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# Conducting TIR UAV surveys: Best practices and recommendations

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# Demonstration overview



# Applications of thermal UAV data informs many decisions on the UAV survey









Coastal and inland waters

#### Surveying / infrastructure

#### Geology and archaeology

#### Search & rescue / wildlife monitoring







Cryosphere

Ecosystem stress / water use

Urban

Solid earth

# Where does UAV data fit in? Example for vegetation



Adapted/inspired by Farella et al (2022)

Temporal scale

# Areminder on thermal sensors and what they measure





# Before the survey: UAV selection / flight planning



**1 Optimal timing for data acquisition** Dependent on chosen sensor types Multispectral / hyperspectral / thermal ...





# Ancillary data

**3 Calibration targets** Proper radiometric calibration is required for applications using imaging spectroscopy data Different sensors have unique requirements Ambient environmental conditions from weather stations, additional measurements for atmospheric correction and quantifying irradiance

**5** Weather data

**4 Ground control points** Strongly recommended even with operating an RTK system

Chakhvashvili et al (2024)

# Choosing the right TIR UAV for your purpose

	WIRIS 2 <sup>nd</sup> Gen	FLIR Tau 2
Spectral band(s)	7.5 – 13 microm	7.5–13 microm
Shutter mechanisms	Global	Global
Camera resolution	640 x 512 pixels	640 x 512 pixels
Capture rate	1fps	lfps
Lens focal length	13mm	19mm
FOV	45 x 37	32 x 26
Automatic corrections	Every 2 - 30 min	6 secs
GSD@5m	0.65	1.19
Sensitivity	50 mK	<50 mK
Total weight	<390g	<72g
Radiometric accuracy	2 deg C	5 deg C
Temperature range	-25 to 150	-20 to 100

Partheepan et al (2023), doi:10.3390/drones7010047

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#### Specific considerations for TIR

- Battery life (due to large overlap needed)
- Sheltering from the wind (protection of sensor temperature)
- Launch method (site consideration)
- NUC automated correction

# Always remember/remind yourself of legal rights for UAV surveys

#### EASA for Europe

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Fees & charges     General Aviation     International cooperation     Recruitment     Certification of products and     organisations     Cybersecurity (General)	<ul> <li>→ Registration requirements</li> <li>→ I fly model aircraft</li> <li>→ Once in the air</li> <li>→ Geographical zones (where I control of the second sec</li></ul>	The following acts and re this Drone and Model Air comprehensive. For the precise wording of These are also available	egulations include some of craft Code is based on. T of the law, please see the in print from <u>The Station</u> e	of the key points of law th he list is not intended to b acts and regulations. ery Office.
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Air Navigation Order with amendments inserted.

The Data Protection Act 2018.

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#### Nice summary:

# The Drone and Model Aircraft Code



https://register-drones.caa.co.uk/drone-code/the\_drone\_code.pdf

# Planning a TIR UAV survey

## Think about your application requirements

- Time of day
- Weather conditions
- Atmospheric effects

# Other factors to consider

- Topography
- Directional effects (flight direction)
- Flight permits / height restrictions



# Considerations and recommendations for TIR UAV flight planning







#### GSD: TIR UAV sensor generally have lower resolution than RGB

Overlap: Minimum 80%, preferable 90-95% overlap



- Function of flight altitude, focal length, FOV, sensor resolution, and pixel size.

- Differs between sensors and flights

- Depends on UAVsoftware
  - Larger then VNIR
- Has implications for battery life
  - Complexity of terrain
  - Sensor type and resolution

- Terrain following - Planned to reduce directionality effects

- Battery life

# Before the survey: Sensor characterisation

# Understanding and characterising your sensor before any survey

# Most UAV cameras are microbolometers

#### Meaning that UAVTIR cameras

Wan et al (2021), DOI: <u>10.3390/s21248466</u> Kelly et al (2019), DOI: <u>10.3390/rs11050567</u>

- Converting IR radiation into temperature and detection sensitivity weaker/lower than cooled sensors
- Miniaturisation causes reduction in accuracy/sensitivity
- Gain and offset of each microbolometer often change with the sensor (FPA) temp
- Radiation within/from sensor may be larger than target, resulting in low SNR



