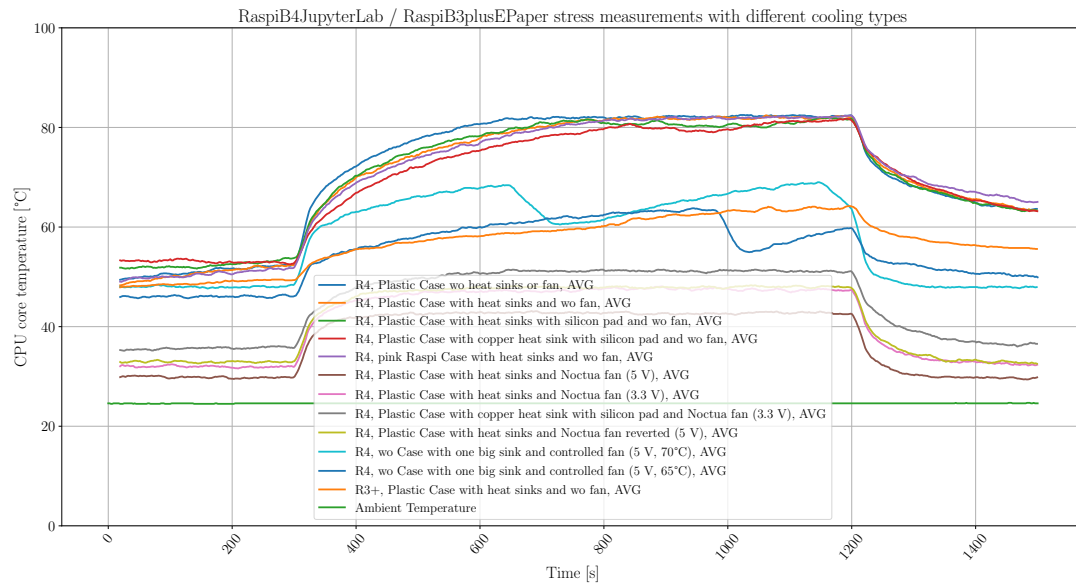
plt.setp(plt.gca().xaxis.get_majorticklabels(), 'rotation', 50)

plt.legend()

# Save plot to PNG and PDF
str_image_name = 'RaspiB4JupyterLab_RaspiB3plusEPaper_stress_measurement'
#plt.savefig(r'./data_files/' + str_image_name + '.png')
plt.savefig(r'./data_files/' + str_image_name + '.pdf')

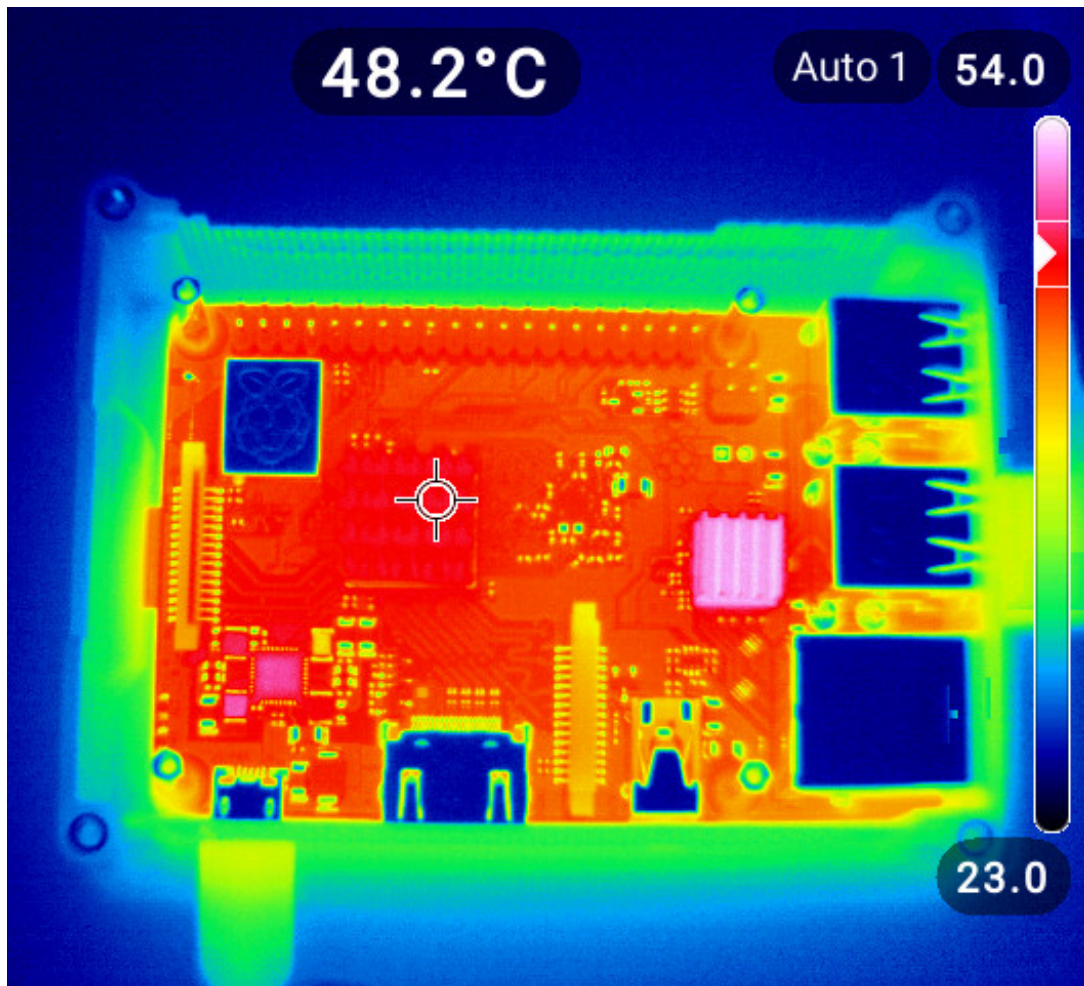
plt.show()

```

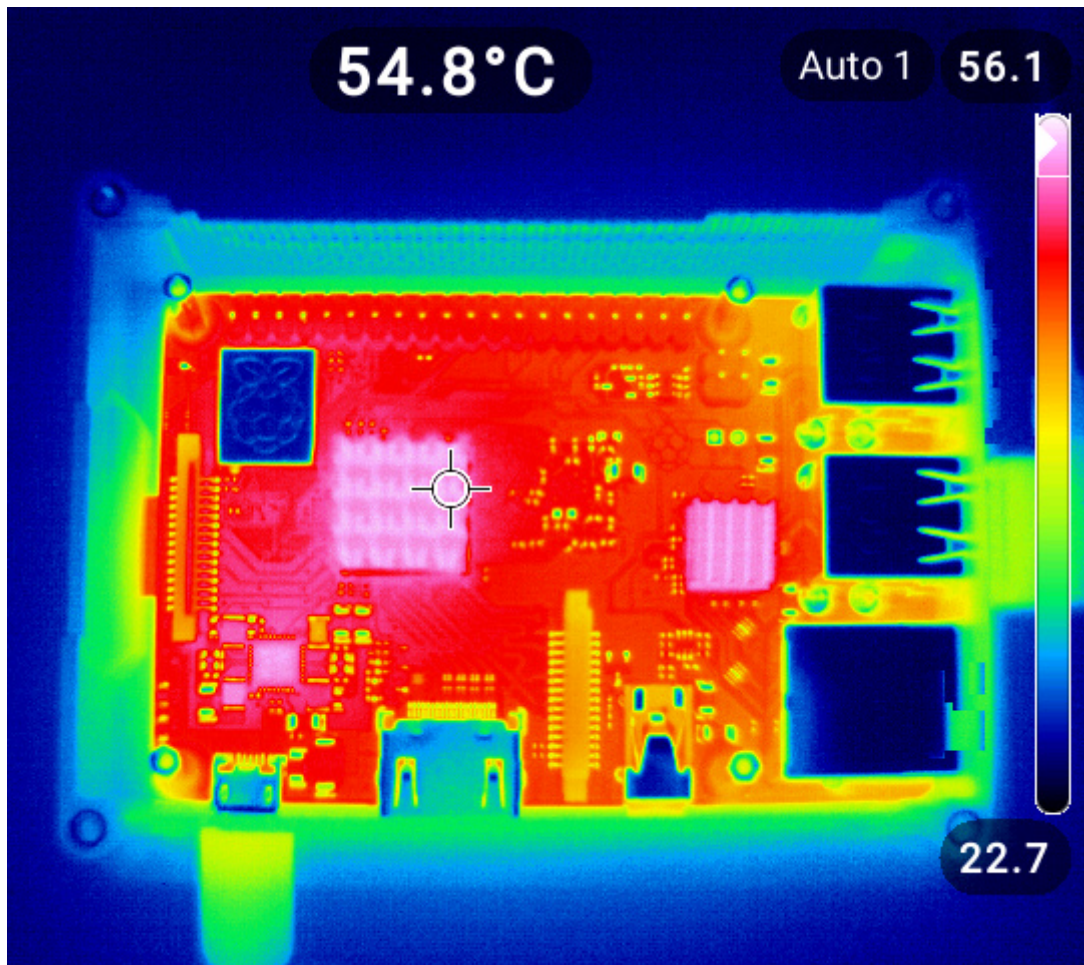



5.4.2 RaspiB3plusEPaper: Temperature curve compared with the curve of the CPU frequency (passive cooling)