- Are sensitive to ambient conditions, changes and sensor temperature
- Have relatively low accuracy and sensitivity compared to cooled



# Characterising your sensor

Ideal Case: Laboratory blackbody + climate chamber



Wan et al (2021), DOI: 10.3390/s21248466

- $\rightarrow$  Fixed point blackbodies (fixed temperature)
- $\rightarrow$  Variable temperature (ideal)
- $\rightarrow$  Lamp sources (e.g. Tungsten lamp)
- $\rightarrow$  Caveat: costly and not so common. Recommendation: reach out to institutions/organisations that might have them!

#### If no access to laboratory



emperature (°C

Meat cooker

Ice bath

Aragon et al (2020),



Caveat: lab calibration can usually obtain accuracy ( $\pm 0.5$  °C) but in the field, calibration uncertainty can increase to several degrees. Need field calibration too!

# Vignetting and NUC (spatial and temporally)



Ideal: characterise this with a blackbody and correct for it

Realistic: only use centre of the image

Kelly et al (2019)

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**Important for both relative and absolute temperatures!!** If you compare relative temps across an image, objects in the centre will appear warmer than those along the edges

Or follow approach of Lin et al (2021) https://onlinelibrary.wiley.com/doi/full/10.1111/phor.12216

# Correction for sensor temperature + other calibration



Naegeli et al (in prep)



- Sensor temperature altered with wind and cooling
- Centre of images chosen for correction
- Multi-variate polynomial linear regression between blackbody and image temperature



# Ambient temperature changes

Laboratory

- Polynomial regression between BB and UAV temperature reading
- Different ambient temperatures



Aragon et al (2020), DOI: **<u>10.3390/s20113316</u>** 

# Before the survey: Ancillary data

# **2022.6.3 FLIR Tau 2** | Flight time 16:08-16:22



# Temperature Calibration Plates (TCPs)

#### Ideal requirements :

- ✓ Alarge temperature range
- Built-in insulation to avoid temperature fluctuations
- ✓ High emissivity
- Be stable over time
- ✓ Have a uniform surface
- ✓ Be durable
- Related to your about your application, e.g. in vegetation you want warm/dry and cold/wet targets

Wan et al (2024), DOI: <u>10.1016/j.jag.2024.104184</u>

# Common TCPs

# DIYTCPs (most common method)

- InfraGold Diffuse Panel (expensive)



Cold water / ice bath / warm water / lake or water pond or melting snow → well known emissivity and relatively stable temperature



- Something in your scene that has known emissivity and is stable (concrete)

Kelly et al (2019) (a-c) Zmutt Glacier campaign in 2023, UZH

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- $\rightarrow$  Aluminium (cheap) or copper (expensive) plate
- → Known emissivity paint (either stated by manufacturer or measured in the lab)
- $\rightarrow$  Polystyrene
- $\rightarrow$  Wooden board
- → PT100 resistance thermometer + logger (ideally) or another way to measure (radiometer, thermogun)

**Recommendation:** cover different temperatures with different materials, or keep one covered from solar radiation and uncover before acquisition

# Building your own TCP



# Calibration plates protocol

# How many and where?

Minimum 3 (Kelly et al 2019)

**Calibration area next to the flight lines** that you ideally monitor a few times at the beginning, during and end of flight



J.Adams

# How big?

Depends on how high you are flying (GSD, spot size effect) which depends on your sensor (Wan et al 2024)

# 2022.6.3 FLIR Tau 2 | Flight time 16:08-16:22

Wan et al (2024)

# Other measurements?

Ideally measure radiometric temperature using a radiometer as well as skin temperature using thermocouple / resistance measurement



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# Example of TCP calibration in the field



Temperature control points in the field

→ Hot, cold, before, after
→ Sky T

Naegeli et al (in prep)







# Georeferencing Ground control points (GCPs)

- → Should have different enough temperatures from surroundings to distinguish them
- $\rightarrow$  Large enough, depending on flight height
- → Black and white tiles arranged in a checkerboard pattern for RGB
- $\rightarrow$  +accurate measurement of GCPs



Kelly et al (2019)

#### PPK/RTK: most new UAVs have this

#### RTK: Real-time kinematic (RTK)

- $\rightarrow$  GPS information recorded in flight
- $\rightarrow$  Good, but loss of contact with base station can be a problem

https://www.propelleraero.com/blog/how-itworks-ppk-vs-rtk-drone-surveying/



3.12.2024

#### PPK: post-processing kinematic

- → UAV associates X, Y, and Z coordinates with each image based on its onboard GPS unit
- → Abase unit (base station, CORS network) also records positional information with more accurate triangulation.
- → After the flight is over, the two sets of GPS data are matched together using image timestamps
- $\rightarrow$  Adds an additional layer of reliability

# Atmospheric conditions: Air temperature and relative humidity

Ideal: Meteo station



**Or**: Aluminium plate / crinkled aluminimum foil for sky temp



# **Or:** Climate data (e.g. ECMWF reanalysis)



https://climate.copernicus.eu/climate-reanalysis

# Thematic validation



**IR** radiometers



Sub-surface temperature measurements+modelling



Ground surface temperature loggers







Thermocouples



Thermal cameras on the ground

#### Attention! Some of the measurements observe skin temperature, and not radiometric temperature

# On the day of / during the survey

# Assess the weather conditions

- Too much wind, ideally you want less than 2m/s (Kelly et al (2019))
- Depending on the surface (e.g. Urban) this could be increased to 5m/s (Leblanc et al (2021): <u>10.3390/drones5040132</u>)

#### Define a clear criteria beforehand

- maximum wind/gust speed thresholds
- Radiation
- Clouds



Wan et al (2021), DOI: <u>10.3390/s21248466</u>

# Camera stabilisation + avoid overheating

**Camera stabilisation** at least 15 mins Kelly et al (2019)

- $\rightarrow$  Before calibration plots
- → Ideally in the air if possible due to sensor drift (otherwise correct for it afterwards)

Avoid equipment overheating (e.g. tablets for UAVoperation, UAV batteries, spectrometers etc.)
→ Particularly the thermal camera





# Before and during the survey checklist



Keep note of any changes in the weather to help interpretation

# After the survey

# Post processing steps + photogrammetry process



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# Post-processing softwares: Many options, some common ones....

	Agisoft Metashape	Pix4D Mapper	Correlator 3D	OpenDroneMapper
Price	\$\$	\$\$\$	\$\$\$	-
Processing time	Fastest for small datasets	Slowest overall	Fastest overall	Slowest for large datasets
Ease of use	Hardest to automate	Easy templates, many options	Easiest automated templates	Harder to install but easy templates
Georeferencing accuracy	Similar at center of dataset	Similar at centre of dataset	Similar at centre of dataset, better at edges	Similar at centre
Image acquisition recommendations	Highest overlap recommended	Mid range overlap recommended	Lowest overlap recommended	Mid range overlap recommended
Pros	flexibility, nonlinearity, python script support, distributed processing	highly automated computing, user-friendly interface, support of a wide range of cameras	can process a huge amount of data, complete processing automation	user-friendly, quick processing
Cons	no pre-existing scenarios, "advanced" functionality difficult to use	user has limited impact on processing, limited manual edition and terrain generation	not possible to upload images if missing camera parameters, working with GCPs difficult	all images must have EXIF parameters, different versions have max number of images

\*\*\* Also consider: documentation (understanding how these softwares process TIR OMs is not easy), stability, community, cameras support and flexibility, user influence, academic pricing

Source: https://geonadir.com/software-for-drone-mapping/, https://www.50northspatial.org.ua/uav-image-processing-software-photogrammetry/

# Sensor temperature drift correction



Rietze et al (2023), DOI: 10.1088/1748-9326/ad345e

# Drift correction applied to other data





\*\* Performed on images before image processing

Rietze et al (2023), <u>https://github.com/nrietze/ArcticDroughtPaper</u>

Naegeli et al (in prep)

# BUT be careful $\rightarrow$ always consider your study area $\odot$



Naegeli et al (in prep)