The following thermal images show the **Raspberry Pi 3B+** in idle (1) state and under CPU full load (2). The images were taken with the thermal camera *Ti 480 Thermal Imager (Fluke)*:



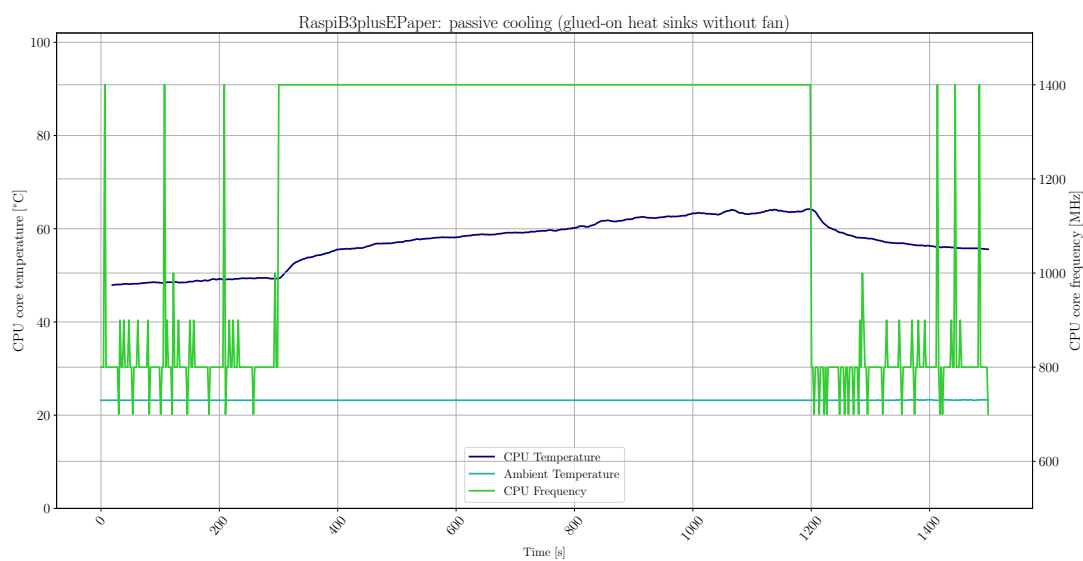
(1) Thermal image of the RPi 3B+ in idle state



(2) Thermal image of the RPi 3B+ under CPU full load

This is the plot of the temperature curve compared with the CPU frequency curve for the Raspberry Pi 3B+ with the cooling variant “glued-on heat sinks without fan”.

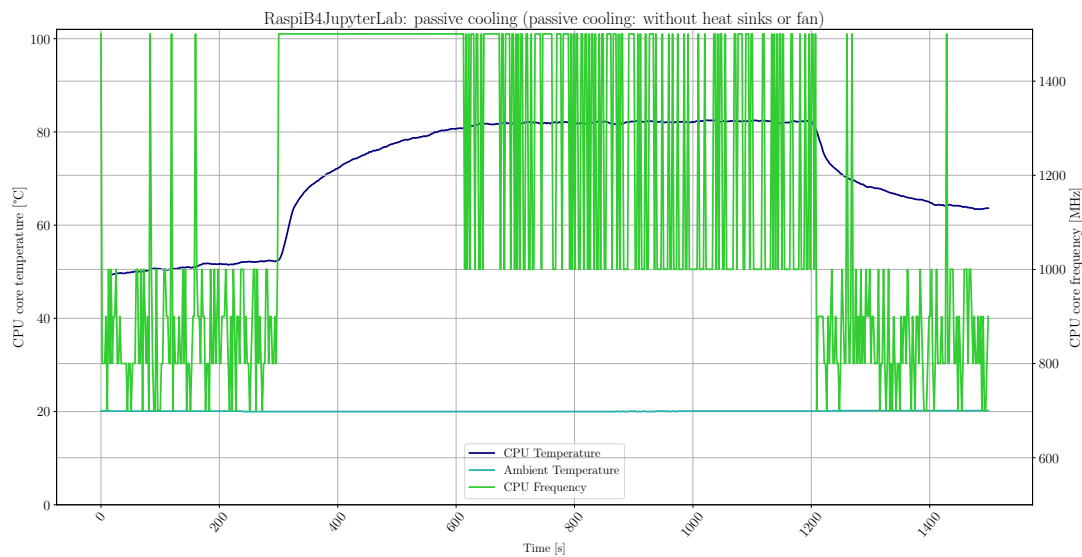
```
[38]: plot_single_measurement(df_9_PC_wHeatSinks,
                             'RaspiB3plusEPaper: passive cooling (glued-on heat sinks_
                             ↳without fan)',
                             'RaspiB3plusEPaper_stress_measurement_PC_wHeatSinks')
```



5.4.3 RaspiB4JupyterLab: Temperature curve compared with the curve of the CPU frequency (passive cooling: without heat sinks or fan)

This is the plot of the temperature curve compared with the CPU frequency curve for the Raspberry Pi B4 with the cooling variant “passive cooling: without heat sinks or fan”.