# Emissivity characterisation: what options are available?



Surface classification + literature / spectral emissivity library / lab sampling Naegeli et al (in prep)

Use Fcover (vegetation only) + literature / spectral emissivity library / lab sampling Ermida et al (2014) Sun et al (2024) **RT modelling** Can be used to simulate angular emissivity Morrison et al (2020)

Range of emissivities and set up your further processing to account for uncertainty https://blog.beamex.com/calibrationuncertainty-for-dummies-part-1

# Radiometric calibration: From DNs to reflectance (if you have TCPs) Empirical line correction (simple)



Table 2. Linear regression for calibration of TCP temperature against DN ('Calibration') andlinear regression of mean image DN against flight duration (in minutes, 'Mean image DN'), forthe four UAV flights. Number of TCPs used for the calibration regressions are listed in Table1. Sample size (i.e., number of images) used for the 'Mean DN' regressions are n = 538(Flight A), n = 134 (B), n = 53 (C) and n = 80 (D).

Flight	Calibration	R <sup>2</sup> -adj	p-Value	Mean image DN	R <sup>2</sup> -adj	<i>p-</i> Value
А	DN = 20.8(TCP) + 7601	0.99	<0.01	DN = 12.4(mins) + 8157	0.46	<0.001
в	DN = 20.6(TCP) + 8950	0.97	<0.01	DN = 14.6(mins) + 9411	0.74	<0.001
С	DN = 22.7(TCP) + 8861	0.99	<0.01	DN = 43.0(mins) + 9670	0.34	<0.001
D	DN = 15.2(TCP) + 9050	0.99	<0.05	DN = 0.37(mins) + 9416	0	>0.05

#### Kelly et al (2019)

# Radiometric calibration: From DNs to reflectance (if you have TCPs) Empirical line correction (simple)

Most softwares will take your calibration / TCP files, and may also provide options to add camera calibration coefficients (in the metadata), and solar irradiance and angle information

Additional Outputs Index Calculator DSM and Orthomosaic Radiometric Processing and Calibration  $\checkmark$ 1. Initial Processing Altum\_8.0\_2064x1544 (Blue) Correction Type: Camera Only Calibration: Calibrate. Reset 2. Point Cloud and Mesh  $\checkmark$ Altum\_8.0\_2064x1544 (Green) Correction Type: Camera Only Calibration: Calibrate. Reset Altum\_8.0\_2064x1544 (Red) 3. DSM, Orthomosaic and Index  $\checkmark$ Correction Type: Camera Only Calibration: Calibrate. Reset Altum\_8.0\_2064x1544 (NIR) Resources and Notifications Correction Type: Camera Only alibration: Calibrate. Reset Altum\_8.0\_2064x1544 (Red edge) Correction Type: Camera Only Calibration: Calibrate. Rese Altum 1.8 160x120 (LWIR) Correction Type: No Correction Calibration: Reset Resolution Automatic 1 🔹 x GSD (5.29919 cm/pixel) Custom cm/pixel 5.3 Downsampling Method: Gaussian Average Reflectance Map Current Options: No Template Load Template \_ Save Template \_ Manage Templates..

Kelly et al (2019)

# Radiometric calibration: From DNs to reflectance Atmospheric correction (more complex)

Inputs: Air temperature and relative humidity (meteo), emissivity and distance (UAV metadata or DEM)

$$\Phi_{leaf} = \frac{1}{\tau \varepsilon_{leaf}} \left( \Phi_{tot} - \tau \left( 1 - \varepsilon_{leaf} \right) \varepsilon_{sky} \Phi_{sky} - (1 - \tau) \Phi_{air} \right)$$

 $\Phi = \left(\frac{R_1}{R_2} \frac{1}{e^{\frac{B}{T}} - F}\right) - 0$ 

$$c_{H_2O} = RH \cdot e^{\left(1.5587 + 6.939 \times 10^{-2} T_{atmC} - 2.7816 \times 10^{-4} T_{atmC}^2 + 6.8455 \times 10^{-7} T_{atmC}^3\right)}$$
  
$$\tau = X \cdot e^{\left(-\sqrt{d} \cdot \left(\alpha_1 + \beta_1 \sqrt{c_{H_2O}}\right)\right)} + (1 - X) \cdot e^{\left(-\sqrt{d} \cdot \left(\alpha_2 + \beta_2 \sqrt{c_{H_2O}}\right)\right)}$$
(7)