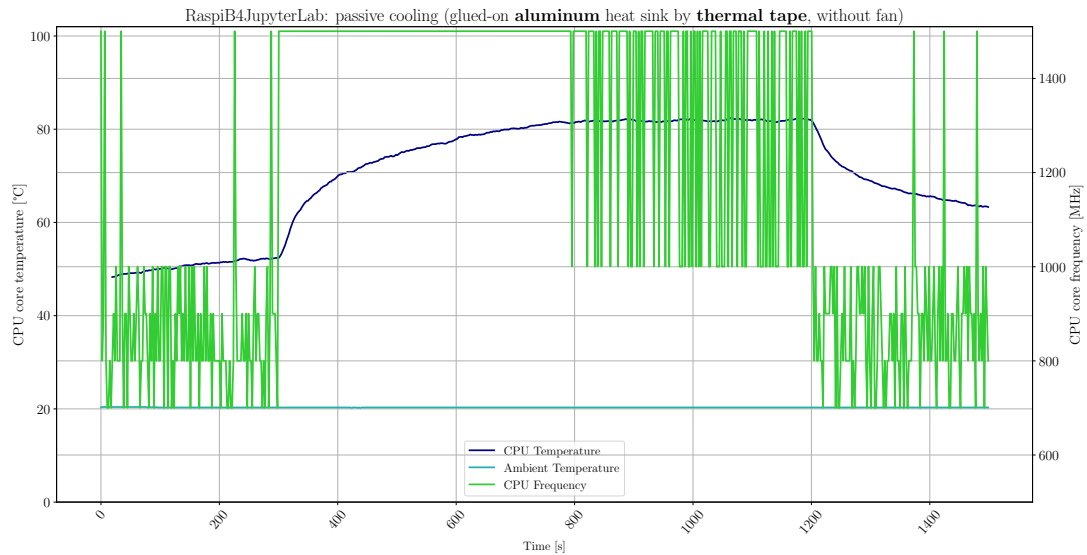
```
[39]: plot_single_measurement(df_1_PC_woHeatSinks,
                             'RaspiB4JupyterLab: passive cooling (passive cooling: ↵
                             ↪without heat sinks or fan)',
                             'RaspiB4JupyterLab_stress_measurement_PC_woHeatSinks')
```



5.4.4 RaspiB4JupyterLab: Temperature curve compared with the curve of the CPU frequency (passive cooling: with heat sinks, but without fan)

This is the plot of the temperature curve compared with the CPU frequency curve for the Raspberry Pi B4 with the cooling variant “glued-on heat sinks without fan”. The thermal coupling between the CPU and the **aluminum** heat sink is made of double-sided **thermal tape**.

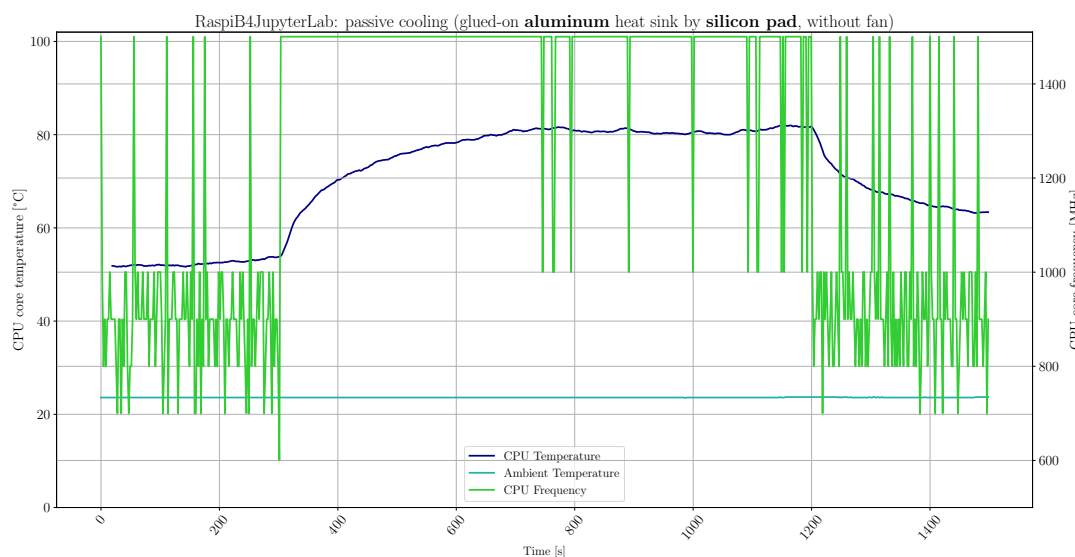
```
[40]: plot_single_measurement(df_2_PC_wHeatSinks,
                             'RaspiB4JupyterLab: passive cooling (glued-on ↵
                             ↪\\textbf{aluminum} heat sink by \\textbf{thermal tape}, without fan)',
                             'RaspiB4JupyterLab_stress_measurement_PC_wHeatSinks')
```



5.4.5 RaspiB4JupyterLab: Temperature curve compared with the curve of the CPU frequency (passive cooling: with heat sinks, but without fan)

This is the plot of the temperature curve compared with the CPU frequency curve for the Raspberry Pi B4 with the cooling variant “glued-on heat sinks without fan”. The thermal coupling between the CPU and the **aluminum** heat sink is made of a **silicon pad**.