Aubrecht et al (2016), DOI: 10.1016/j.agrformet.2016.07.017

# Thermimage (version 4.1.3) raw2temp: Converts raw thermal data into temperature (oC) Description Converts a raw value obtained from binary thermal image video file into estimated temperature using standard equations used in infrared thermograp Usage

raw2temp(raw, E = 1, 0D = 1, RTemp = 20, ATemp = RTemp, IRWTemp = RTemp, IRT = 1, RH = 50, PR1 = 21106.77, PB = 1501, PF = 1, P0 = -7340, PR2 = 0.012545258, ATA1=0.006569, ATA2=0.01262, ATB1=-0.002276, ATB2=-0.00667, ATX=1.9)

https://www.rdocumentation.org/packages/Thermimage/versions/4.1.3/topics/raw2temp

Or an atmospheric correction algorithm, e.g.



## Orthomosiac generation / post processing OMgeneration was not designed for thermal images 😕

#### Mosaic method

- Orthophotos decomposed into high- and low-frequency components
- Weighted average is calculated separately with different weights and combined into the final OM, where pixels closer to nadir have higher importance
- Sensitive to flight conditions, smooths retrieved temps

#### Averaging method

- The weighted average pixel value from all available overlapping orthophotos is assigned to the corresponding pixel
- Smoothing effect from off-nadir and nadir

#### Disable method

- Each pixel value in the resulting OM is selected from a single orthophoto among all overlapping orthophotos based on the photo having the view closest to nadir
- Strongly sensitive to flight conditions (e.g. striping)



Malbéteau et al (2021), DOI: doi.org/10.3390/rs13163255

# OMgeneration and lack of contrast in TIR images

Apply a filter, or enhance the contrast of the thermal images to improve the OM generation / automatic selection of GCPs



#### Ribeiro-Gomes et al (2017), "Wallis filter"

- $\rightarrow$  For the processes of alignment of the images,
- determination of the dense cloud of points, and creation of the mesh, we used the set of thermal images treated with the Wallis filter.
- →To texture and generate the final orthoimages, these images were replaced by the set of radiometricallycalibrated images.

Ribeiro-Gomes et al (2017), <u>DOI: 10.3390/s17102173</u>

Use RGB images to create the mesh, then overlay thermal images on top (e.g. Kapil et al 2023, DOI: <u>10.3390/rs15102653</u>)



\* Your chosen software may also be able to do this, i.e. in pix4d you can merge thermal and RGB projects

# Performing thematic validation



Ground thermal cameras e.g. Kelly et al (2019)





# Spot size effect (check your processing software how it deals with this)



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Corresponds to the size of the smallest object whose temperature can be accurately assessed, at a set distance.

 $\theta_{\text{MIFOV}} = 3 \times \theta_{\text{IFOV}}.$ 

Outside

Practically measurable spot size is **three times** the true spot size, due to vibration and uncertainty over spatial alignment of the spot and the sensor pixel (Holst 2000)



Inside

Playà-Montmany and Tattersall (2021), DOI: 10.1111/2041-210X13563

# Radiation and adjacency effects

Combine with an RT model to understand radiation effects from km away

- MODTRAN (Duan et al 2020, DOI: <u>10.1016/j.rse.2020.111852</u>)
- FAERTM (Zheng et al 2019, DOI: 10.1109/TGRS.2019.2928525)
- Results indicate it might not be needed when AOD>0.3
- Still needs work in complex terrain (mountains, forest, urban, topography)



What impacts adjacency: Atmospheric visibility, WVC, sensor spectral band, and background pixel LST