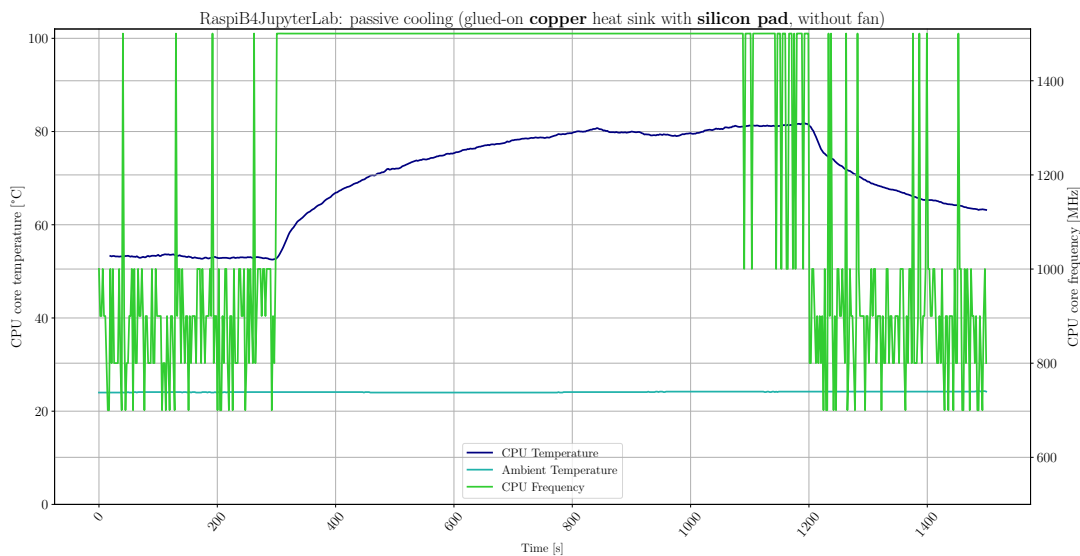
```
[41]: plot_single_measurement(df_13_PC_wHeatSinks_siliconPad,
                             'RaspiB4JupyterLab: passive cooling (glued-on_
                             ↳ \\textbf{aluminum} heat sink by \\textbf{silicon pad}, without fan)',
                             ↳
                             ↳ 'RaspiB4JupyterLab_stress_measurement_PC_wHeatSinks_siliconPad')
```



5.4.6 RaspiB4JupyterLab: Temperature curve compared with the curve of the CPU frequency (passive cooling: with heat sinks, but without fan)

This is the plot of the temperature curve compared with the CPU frequency curve for the Raspberry Pi B4 with the cooling variant “glued-on heat sinks without fan”. The thermal coupling between the CPU and the **copper** heat sink is made of a **silicon pad**.