What doesn't: Background pixel LSE, pixel spatial resolution, and adjacency range on the adjacency effect is nearly negligible

sensor

Ζ

Scattering

# Directionality: Recommendations to reduce impacts

#### Tu et al (2020)

- 1. Flying along the hedgerow improved data quality
- 2. Smaller image pitch angle improved data quality
- 3. Higher solar elevation improved data quality in general

Other recommendations suggest to fly perpendicular to sun direction to avoid hotspot / glint and largest shadowing

Treier et al (2024)

#### **Before the flight:**

#### Flight planning:

- Fly with the long side of the field of view perpendicular to sowing direction. This maximises the plots that are recorded entirely in non-nadir orientation and thereby reduces the influence of background (soil).
- Thermal drift will likely be the most important source of variance. Fly over strong gradients (e.g. treatments but also genotypes) at multiple and distinct points in time and optimise genotype distribution in the experimental design to avoid confounding of thermal drift and treatment/genotype effects in mixed models at later stages.



# Directionality: Correction options

- 1. Empirical BTDF correction, adjusting weights for surface
- 2. Physically-based RT modelling correction
- 3. Multi-view acquisitions (e.g. Treier et al 2024, DOI: 10.1016/j.isprsjprs.2024.09.015)
- 4. Swath based corrections (e.g. Malbéteau et al 2021)

#### Malbéteau et al (2021)





Treier et al (2024)

# Topography and complex scenes

Large variance of slope and aspect / directionality

Radiation exposure, terrain roughness

Small surface contrast or extremely heterogeneous

May need further contrast enhancing

Mosiacing technique choice can have a large impact

Off-nadir/nadir differences large due to topography and flight direction Harsh environmental conditions

Stronger and colder winds, larger delta-Tbetween sensor and target

Large gradient in atmospheric conditions

Exacerbates sensor temp drift and complicates atmo correction

Difficult to access

Placing TCP/GCPs in the field not always possible, size of TCP to carry



# Asummary of cascading recommendations

# Summary of recommendations: Kelly et al (2019)

#### **Before flight:**



- At least 15 mins stabilization time [2,9] Enable frequent NUC [3]
- Minimum 3 ground calibration points Mount camera so it is sheltered from wind
- Ground calibration points with wide temperature range that spans the target object temperatures

# **During flight:**

- Fly slowly to avoid blurry images and wind effects
- Extra flight lines at start of flight, at least 15 mins
- Repeated passes over ground calibration points [3]

# After flight:

• Correct for vignetting or use only centre of images [19,31]



Correct for temperature drift [17]

# Summary of recommendations: Aragon et al (2020)



# +more cascading recommendations



# Great references / open source tools for all these corrections

Raw2temp for FLIR: <u>https://www.rdocumentation.org/packages/Thermimage/versions/4.1.3/topics/raw2temp</u> Drift correction: <u>https://github.com/nrietze/ArcticDroughtPaper/tree/main/code/thermal\_drift\_correction</u> ThermoSwitcher (extracting radiometric TIFF from DJI JPEG): <u>https://www.mdpi.com/1424-8220/24/19/6267</u> OpenDroneMapper

Georeferencing/mosiacing in python: <u>https://github.com/SeadroneICMAN/MosaicSeadron</u>

Kelly et al (2019): https://www.mdpi.com/2072-4292/11/5/567# Maes et al (2017): https://www.mdpi.com/2072-4292/9/5/476 Aubrecht et al (2016): https://www.sciencedirect.com/science/article/pii/S0168192316303434 Chakhvashvili et al (2024): https://link.springer.com/article/10.1007/s11119-024-10168-3 Wan et al (2024): https://www.sciencedirect.com/science/article/pii/S1569843224005405?via%3Dihub#b8 Lin et al (2021): https://onlinelibrary.wiley.com/doi/full/10.1111/phor.12216 Tu et al (2020): https://www.sciencedirect.com/science/article/pii/S0924271619302941#f0020 Wan et al (2021): https://www.mdpi.com/1424-8220/21/24/8466#B44-sensors-21-08466 Aragon et al (2020): https://www.mdpi.com/1424-8220/20/11/3316#B67-sensors-20-03316 Duan et al (2020): https://www.sciencedirect.com/science/article/pii/S0034425720302224#f0025



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