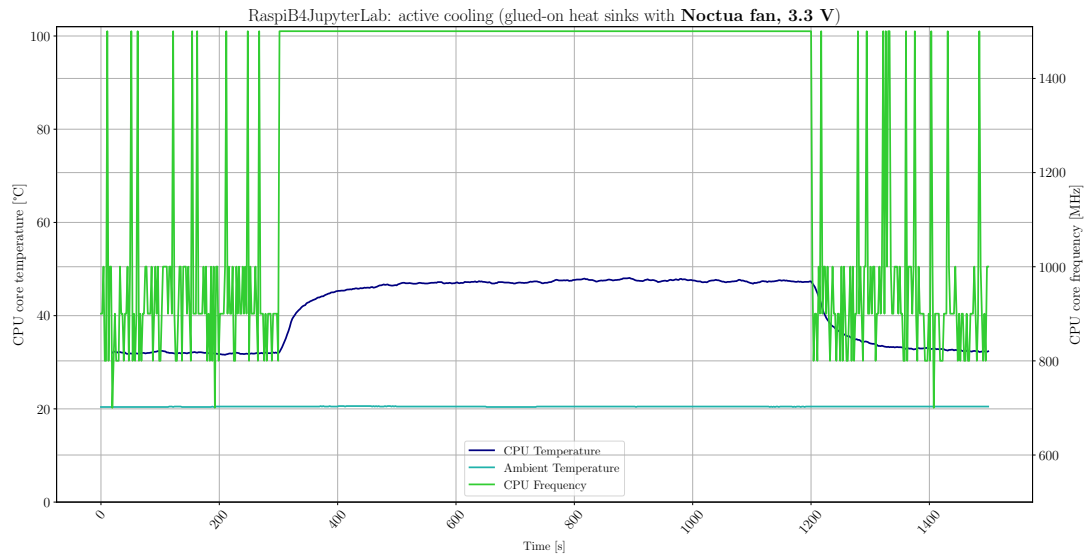
```
[42]: plot_single_measurement(df_14_PC_wCopperHeatSink_siliconPad,
                             'RaspiB4JupyterLab: passive cooling (glued-on_
                             ↳\\textbf{copper} heat sink with \\textbf{silicon pad}, without fan)',
                             'RaspiB4JupyterLab_stress_measurement_PC_wCopperHeatSink')
```



5.4.7 RaspiB4JupyterLab: Temperature curve compared with the curve of the CPU frequency (active cooling)

This is the plot of the temperature curve compared with the CPU frequency curve for the Raspberry Pi B4 with the cooling variant “glued-on heat sinks with **Noctua fan** (driven by **3.3 V**)”. The thermal coupling between the CPU and the **aluminum** heat sink is made of double-sided **thermal tape**.

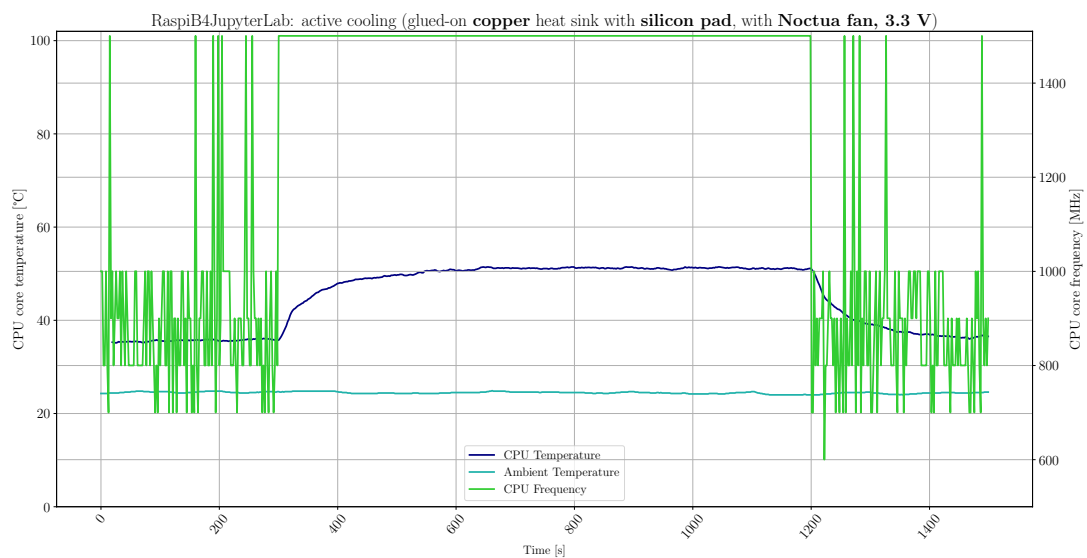
```
[43]: plot_single_measurement(df_8_PC_wHeatSinksAndNoctuaFan3V,
                             'RaspiB4JupyterLab: active cooling (glued-on heat sinks_
                             ↳with \\textbf{Noctua fan, 3.3 V})',
                             'RaspiB4JupyterLab_stress_measurement_PC_wHeatSinksAndNoctuaFan3V')
```

5.4.8 RaspiB4JupyterLab: Temperature curve compared with the curve of the CPU frequency (active cooling)

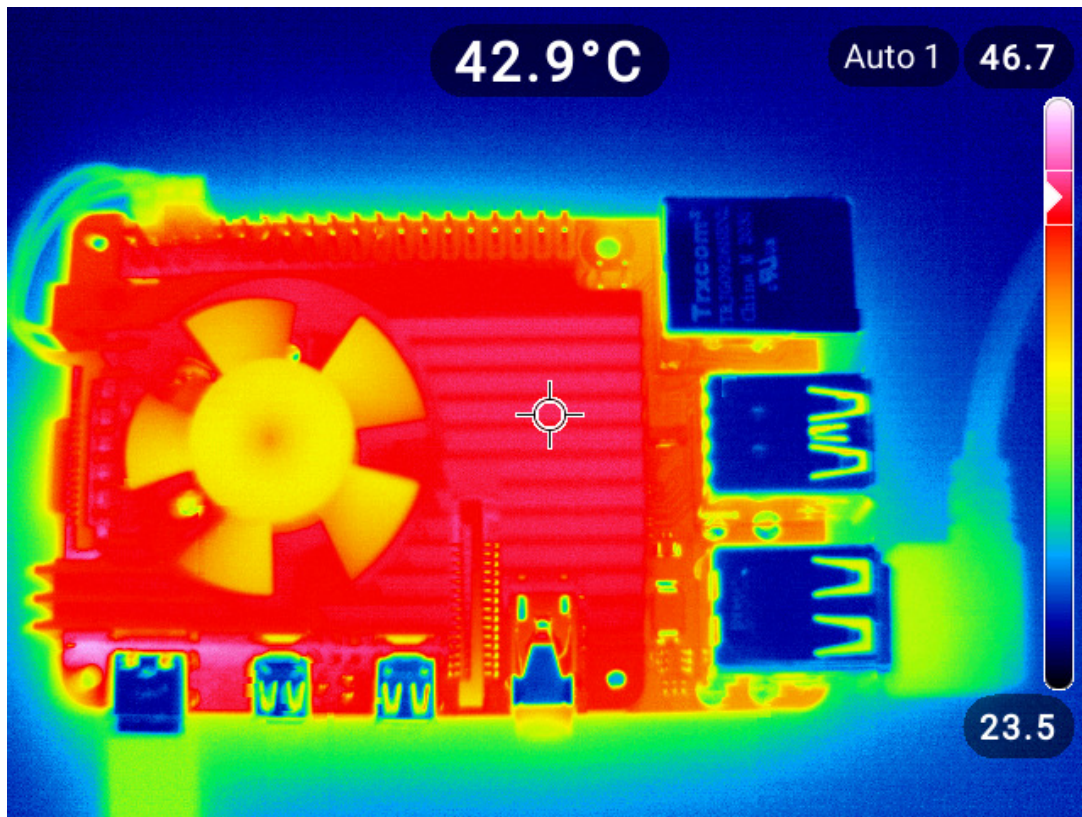
This is the plot of the temperature curve compared with the CPU frequency curve for the Raspberry Pi B4 with the cooling variant “glued-on heat sinks with **Noctua fan** (driven by **3.3 V**)”. The thermal coupling between the CPU and the **copper** heat sink is made of a **silicon pad**.

```
[44]: plot_single_measurement(df_15_PC_wCopperHeatSinkAndNoctuaFan3V,
                             'RaspiB4JupyterLab: active cooling (glued-on
                             ↳\\textbf{copper} heat sink with \\textbf{silicon pad}, with \\textbf{Noctua fan,
                             ↳3.3 V})),
                             ↳
                             ↳('RaspiB4JupyterLab_stress_measurement_PC_wCopperHeatSinkAndNoctuaFan3V'))
```

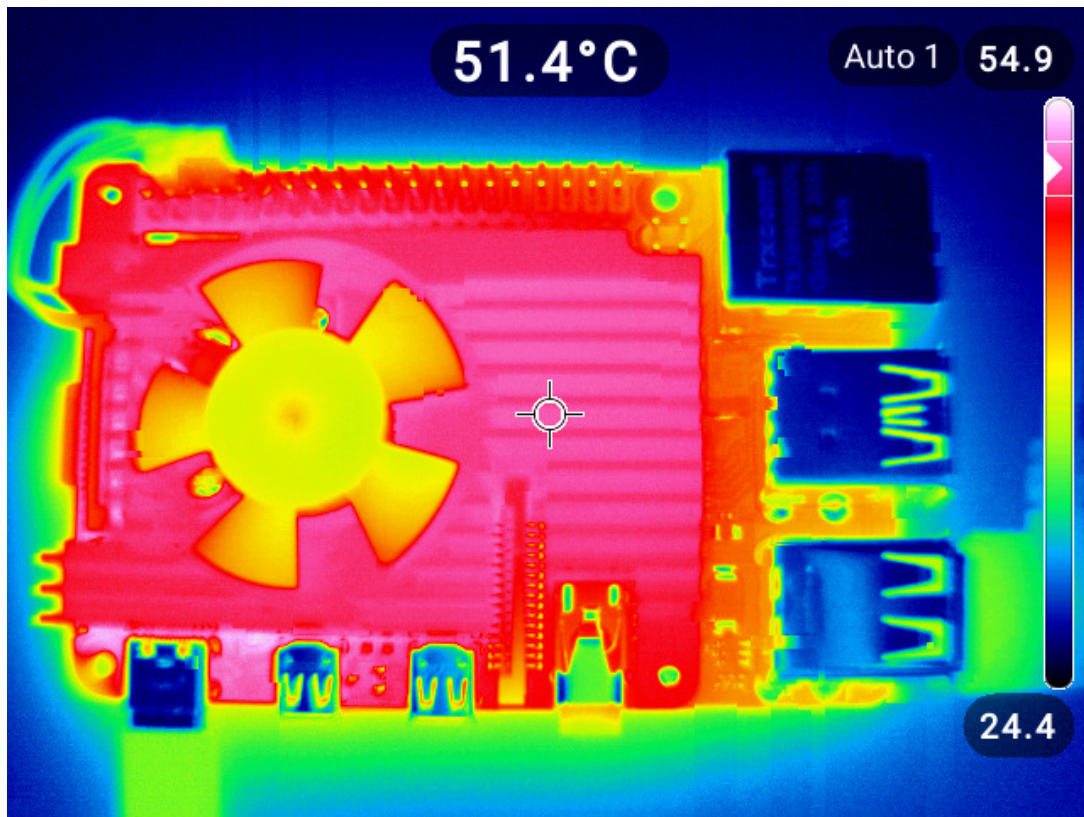


5.4.9 RaspiB4JupyterLab: Temperature curve compared with the curve of the CPU frequency (active cooling by controlled fan)

The following thermal images show the **Raspberry Pi 4B** in idle (1) state and under CPU full load (2). The images were taken with the thermal camera *Ti 480 Thermal Imager (Fluke)*:



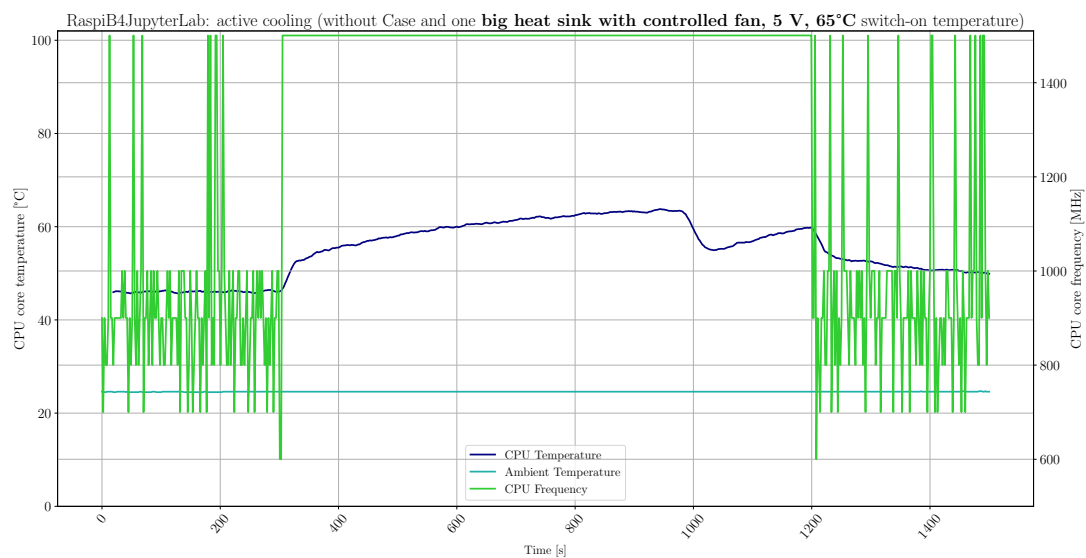
(1) Thermal image of the RPi 4B in idle state



(2) Thermal image of the RPi 4B under CPU full load

This is the plot of the temperature curve compared with the CPU frequency curve for the Raspberry Pi B4 with the cooling variant “wo Case and one big heat sink with controlled fan (driven by 5 V and 65°C switch-on temperature)”. The thermal couplings between the CPU, RAM and USB controller and the big **aluminum** heat sink are made of a **silicon pads**.

```
[45]: plot_single_measurement(df_12_woC_wHeatSinksAndCtrlFan5V_65C,
                             'RaspiB4JupyterLab: active cooling (without Case and one
                             ↳\\textbf{big heat sink with controlled fan, 5 V, 65°C} switch-on temperature)',
                             ↳
                             ↳ 'RaspiB4JupyterLab_stress_measurement_woCase_wHeatSinksAndCtrlFan5V_65C')
```



[]: