

"Astro-Ecology": combining drones & astrophysics to help tackle biodiversity loss and climate change



How we are learning to turn our telescopes upside-down

Steve Longmore & Serge Wich

Owen McAree, Paul Fergus & Carl Chalmers; Simon Maskell & Yifan Zhou; Andy Symons
Maisie Rashman (Iain Steele), Simon Fox, James Crampton, Blessed Chianumba, Simon Pfeiffer, Ron Collins
Claire Burke, Maria de Juan Ovelar, Marco Lam, Ross McWhirter, Josh Veitch-Michaelis, Temi Sam-Odusina

Steve Longmore

Astro-ecology: astrophysics meets conservation biology



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Astro

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Ecology

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Staff @LJMU

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PhD **Masters**

Steve Longmore & Serge Wich

Summer students

Owen McAree, Paul Fergus & Carl Chalmers; Simon Maskell & Yifan Zhou; Andy Symons

Maisie Rashman (Iain Steele), Simon Fox, James Crampton, Blessed Chianumba, Simon Pfeiffer, Ron Collins

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How we are learning to turn our telescopes upside-down

Postdoctoral researchers

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1. Challenges we are trying to address
2. Background/timeline of the project
3. Long-term goals
4. Progress towards long-term goals
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Problem #1 → Biodiversity loss





2000



2018



2009



2012



2008



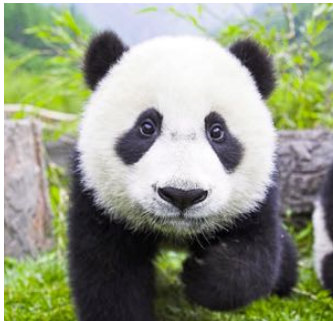
2008



2011

By the end of today 5 species will have become extinct

Half as many wild animals in the world today as 30 years ago



By the end of today 5 species will have become

Half as numerous as they were today as

all my friends are dead :(





Challenge #2 → Reduce CO₂ emission



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Traditional methods of counting animals/fires too inefficient



Problem: Fire/ecology management relies on good data. Data costly to get, hence mostly unavailable at the spatial and temporal resolutions that are required for conservation management.

Goal: Improve the efficiency of animal distribution and density data collection.

Use drones to survey large areas quickly

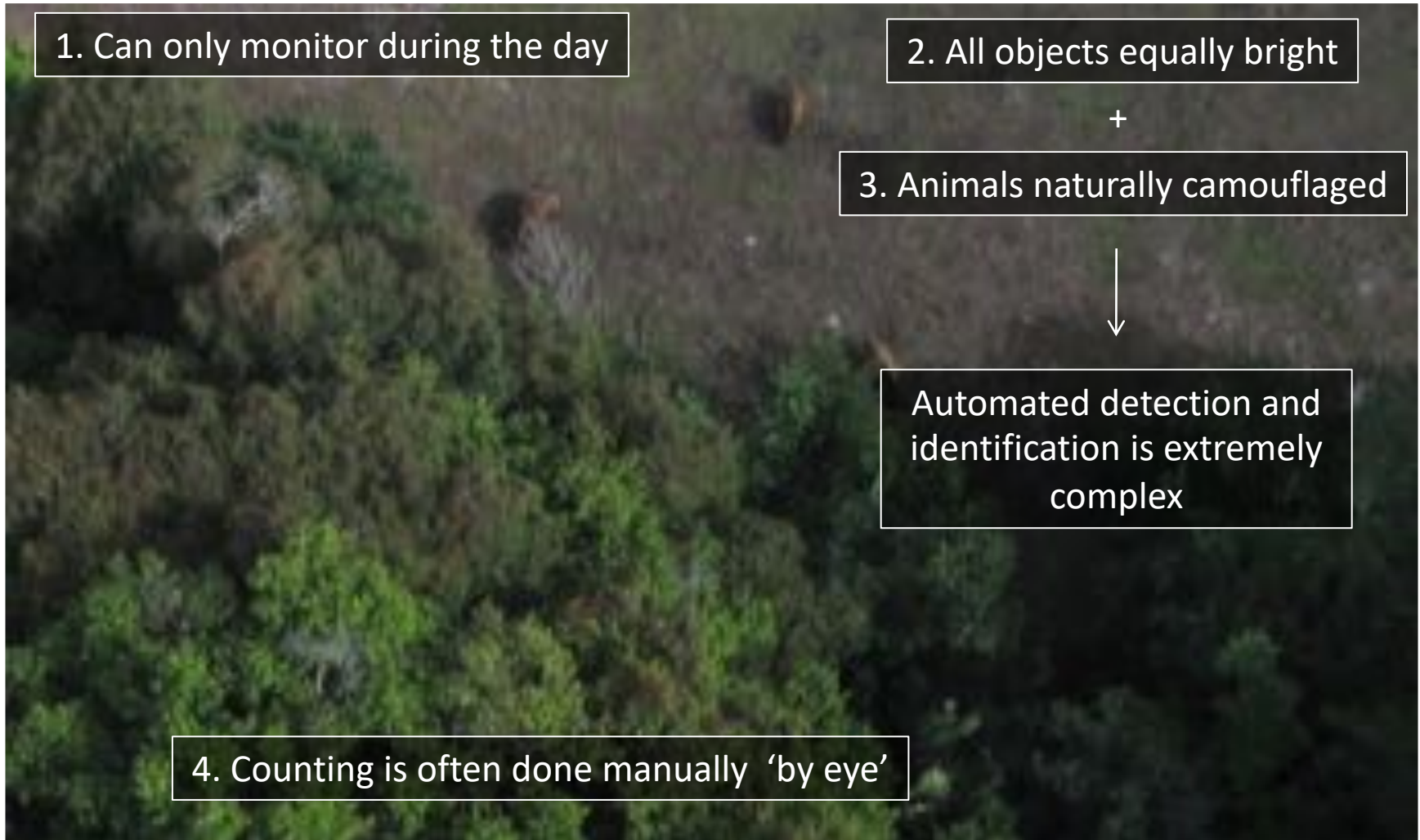
Explosion in use of drones for conservation* purposes



Easy to survey large areas quickly and efficiently

*and as a way to give your dog a different perspective on the world

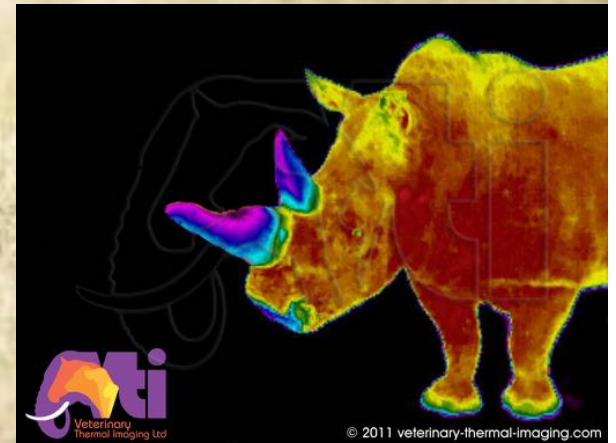
Challenge to current efforts



Seeing in the dark...



At thermal-infrared wavelengths animals stand out against the background

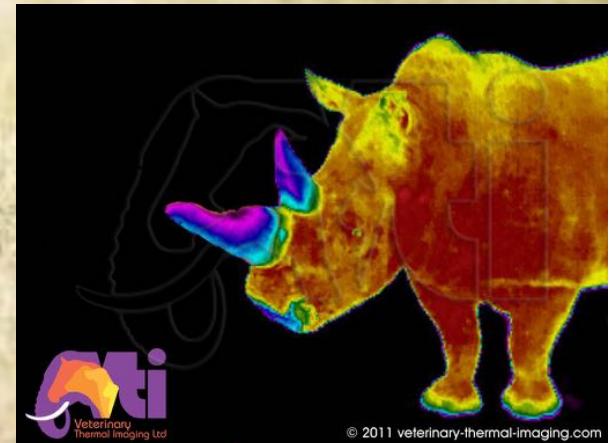


Seeing in the dark...

Thermal cameras are now cheap enough and light enough to use routinely on drones

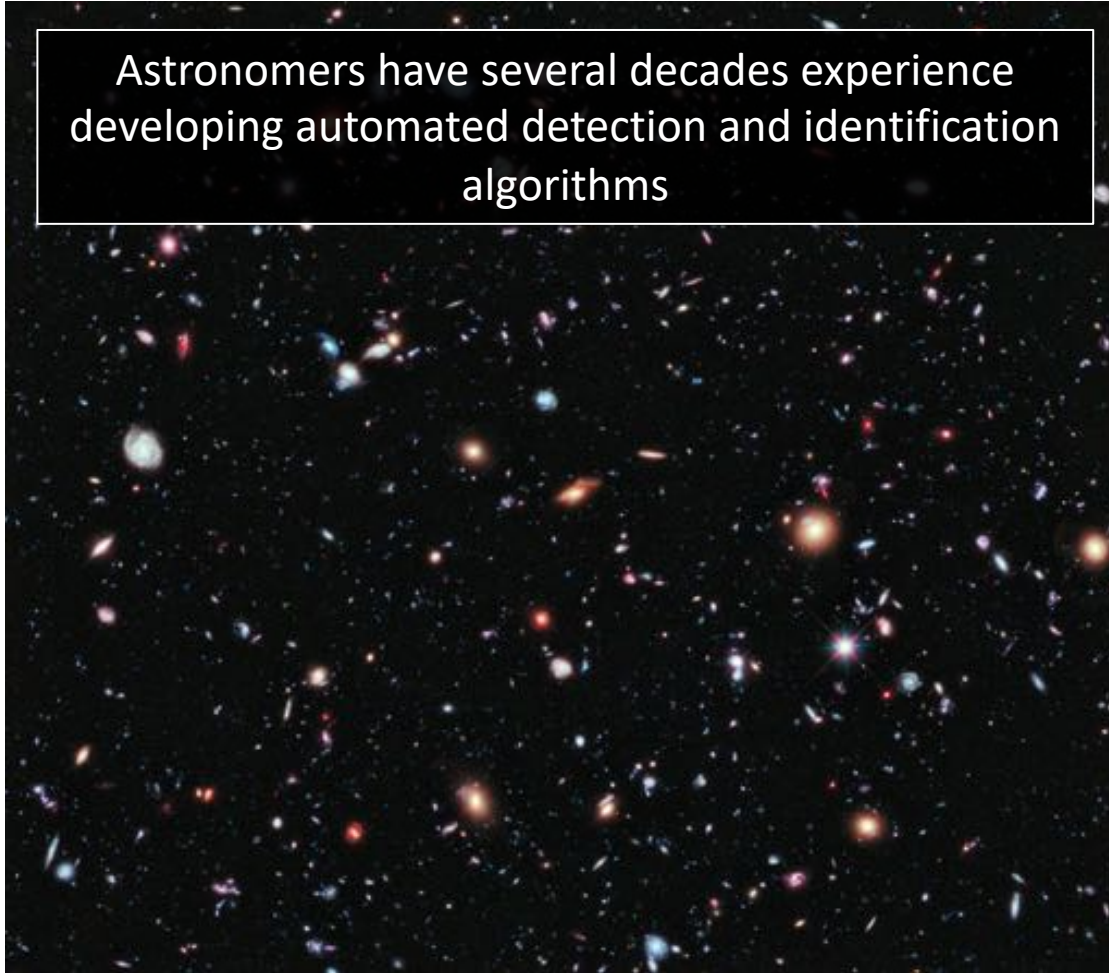


At thermal-infrared wavelengths animals stand out against the background



Thermal “fingerprints” of stars, galaxies and ... animals ...

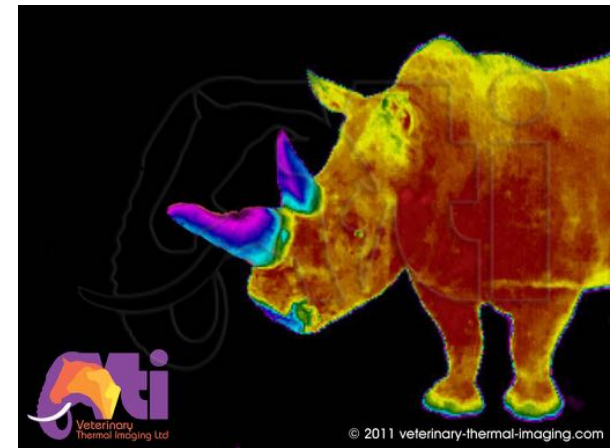
Astronomers have several decades experience
developing automated detection and identification
algorithms



Thermal “fingerprints” of stars, galaxies and ... animals ...

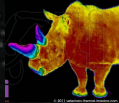
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Can we apply these techniques to help
conservation?

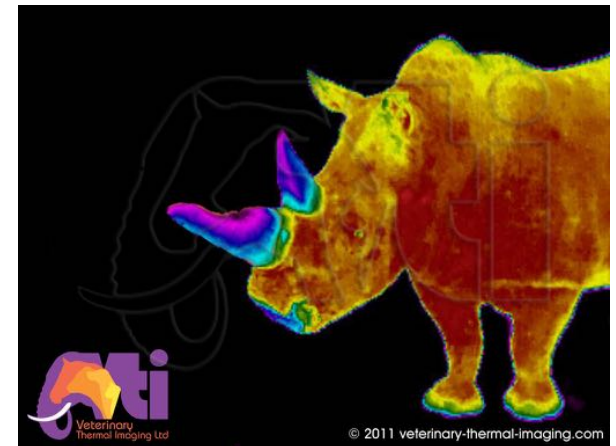


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How to use this to try and help conservation efforts?



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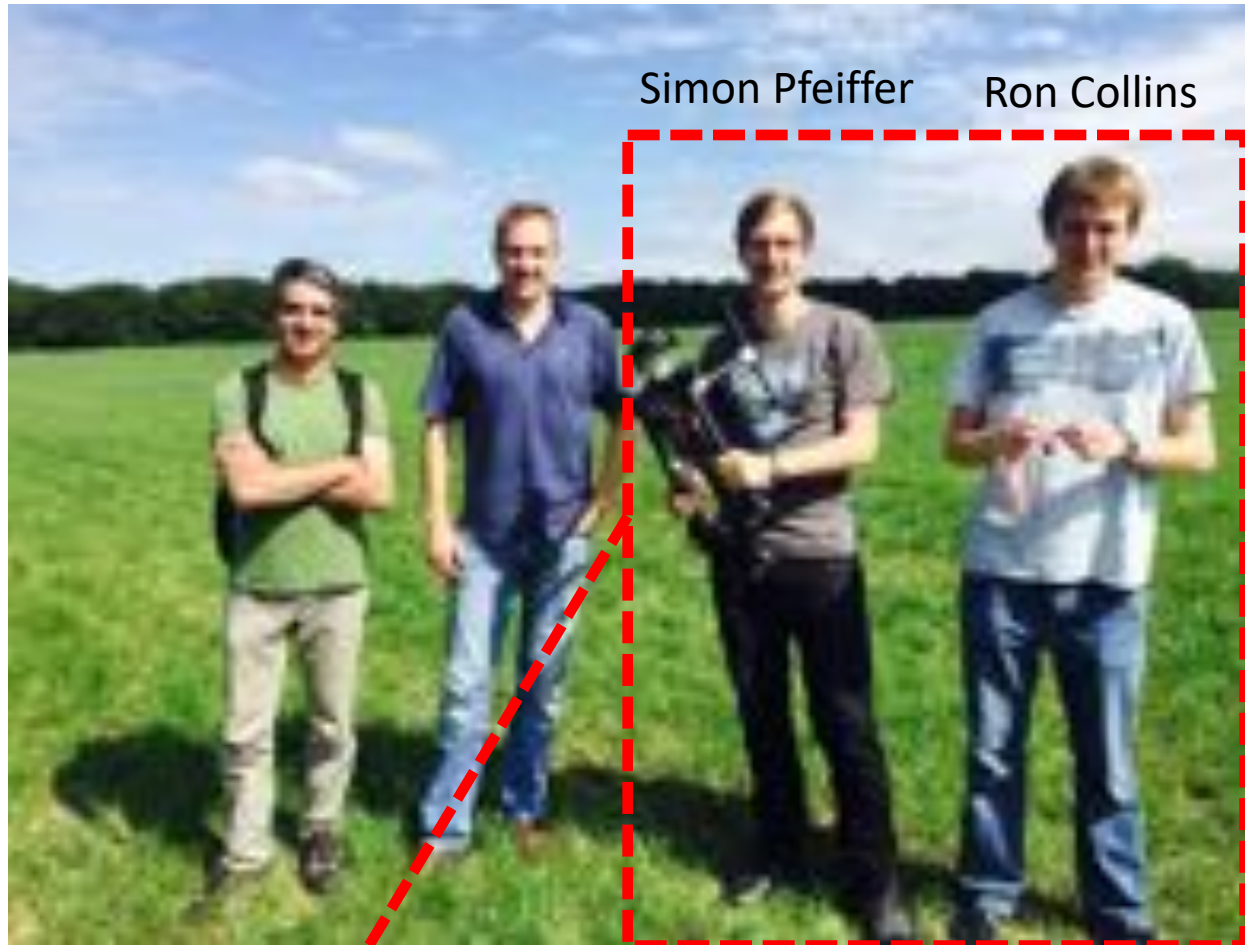


How to use this to try and help conservation efforts?



2014 2015 2016 2017 2018 2019

How to use this to try and help conservation efforts?





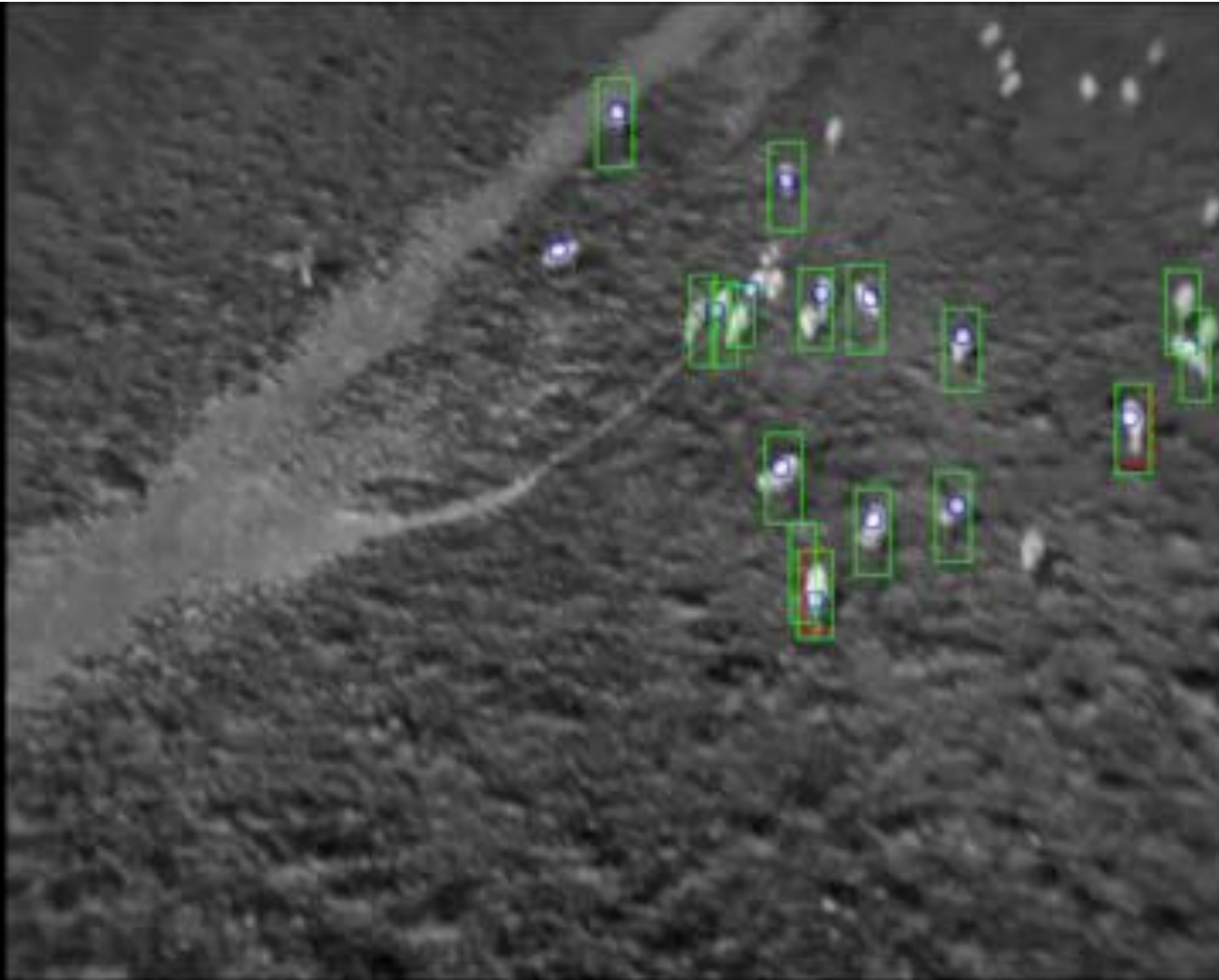


Astronomy
detection
algorithms

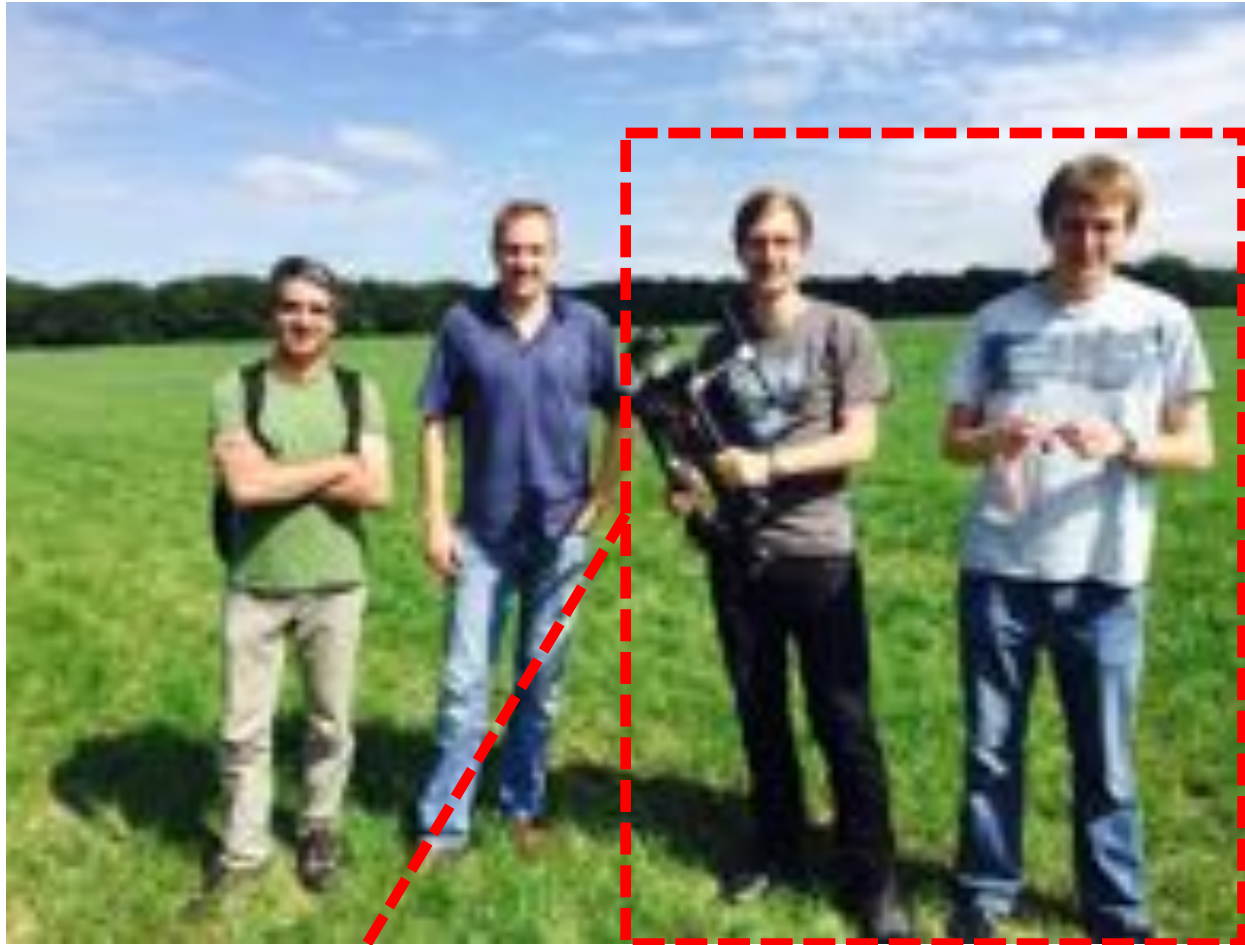
+

Machine
learning

Lift off!



How to use this to try and help conservation efforts?



2014 2015 2016 2017 2018 2019

Building an astro-ecology group



Research Spotlight Award (£25k)



2014

2015

2016

2017

2018

2019



Maria de Juan Ovelar

Research Spotlight Award (£25k)



Hire part-time
postdoctoral
researcher for 11
months

Buy integrated
thermal + optical
camera



Building an astro-ecology group





Maisie Rashman

LJMU-funded
PhD student



Building an astro-ecology group



Claire Burke

PDRA funded
through STFC
21st Challenges
Grant



Steve Longmore

Does this work on endangered animals?



Does this work on endangered animals?



Does this work on endangered animals?



Building library of animal thermal fingerprints

2014 2015 2016 2017 2018 2019

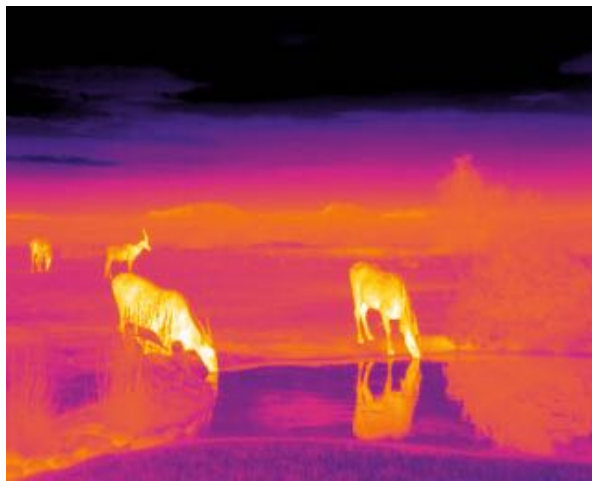
Building library of animal thermal fingerprints



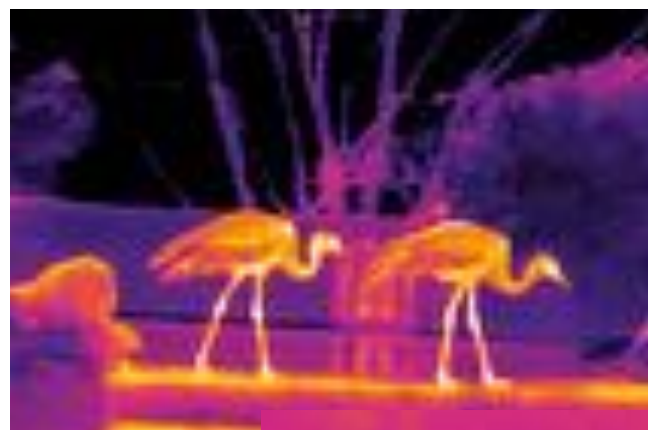
Human



Eland



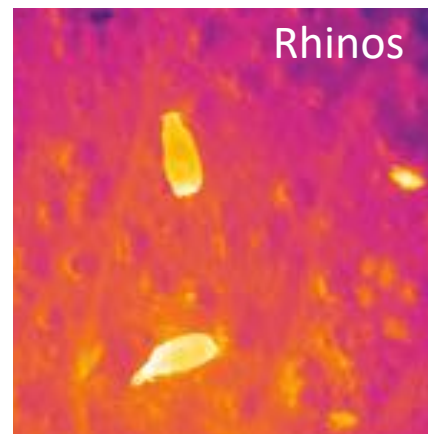
Rhinos



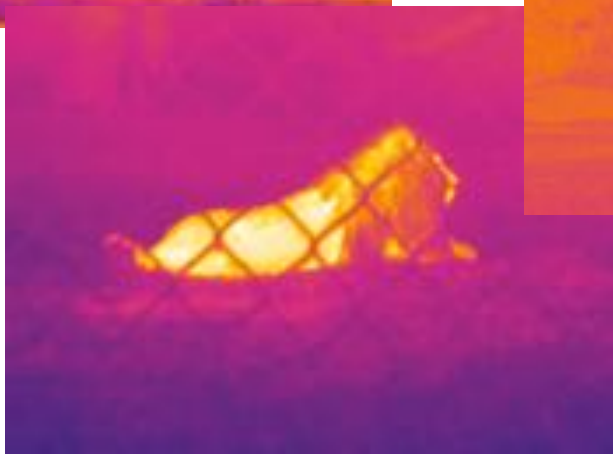
Blue crane



Giraffe



Rhinos



Lion



Elephants

Pilot paper published in 2017.

Longmore et al., 2017, International Journal of Remote Sensing,



Associated press release → international media attention



Building library of animal thermal fingerprints



Does this work on endangered animals?

Yes! Well, at least in captivity... what about in the wild?



Building library of animal thermal fingerprints



Does this work on endangered animals?

Yes! Well, at least in captivity... what about in the wild?



2014

2015

2016

2017

2018

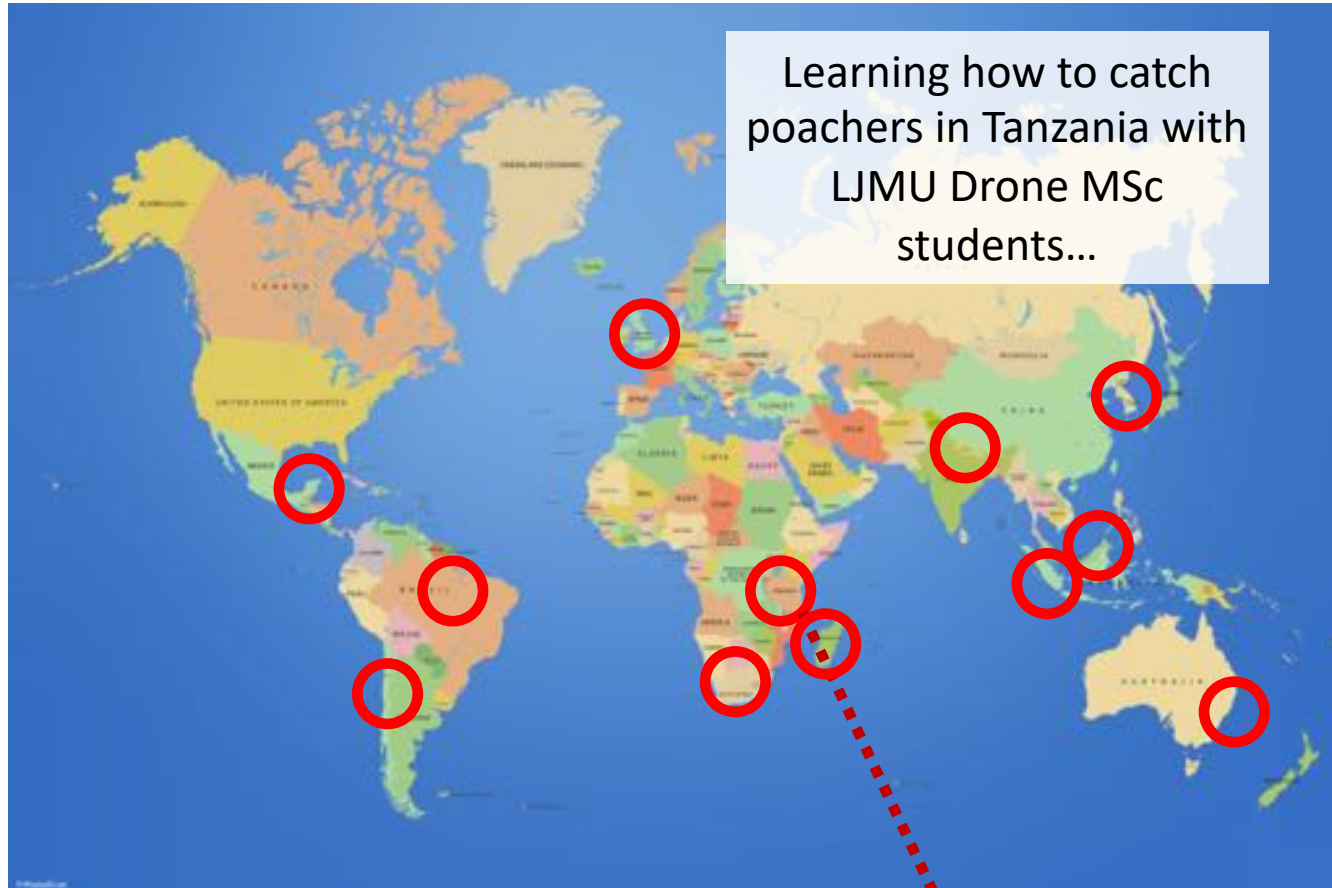
2019

How to use this to try and help conservation efforts?

Contacted by conservation agencies around the world



First steps: hunting the hunters



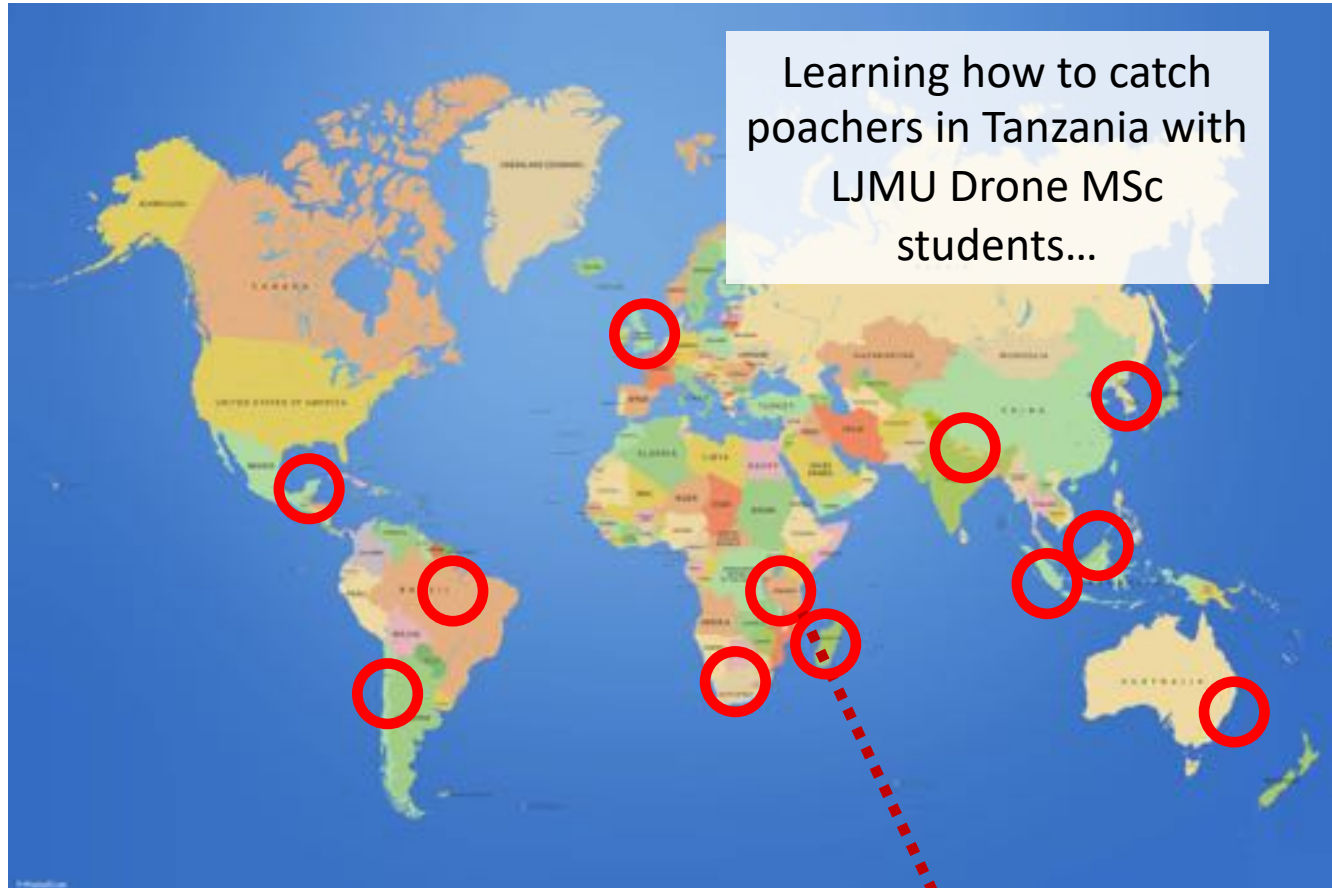
First steps: hunting the hunters



First steps: hunting the hunters

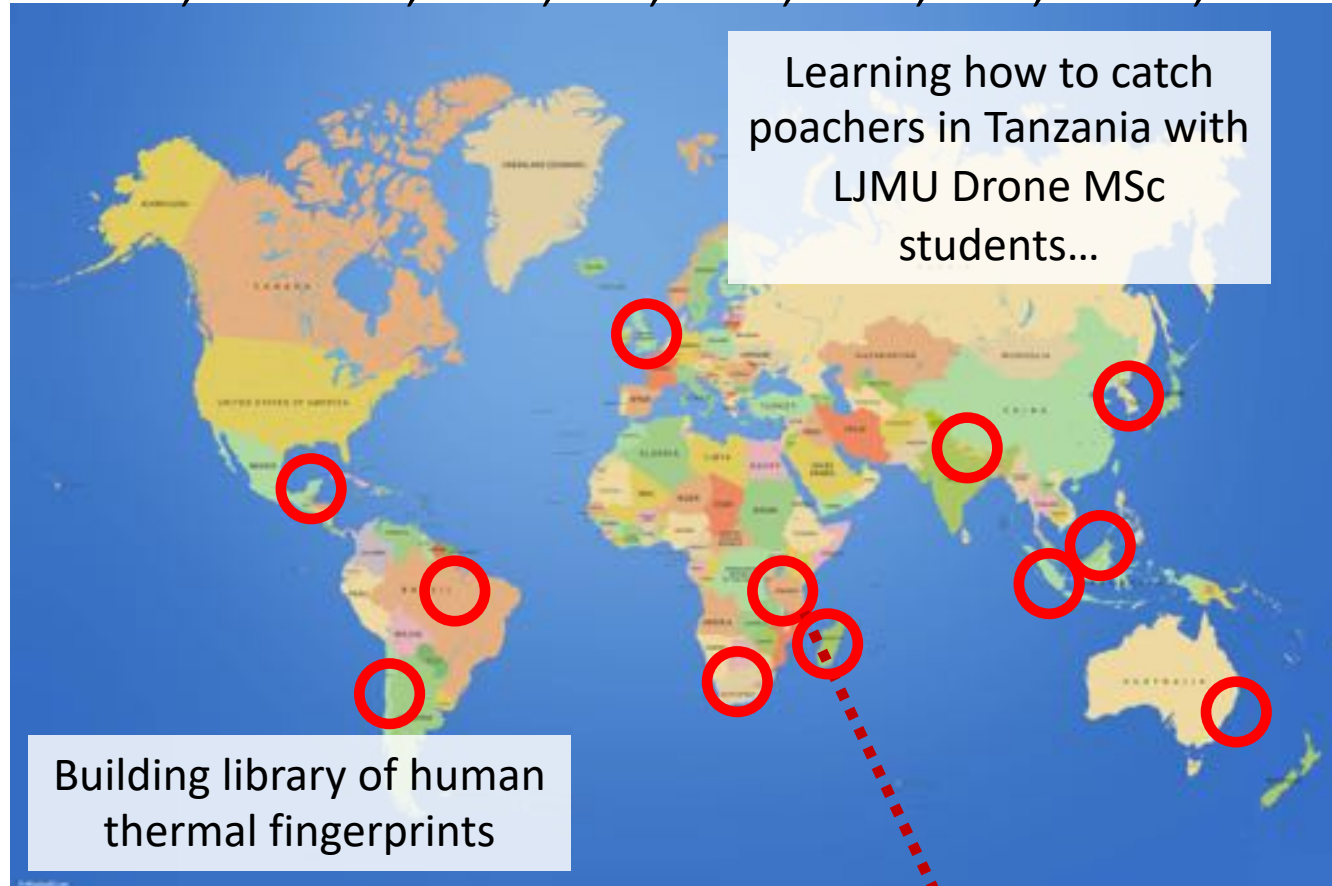


First steps: hunting the hunters



First steps: hunting the hunters

Bourke, Rashman, Wich, SNL, et al., 2018, SPIE, 10709, 2.



Ross
McWhirter



Josh
Veitch-Michaelis

STFC GCRF funding to hire 2 PDRAs to begin systematically tackling problem world wide



Next steps: helping conservation efforts



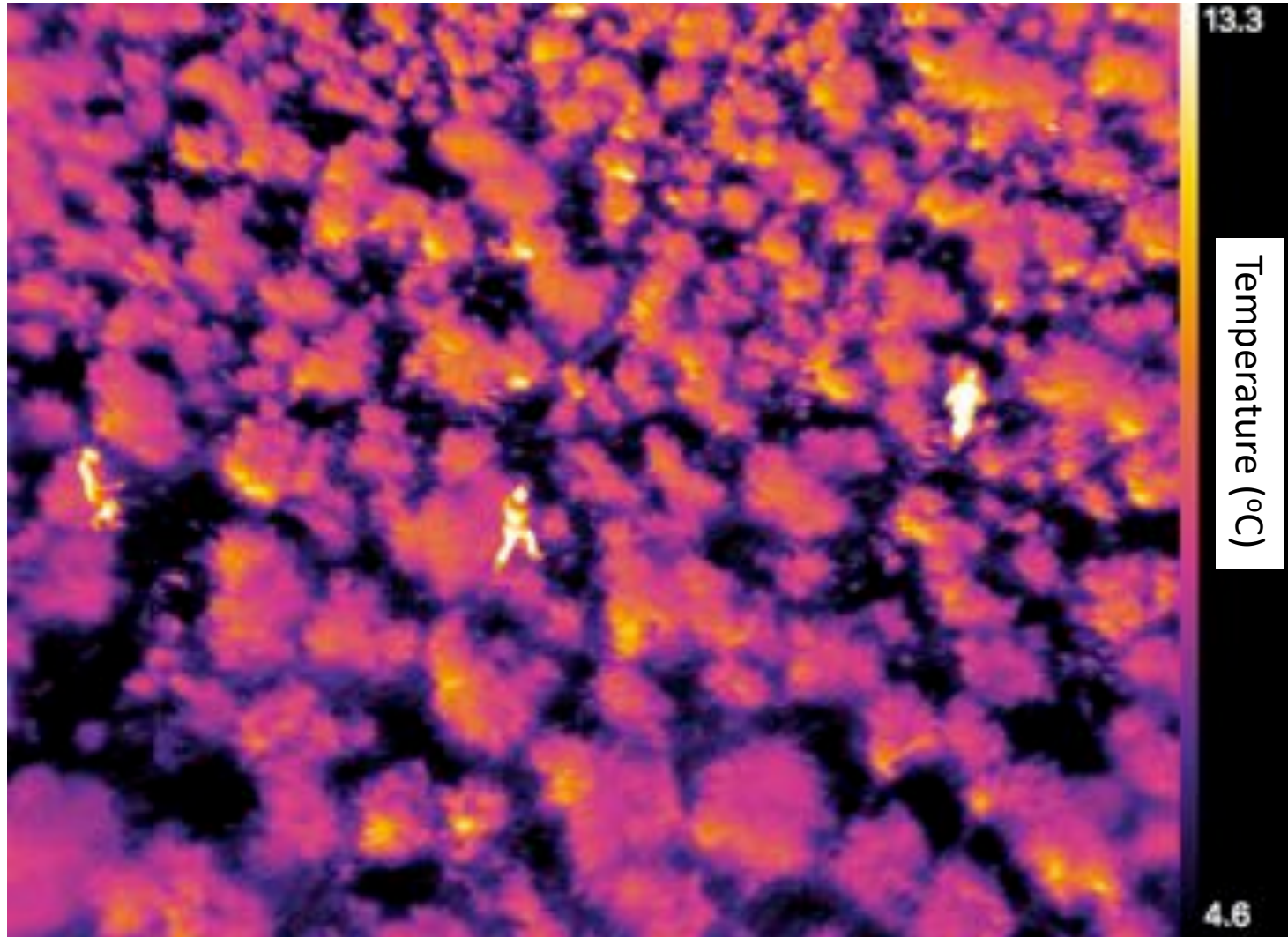
Next steps: helping conservation efforts



2014 2015 2016 2017 2018 2019



We're hunting rabbits...



Next steps: helping conservation efforts



2014 2015 2016 2017 2018 2019



2014

2015

2016

2017

2018

2019

The
New York
Times

BBC

theguardian

Discovery
CHANNEL



2014

2015

2016

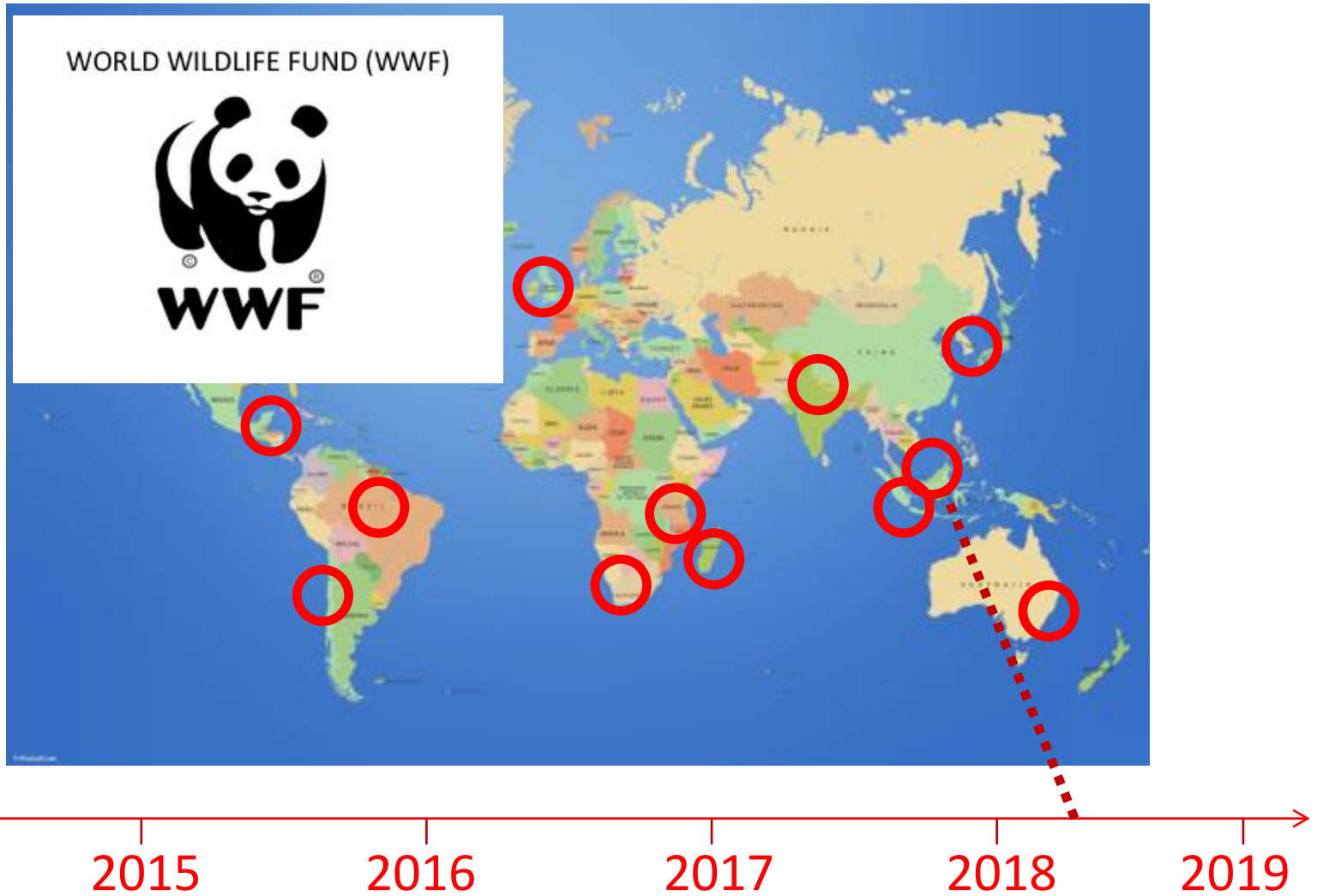
2017

2018

2019



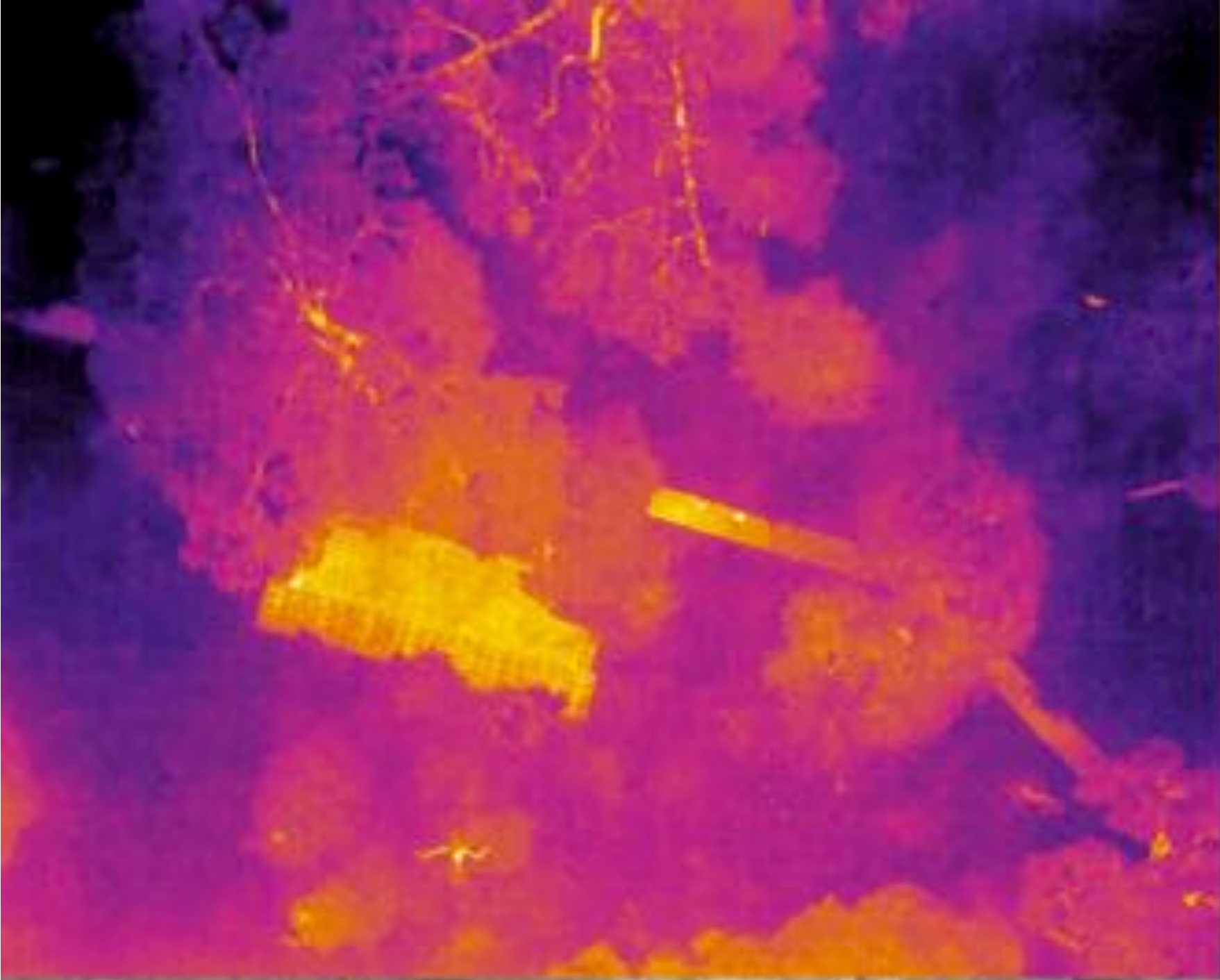
2014 2015 2016 2017 2018 2019



WORLD WILDLIFE FUND (WWF)







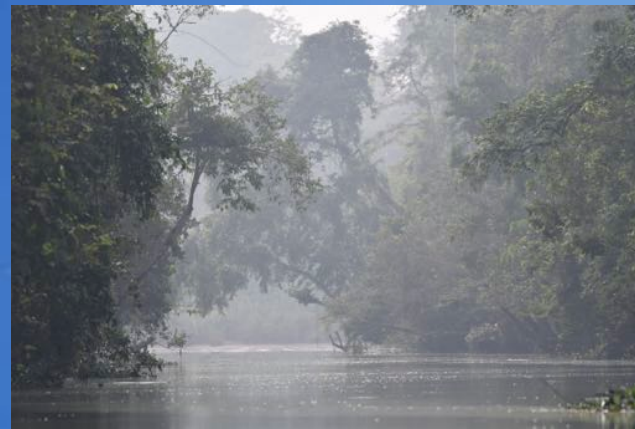
27.5

22.0

WORLD WILDLIFE FUND (WWF)



WORLD WILDLIFE FUND (WWF)



BBC 2
nature
program in
spring
2019

2014

2015

2016

2017

2018

2019

two Equator from the Air

Home

Episodes

Clips



In a defining moment for the natural world, Gordon Buchanan makes an epic journey round the equator - taking to the skies with experts racing to protect both wildlife and people.

WORLD WILDLIFE FUND (WWF)



BBC 2
nature
program in
spring
2019

2014

Steve



2014 2015 2016 2017 2018 2019



Temitope Sam-Odusina

2014

2015

2016

2017

2018

2019









Surya































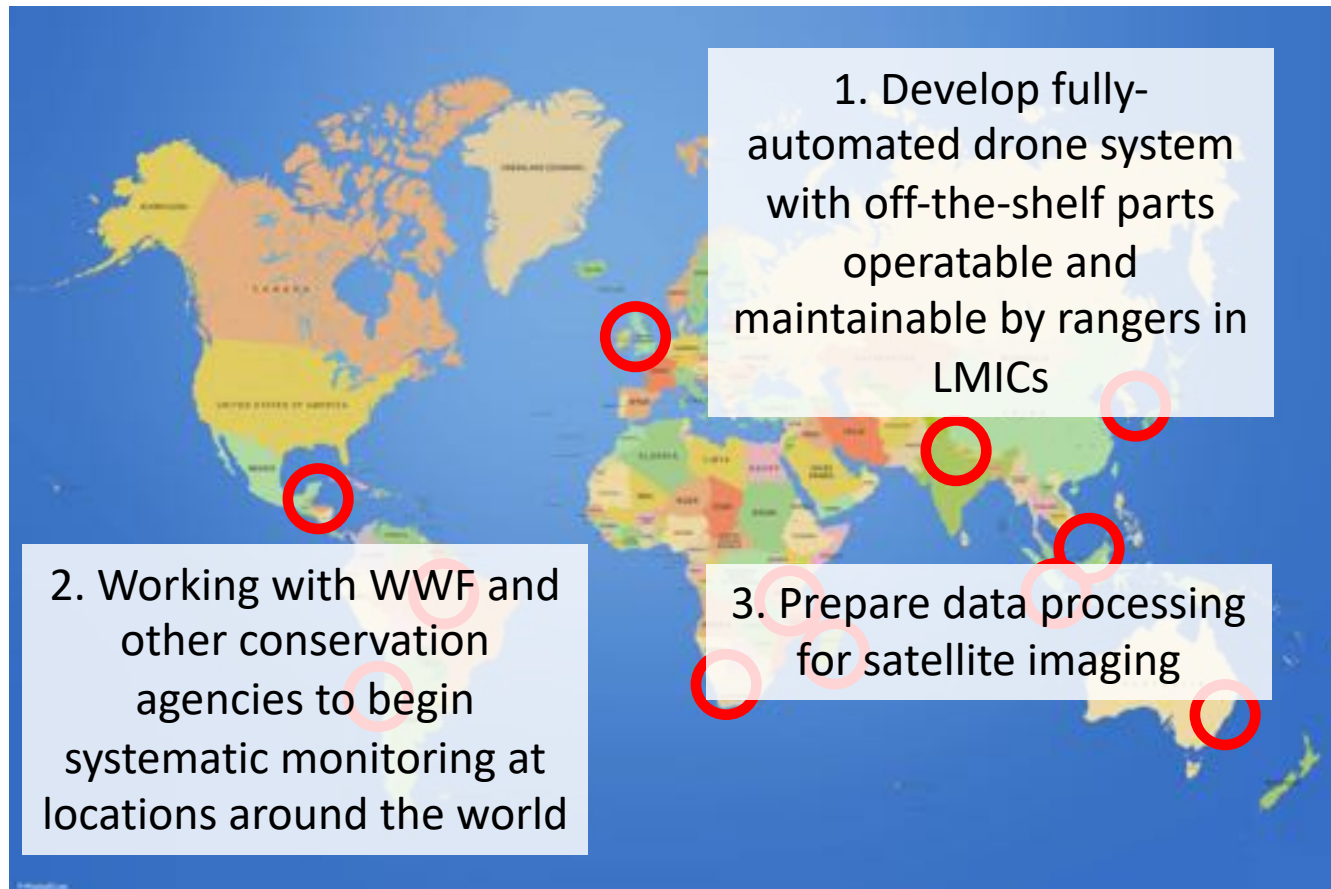








Next steps: helping conservation efforts



2014 2015 2016 2017 2018 2019

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Long-term goals

1. Fully-automated thermal drone system that can automatically detect and identify animals/fires, geotag their location and send cutout images back the ground.

2. Web-based system to which users can upload data, that will process the data and automatically identify different animal species or fires in the data, and send the results back to the user





1. Longmore+17 → initial demonstration of astro + machine learning animal/human thermal detection
2. Burke+18,19 → using (astro)physics to optimize thermal drone observations for animal surveys
3. Rashman+18 → adapting thermal tech and astro techniques for astro-ecology
4. Burke+19 → pilot study quantifying detection completeness for peat fires in Indonesia
5. Burke+19 → Field demonstration of astro-ecology techniques to detect Orangutans in Borneo
6. Spaan+19 → Field demonstration in Mexico quantifying improvement thermal drones offer for spider monkey surveys



Collaboration with WWF in Borneo – improved efficiency for orangutan detection.



Many collaborators using online system

Goal = quantify increased efficiency in determining animal number densities



Working with search and rescue organisations in the UK to try and use system to save lives



Working with conservation agencies for automatic poacher detection

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 - Database, metadata, security
9. **Other use cases** (e.g. Search and Rescue, agriculture)



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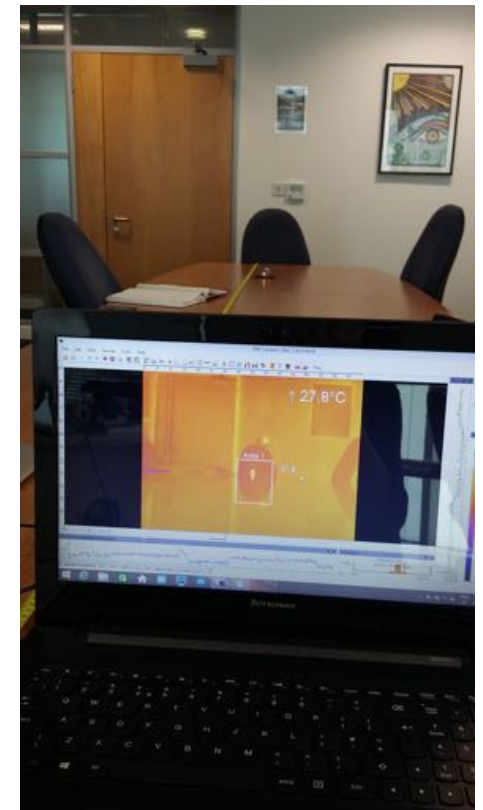
Instrumentation

- Thermal infrared: 8-14 micron
- Flir Tau2 640
 - 640 x 512 pixels :
 - 45 x 37 degrees - 13 mm lens
 - 32 x 26 degrees - 19 mm lens
- Accuracy: +/- 5%
- Micro bolometers different to CCDs
- More affordable for our system

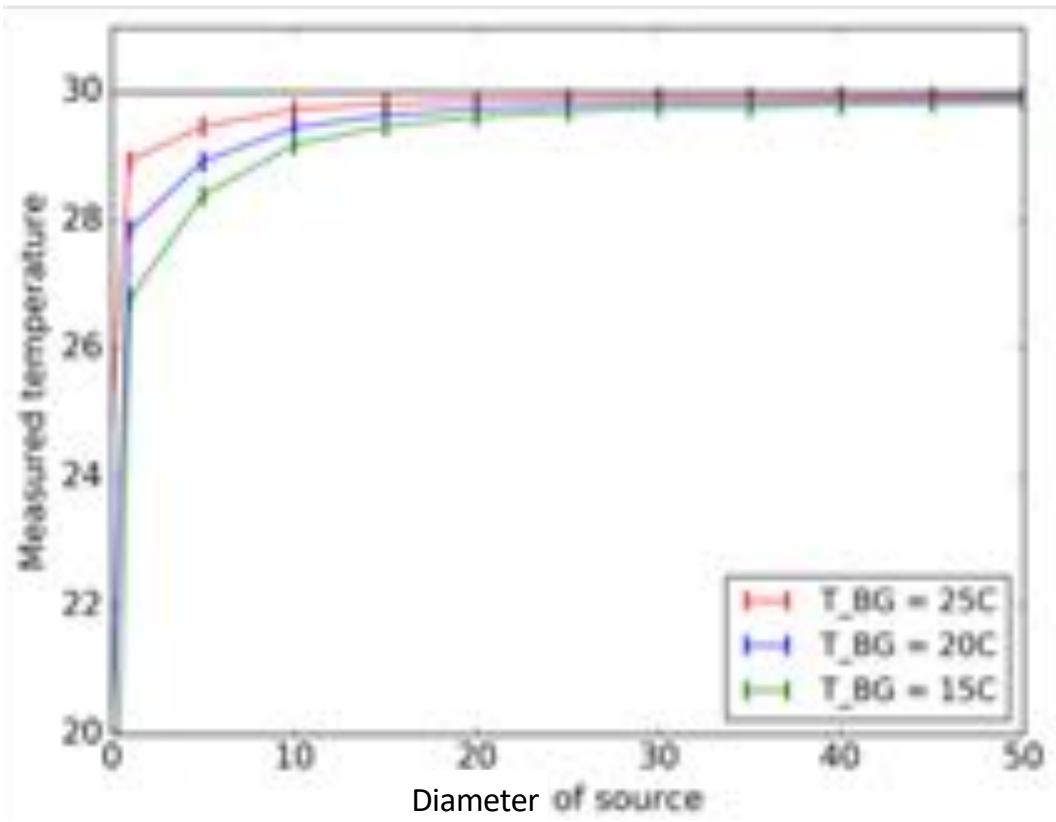
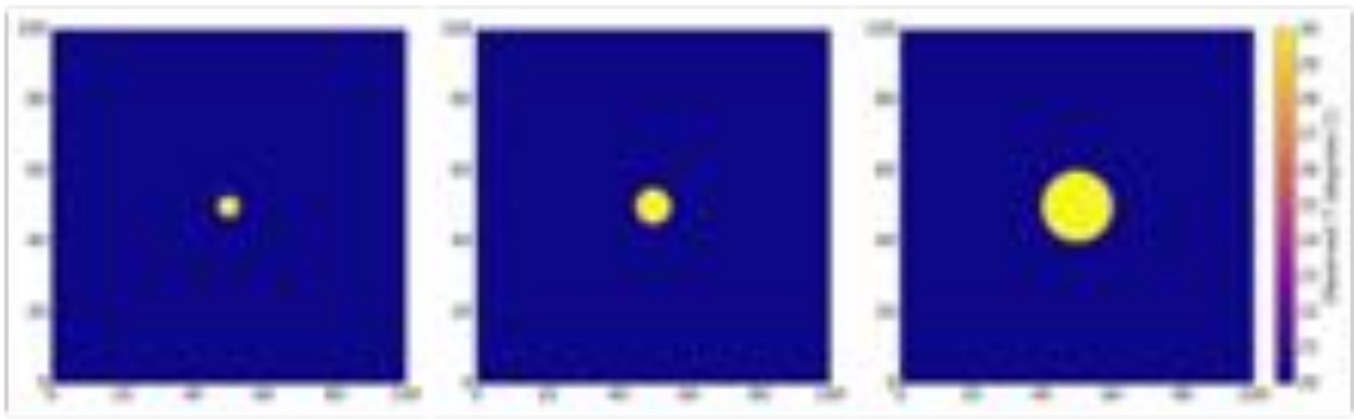


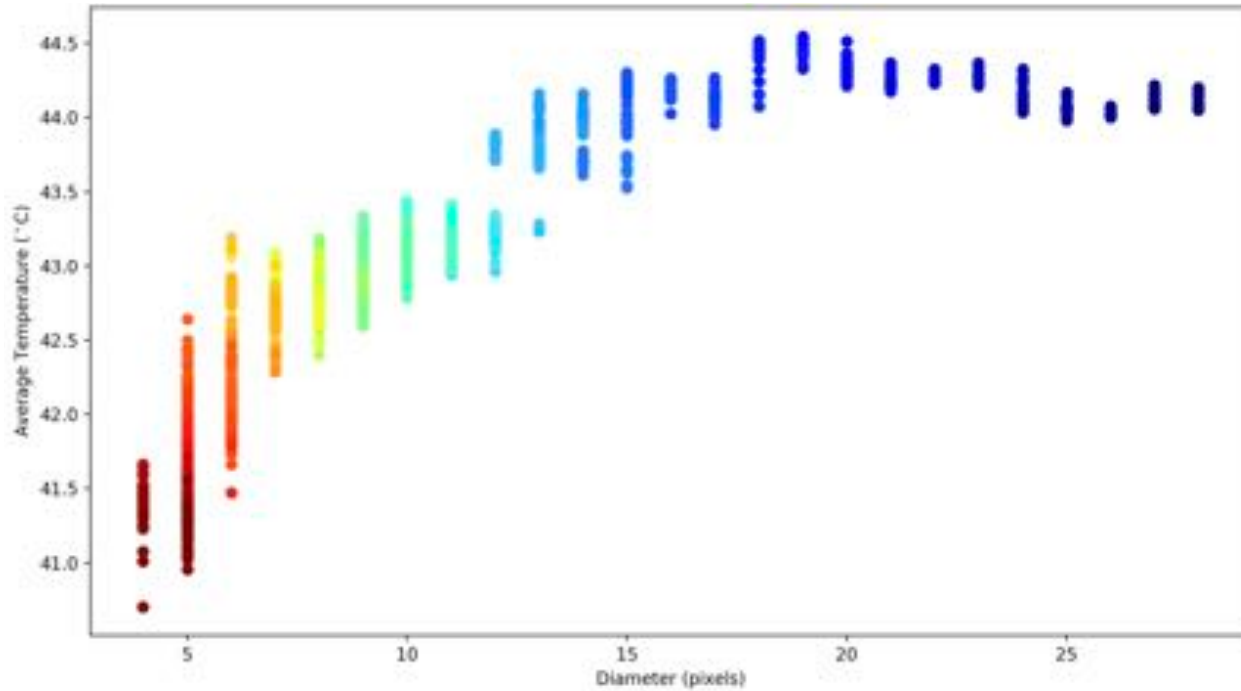
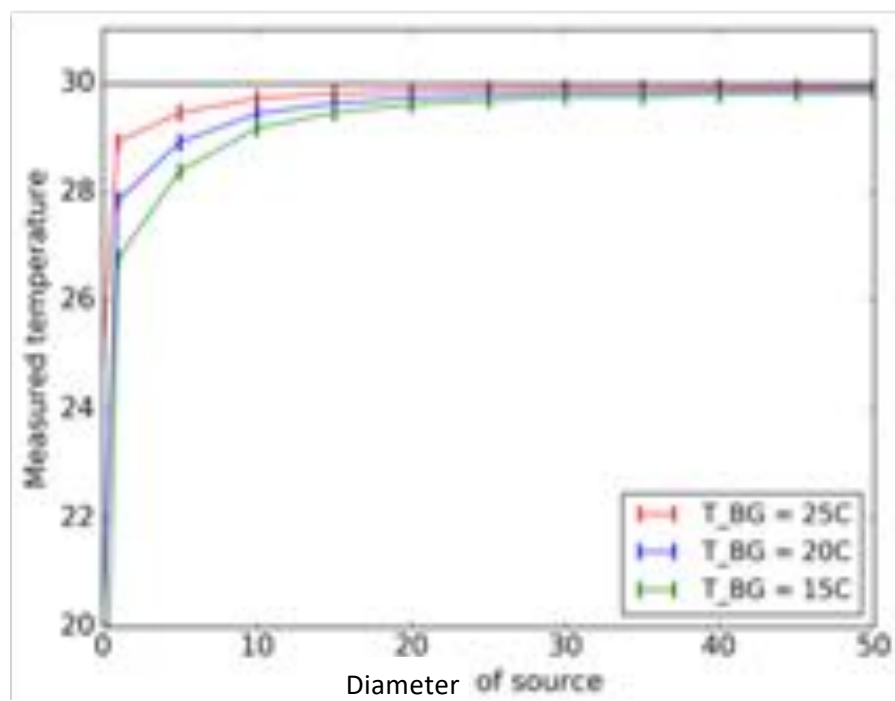
Testing

How accurately can we measure absolute temperature?

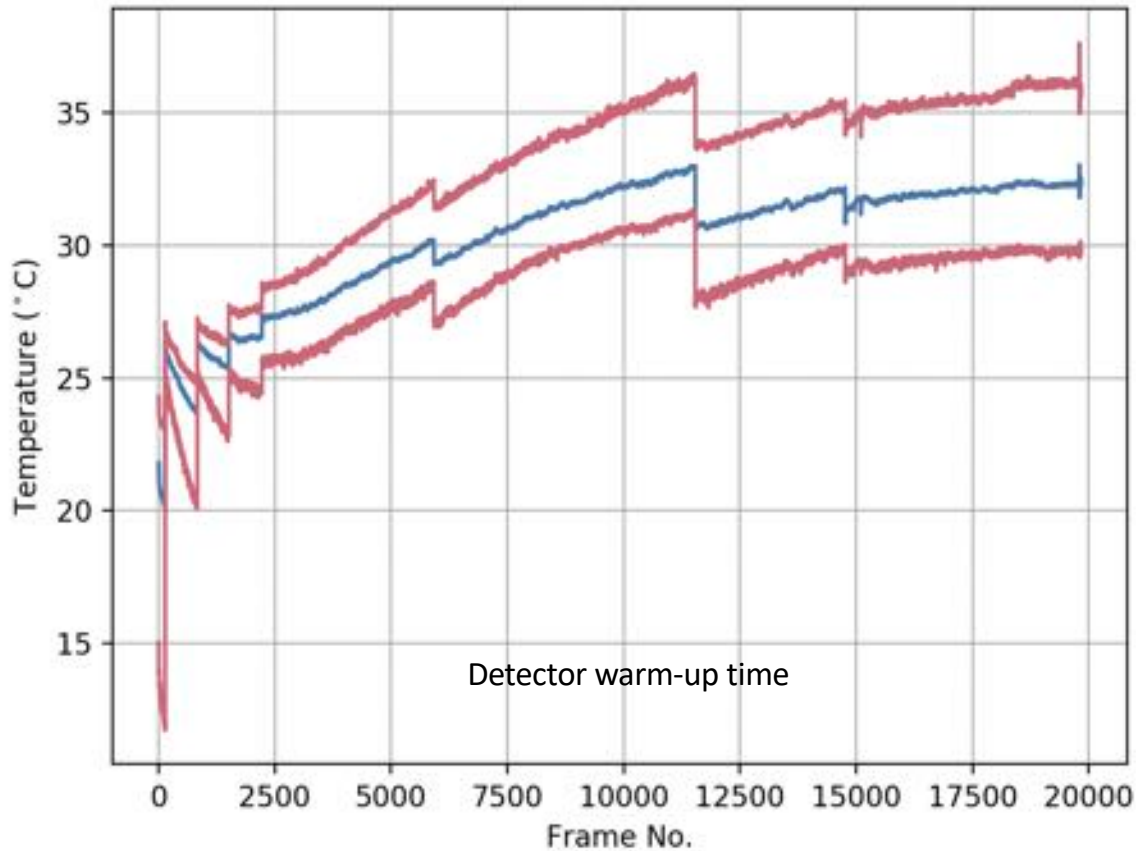


$$T_{obs} = \frac{T_A A_A + T_B A_B + T_C A_C + \dots}{A_{total}}$$





How stable is measured temperature?



Also, other sources of systematic error;

Flat fielding

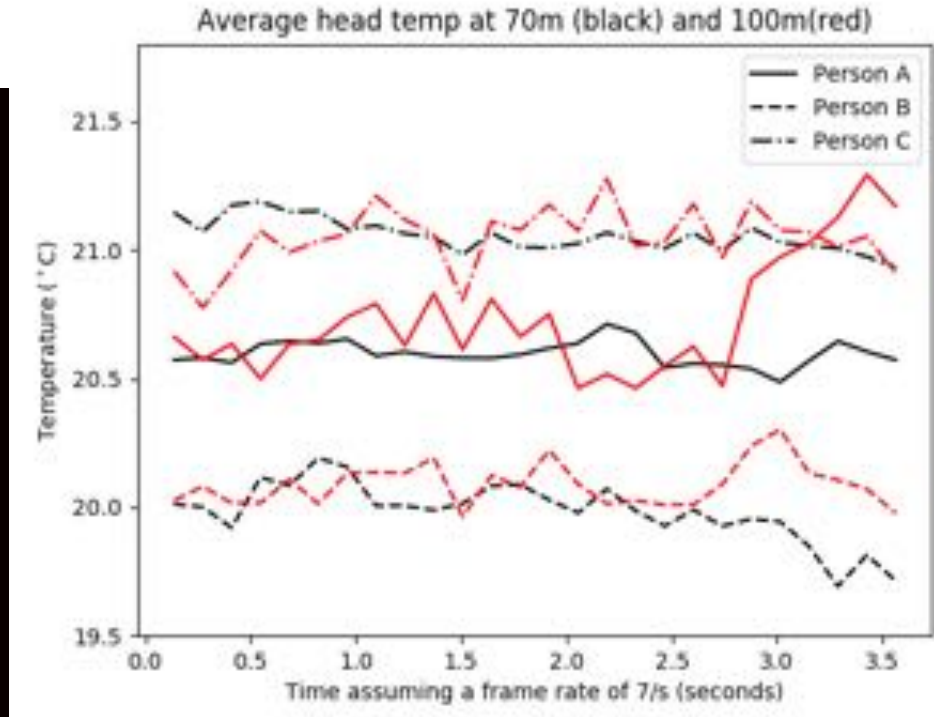
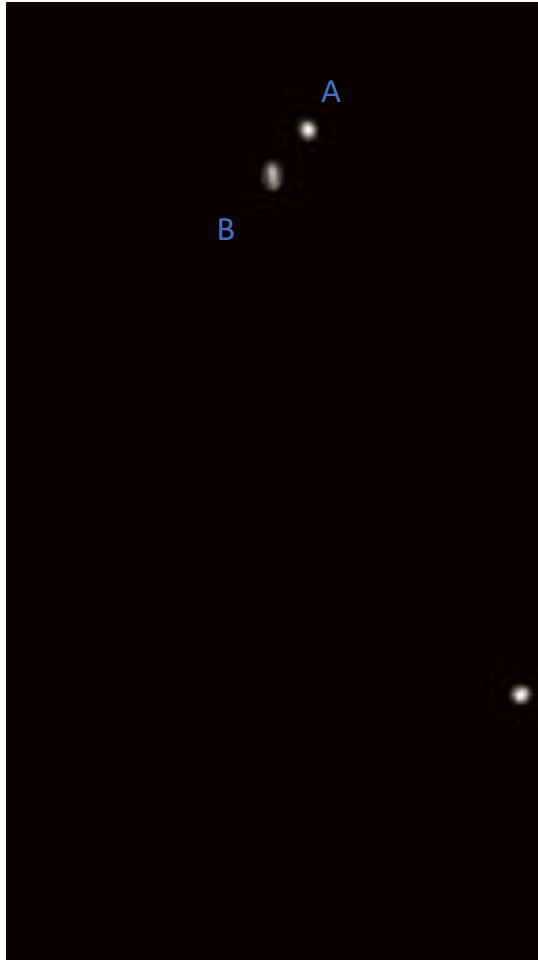
Lens 'roll off'

Heating of camera housing

Internal noise

...

Proof of concept – poachers



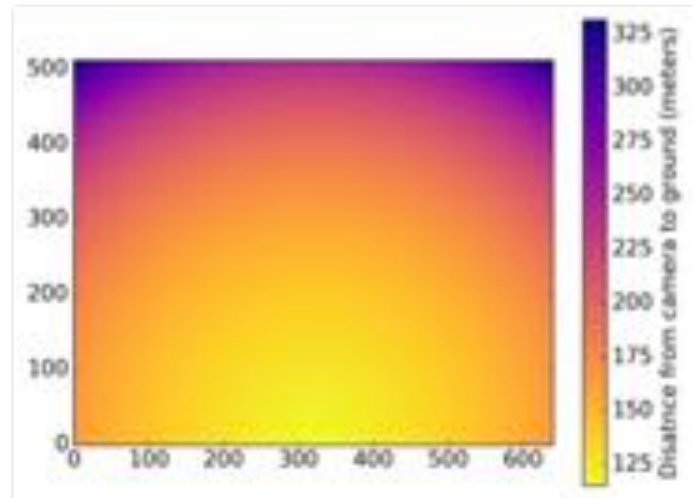
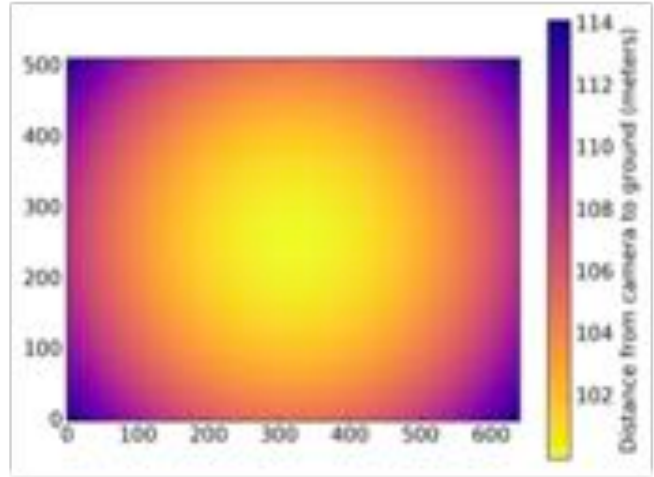
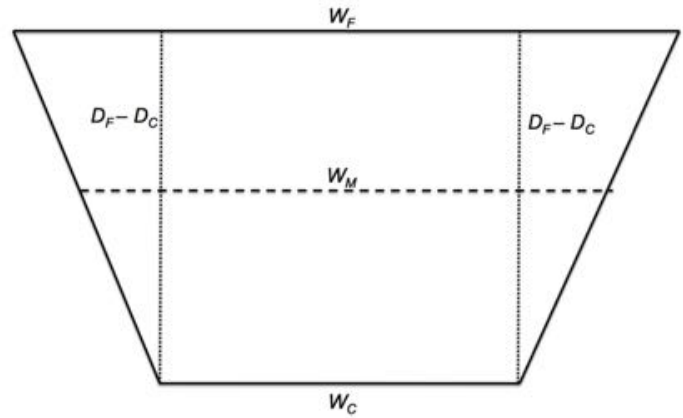
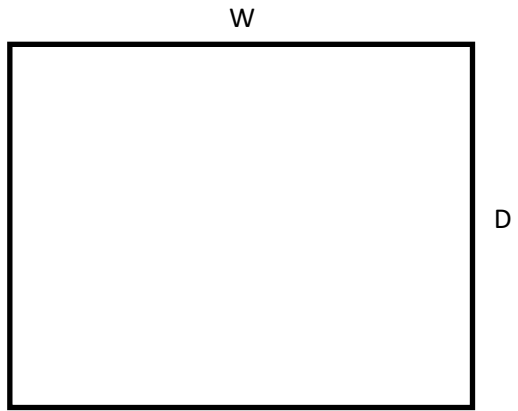
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How best to observe?

The image is a composite of several diagrams and equations. On the left, a whiteboard contains handwritten sketches and formulas. At the top left, there is a triangle with a vertical line from the top vertex to the base, labeled with a width $2d_0$. To its right is a square with a diagonal line from the top-left corner to the bottom-right corner, labeled with a width $2d_0 \tan(\theta)$. Below these are more complex diagrams. One shows a right-angled triangle with a hypotenuse and a vertical line from the top vertex to the hypotenuse. Another shows a trapezoid with a dashed horizontal line across its middle. Handwritten equations include: $d_0 \tan(\theta - \phi)$, $d_0 \tan(\theta + \phi)$, $d_0 \tan(\theta + \phi) - d_0 \tan(\theta - \phi)$, $w_1 = 2(d_0^2 + h^2)^{1/2} \tan(\frac{\theta}{2})$, and $w_2 = 2(d_0^2 + h^2)^{1/2} \tan(\frac{\theta + \phi}{2})$. On the right, a digital overlay features a trigonometric diagram with a vertical axis labeled 'Vertical Distance' and a horizontal axis labeled 'Horizontal Distance'. A vertical line of height h has a horizontal line of length d_0 extending from its base. Three dashed lines originate from the top of the vertical line, at angles $\theta - \phi$, θ , and $\theta + \phi$ from the vertical. These lines intersect the horizontal axis at points labeled D_0 , D_1 , and D_2 respectively. Below this is a trapezoid with a top width w_1 , a bottom width w_2 , and a dashed horizontal line across its middle labeled w_0 . The left and right sides of the trapezoid are labeled $D_2 - D_0$.

How best to observe?



DRONE OBSERVING TOOL



v0.5



If you use our calculator to help you publish something, **please cite us.**

Details of how this site works can also be found in this paper:

Burke et al., 2018, *International Journal of Remote Sensing* (currently in review)

Environmental conditions at your location (i)

LATITUDE, LONGITUDE:

5.853431, 117.957794

INITIATE

Flight setup (i)

Camera details:

Camera resolution (Pixels)

640 x 512

Angular field of view (Degrees)

45 x 37

Animal or object details:

Animal length - aerial perspective (Metres)

1

Required animal size in data (Pixels)

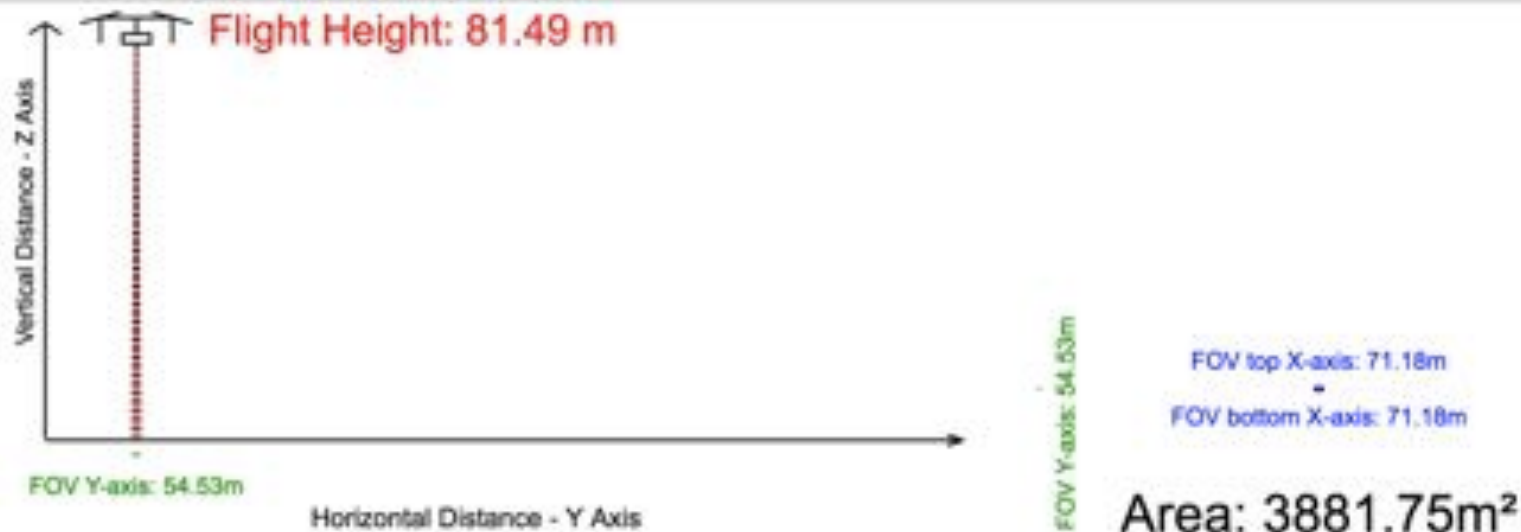
10

INITIATE

Camera Angle

0

UAV Flight Height and Field of View (FOV) on Ground



Area in data where pixel scale ($P_p = 0.1$ meters per pixel) is within 5% of specified value.

Useful if planning orthomosaics.

Pixels within 5% of P_p on X Axis



Percentage of pixels
< $P_p + 5%$ (X Axis)



Pixels within 5% of P_p on Y Axis



Percentage of pixels
< $P_p + 5%$ (Y Axis)



Pixels within 5% of P_p on Both Axis

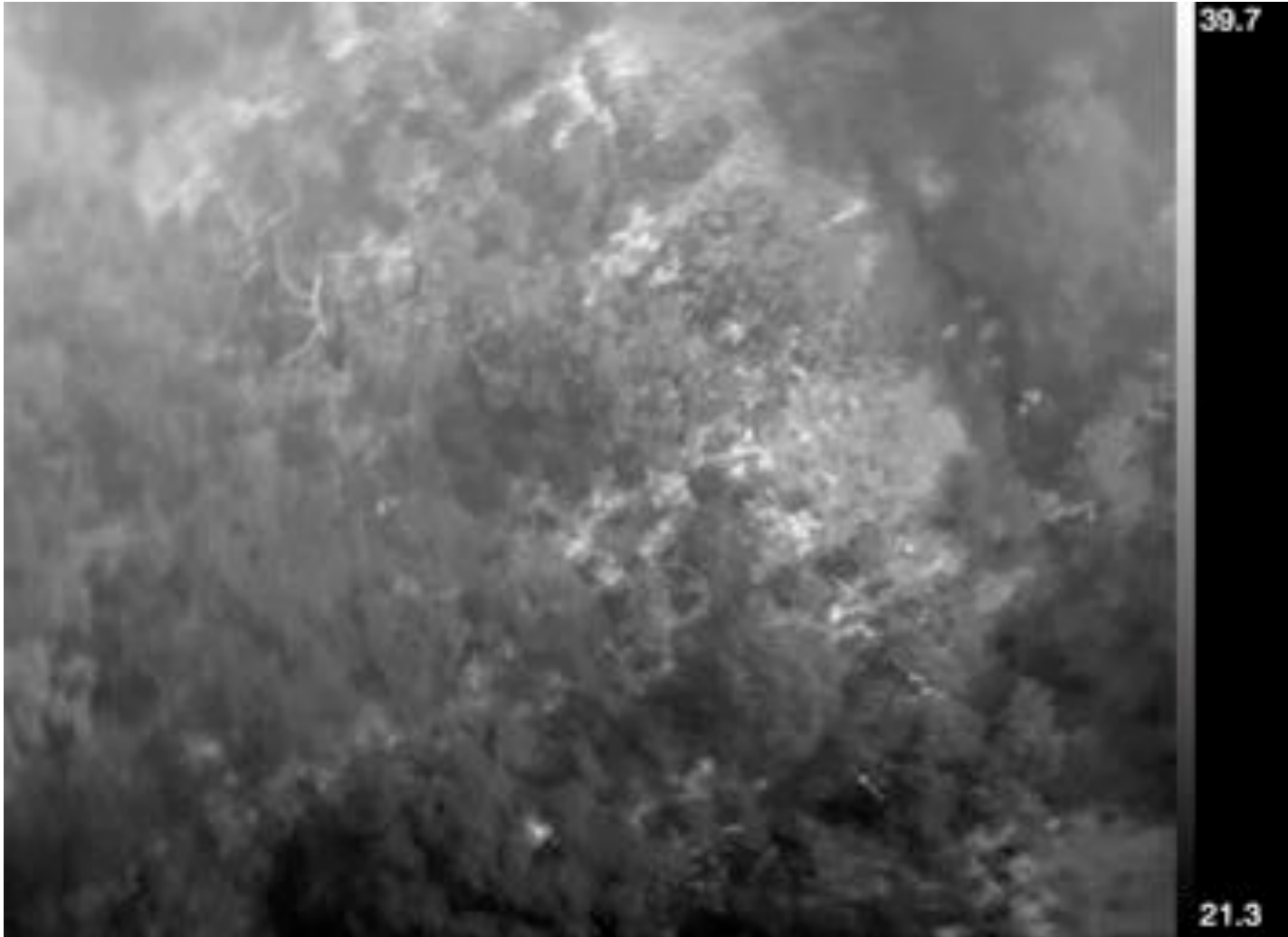


Percentage of pixels
< $P_p + 5%$ (Both Axis)

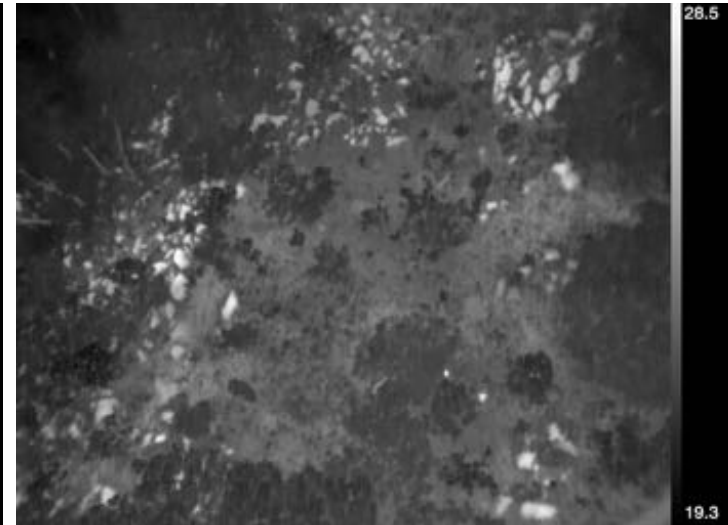
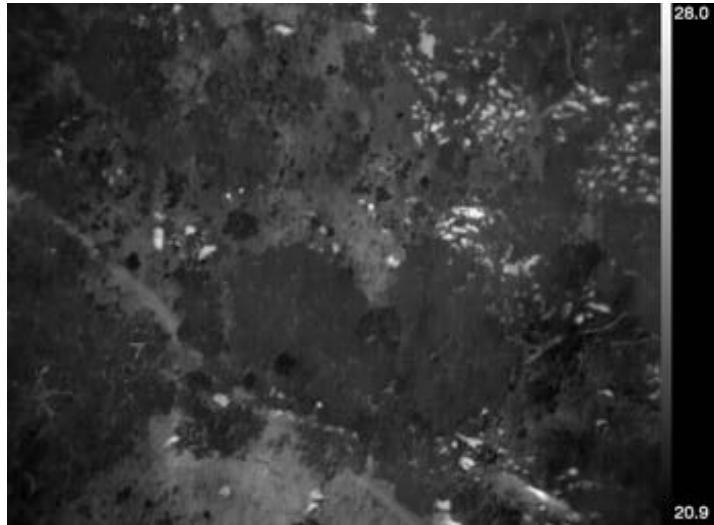
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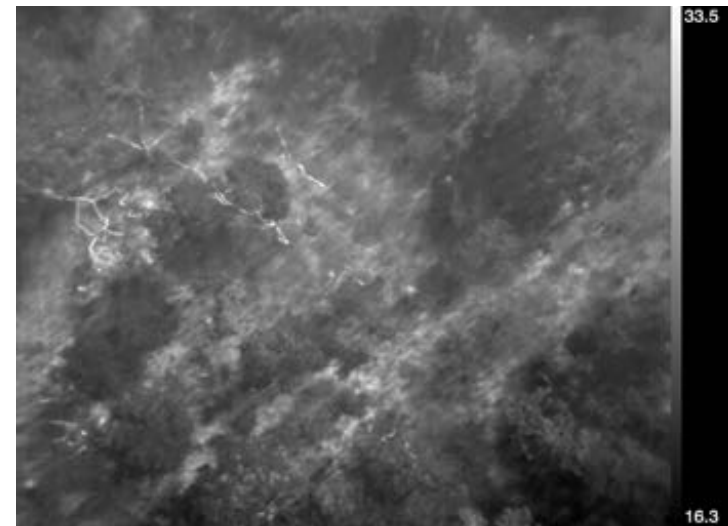
Environmental “issues”



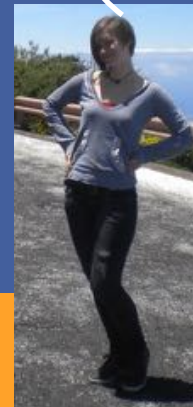
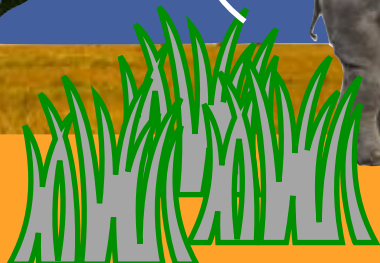
Spot the poachers



False detections
'Bright compact objects'
Rocks
Tree branches
Bodies of water



Sources of thermal radiation

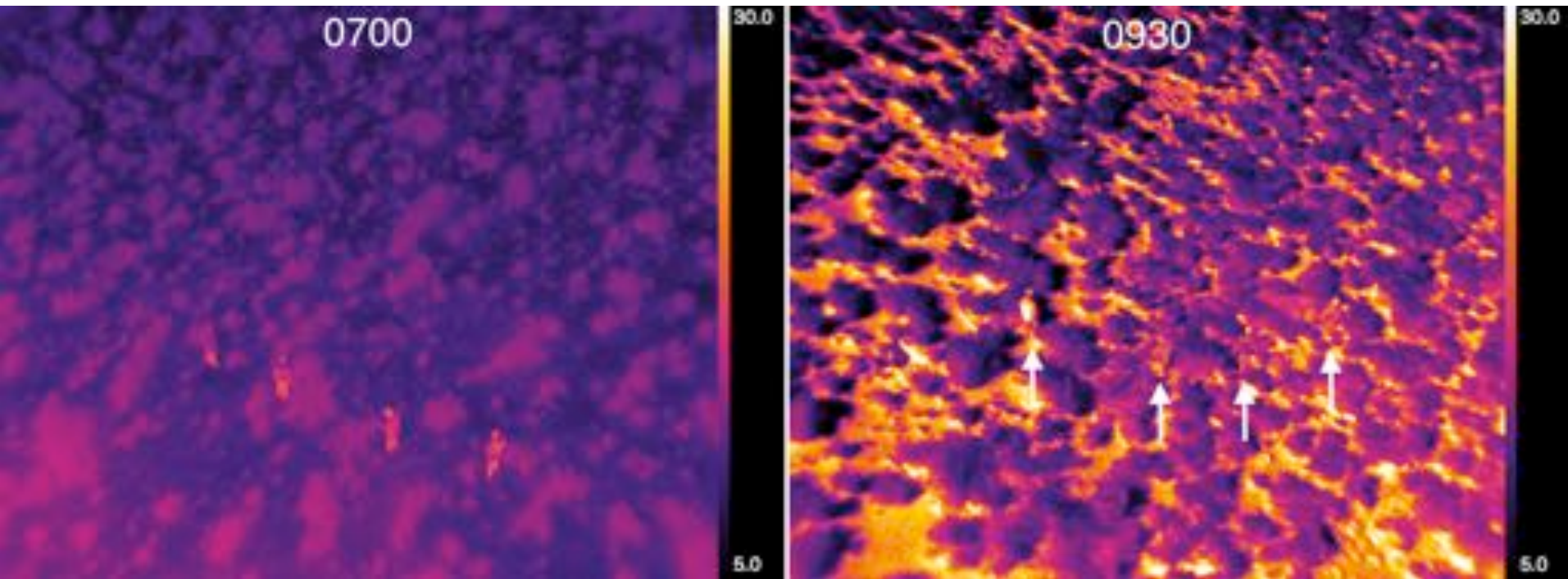


Other 'false detections'



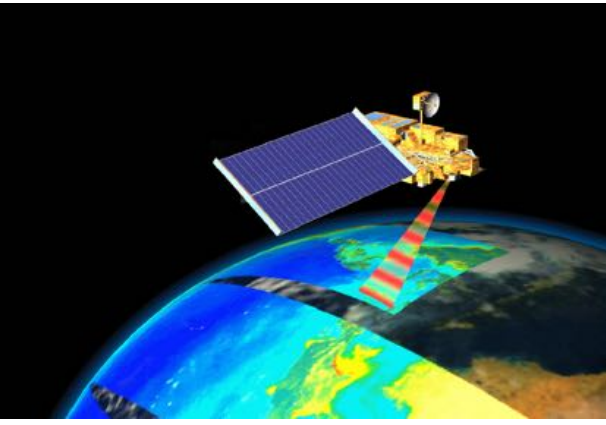
Spot the poachers II

“Issues” with the ground

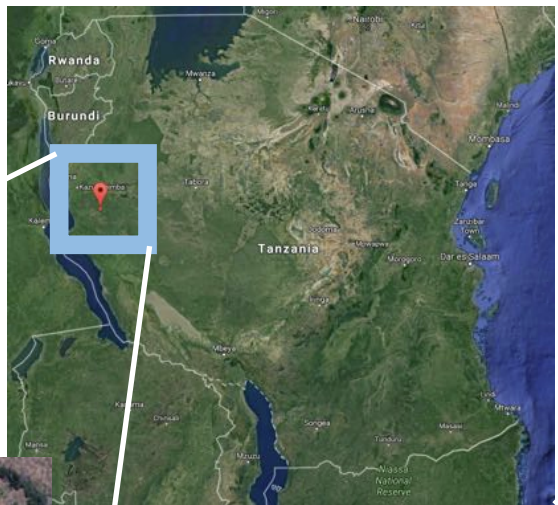
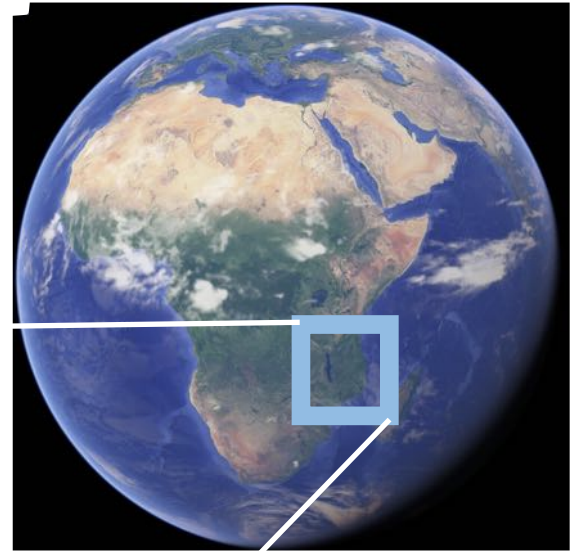


Understanding the background

Climate monitoring satellites



MODIS

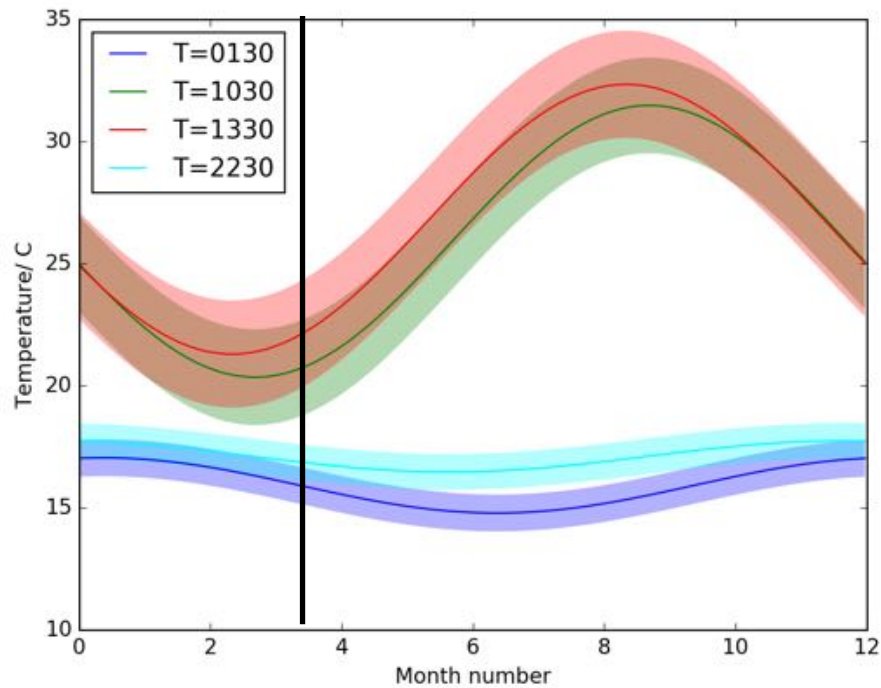


Ugalla Park, Tanzania

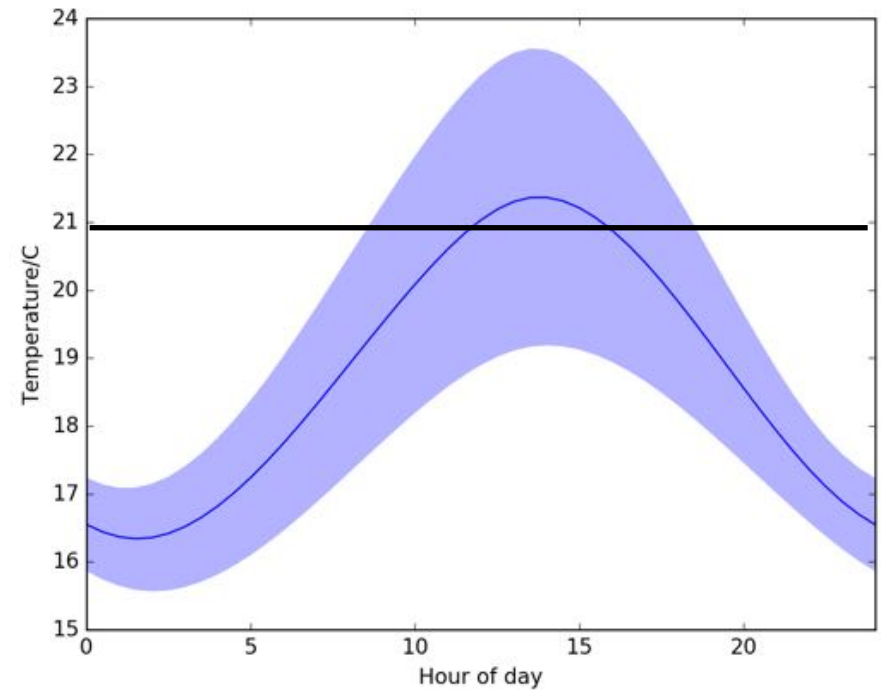
1km scale

Predicting the ground temperature

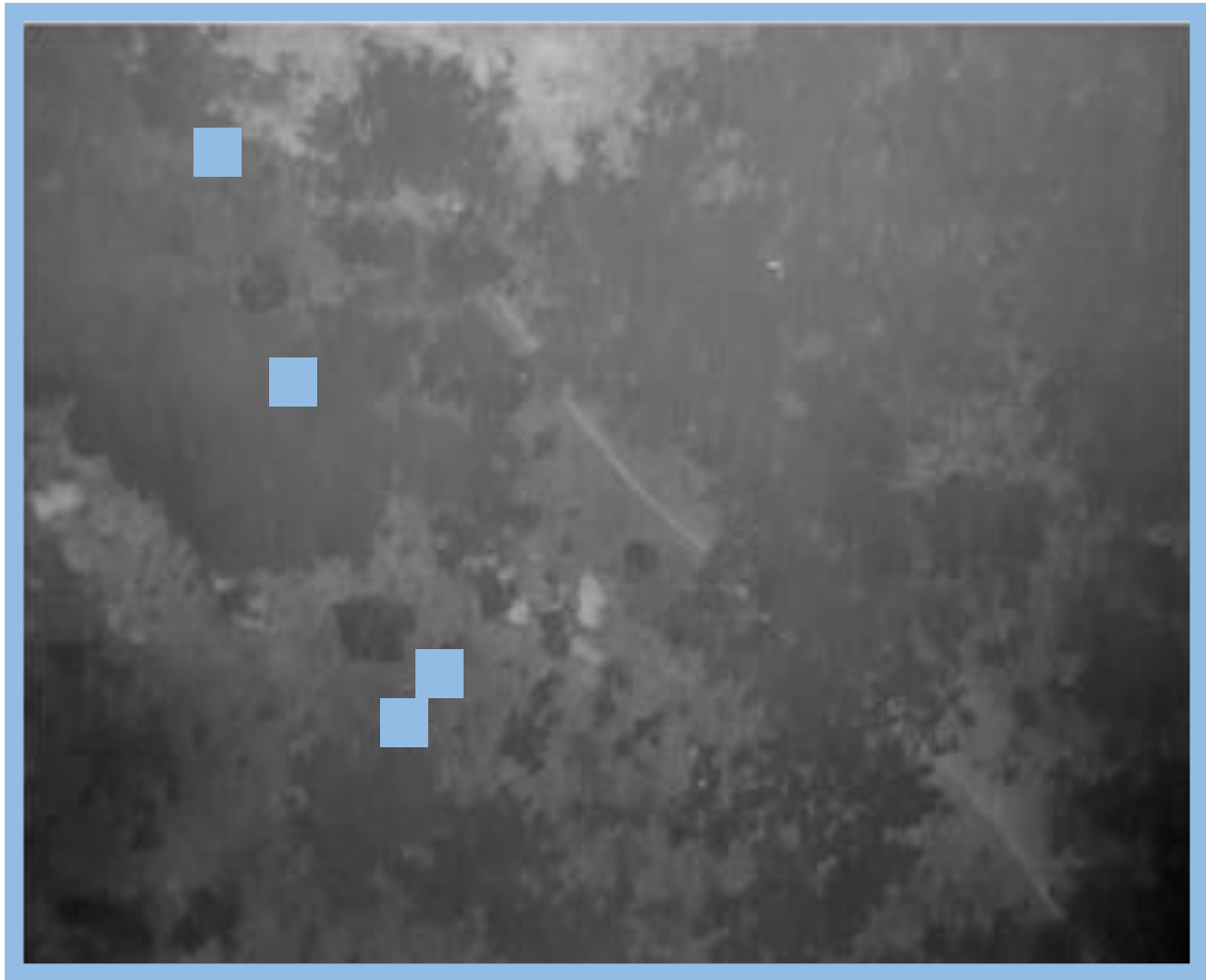
Annual land surface temperature climatology



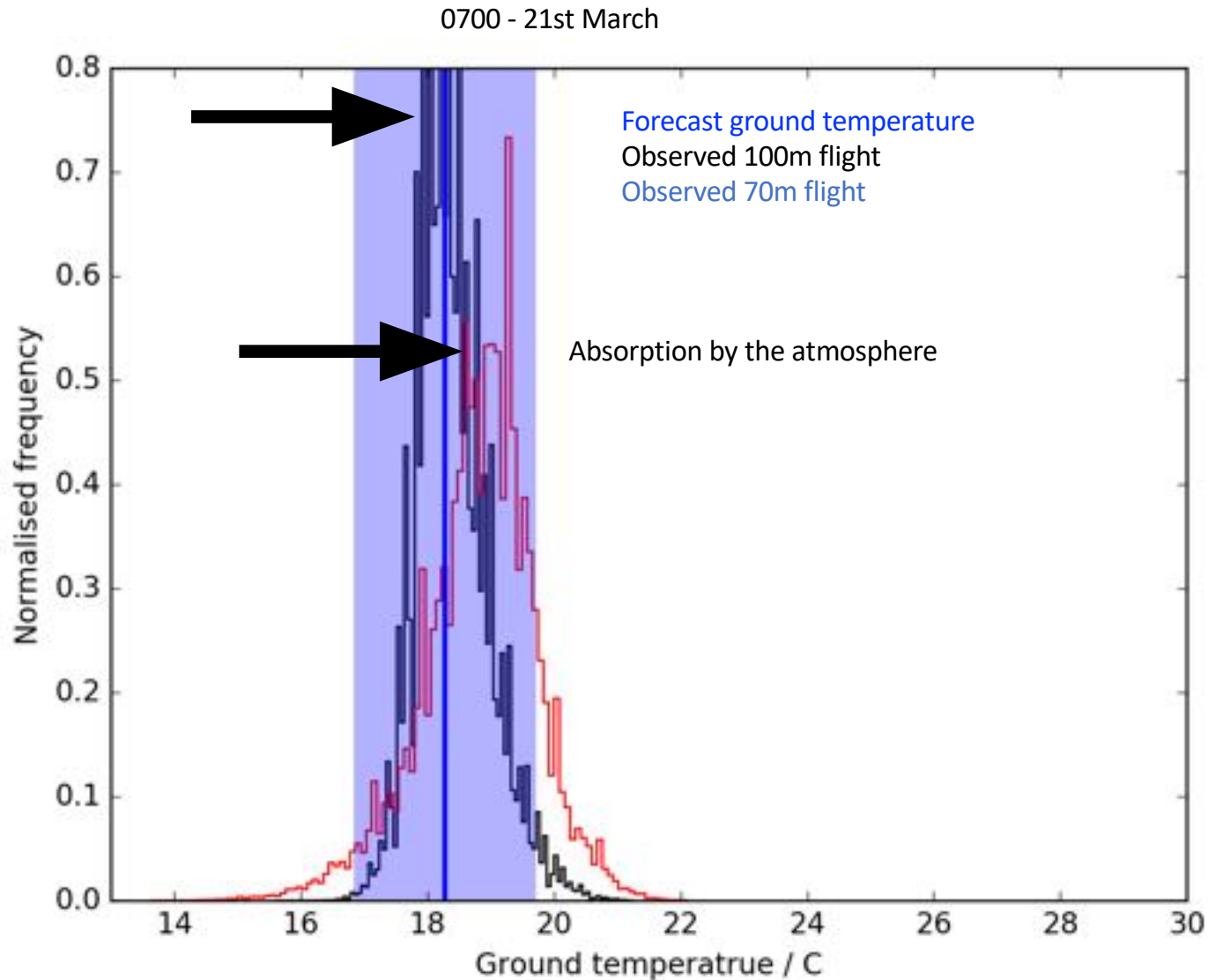
Daily temperature range for mid-March



Testing our climatology



Testing our climatology



Radiative transfer

Obs T, P
rel humidity

Atmos
 $N_2 \sim 75\%$
 $O_2 \sim 23\%$
 $\rightarrow H_2O \sim 2\%$

Diagram: A rabbit on the left emits radiation I_{ν} towards a cloud labeled K_{ν} . The cloud is at $T = 10^4 K$ and $V = 10^4 \text{ m/s}$. Radiation $I_{\nu}(s)$ is shown being reflected back towards the rabbit.

Equilibrium $V + P_{\nu} = P$

Graph 1: A plot of P_{ν} vs T showing an exponential relationship. Equation: $P_{\nu} = 1 - \frac{T_{\nu}}{T_0}$

Equation: $\frac{dI_{\nu}}{ds} = I_{\nu} - K_{\nu} I_{\nu}(s=0)$

Equation: $dI_{\nu} = \int -H_{\nu} I_{\nu} dS$

Equation: $I_{\nu}(s) = I_{\nu}(s=0) e^{-\int H_{\nu} ds}$

Equation: $P_{\nu} = 23066 \text{ Pa}$
 $T_0 = 647.076 \text{ K}$

Equation: $\frac{P_{\nu}}{P} = \left(\frac{a_0 T + a_1 T^2 + a_2 T^3 + a_3 T^4}{a_4 T^2 + a_5 T^3} \right) e^{-\frac{a_6}{T}}$

Equation: $\frac{P_{\nu}}{P} = \frac{P_{\nu}(H_2O)}{P_{\text{tot}}} = \frac{P_{\text{atm}} P^*(H_2O)}{P_{\text{tot}}}$

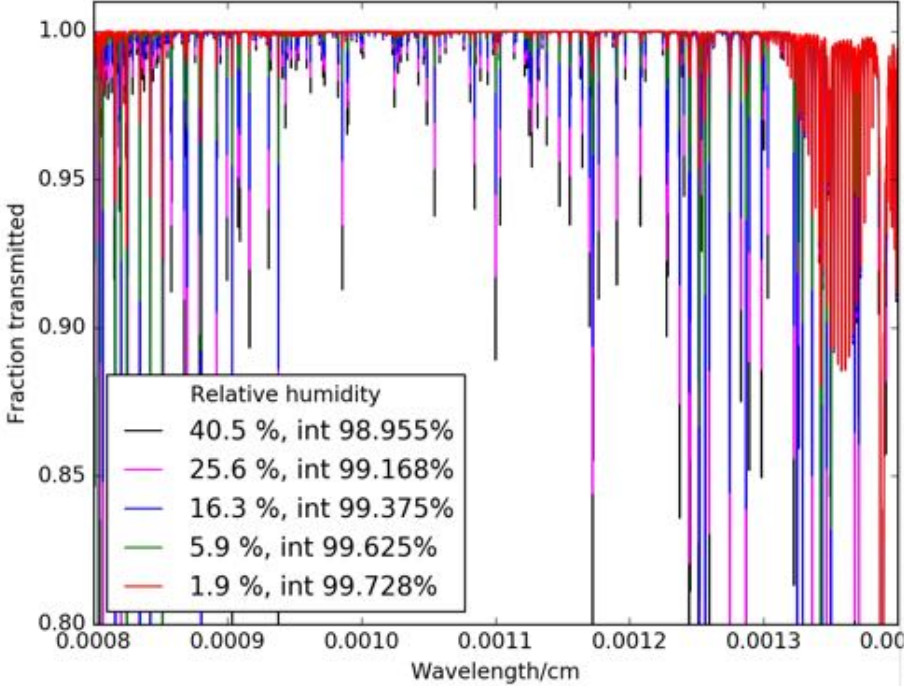
Equation: $\frac{P_{\nu}(H_2O)}{P_{\text{tot}}} = \frac{P_{\text{atm}} P^*(H_2O)}{P_{\text{tot}}}$

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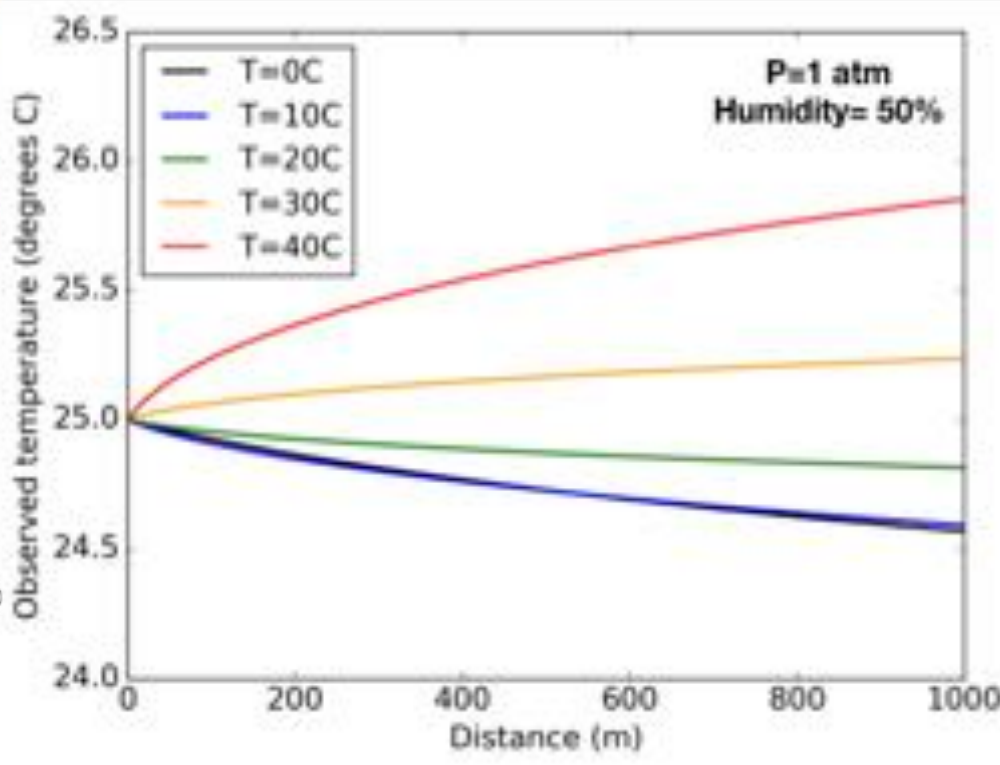
Graph 2: A spectral plot showing $I_{\nu}(s) / I_{\nu}(s=0)$ vs λ with several vertical bars representing absorption lines.

Radiative transfer

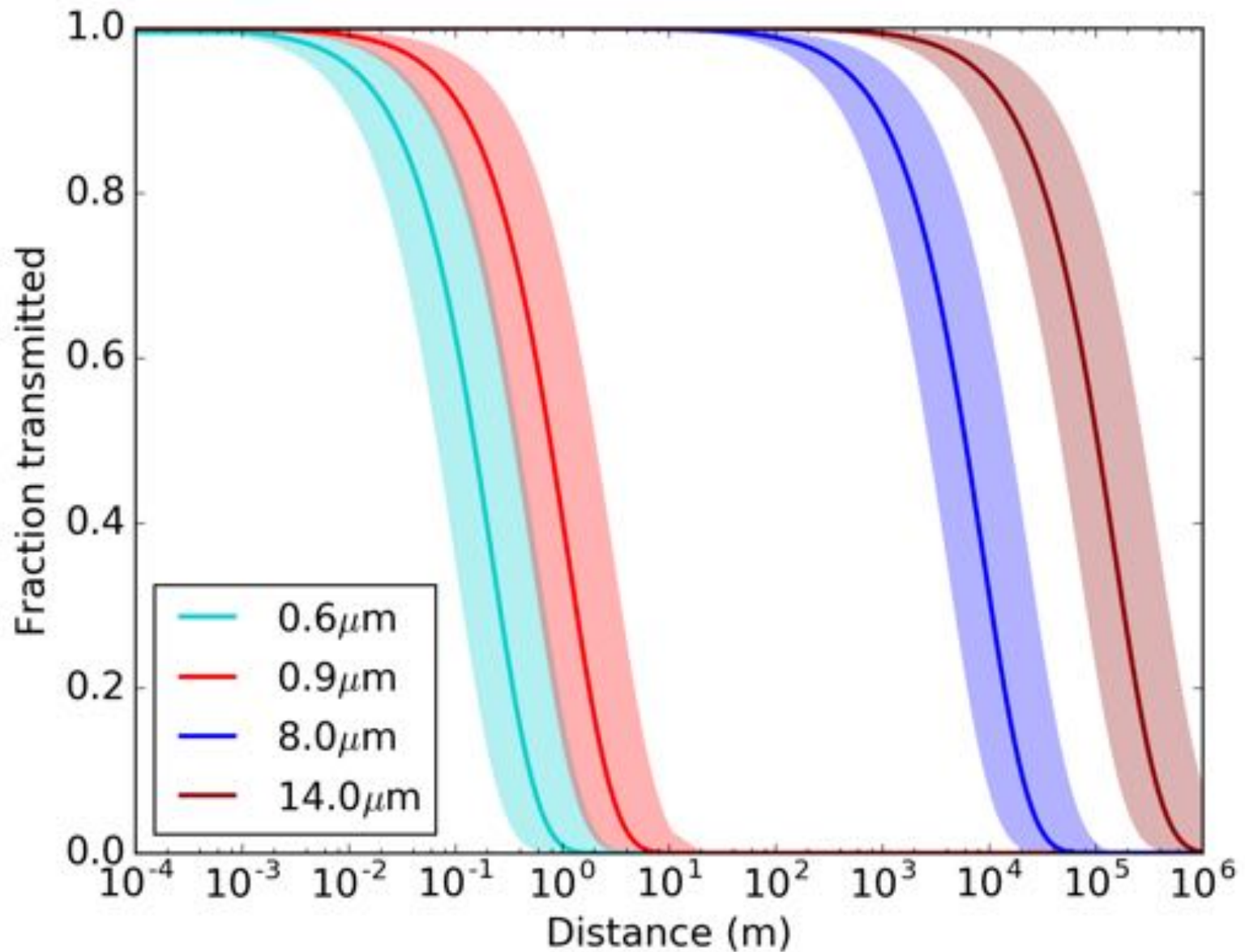
Absorption spectra
8-14 micron
100 meters from source



Absorption is function of;
Distance
Pressure
Temperature
Humidity (composition)

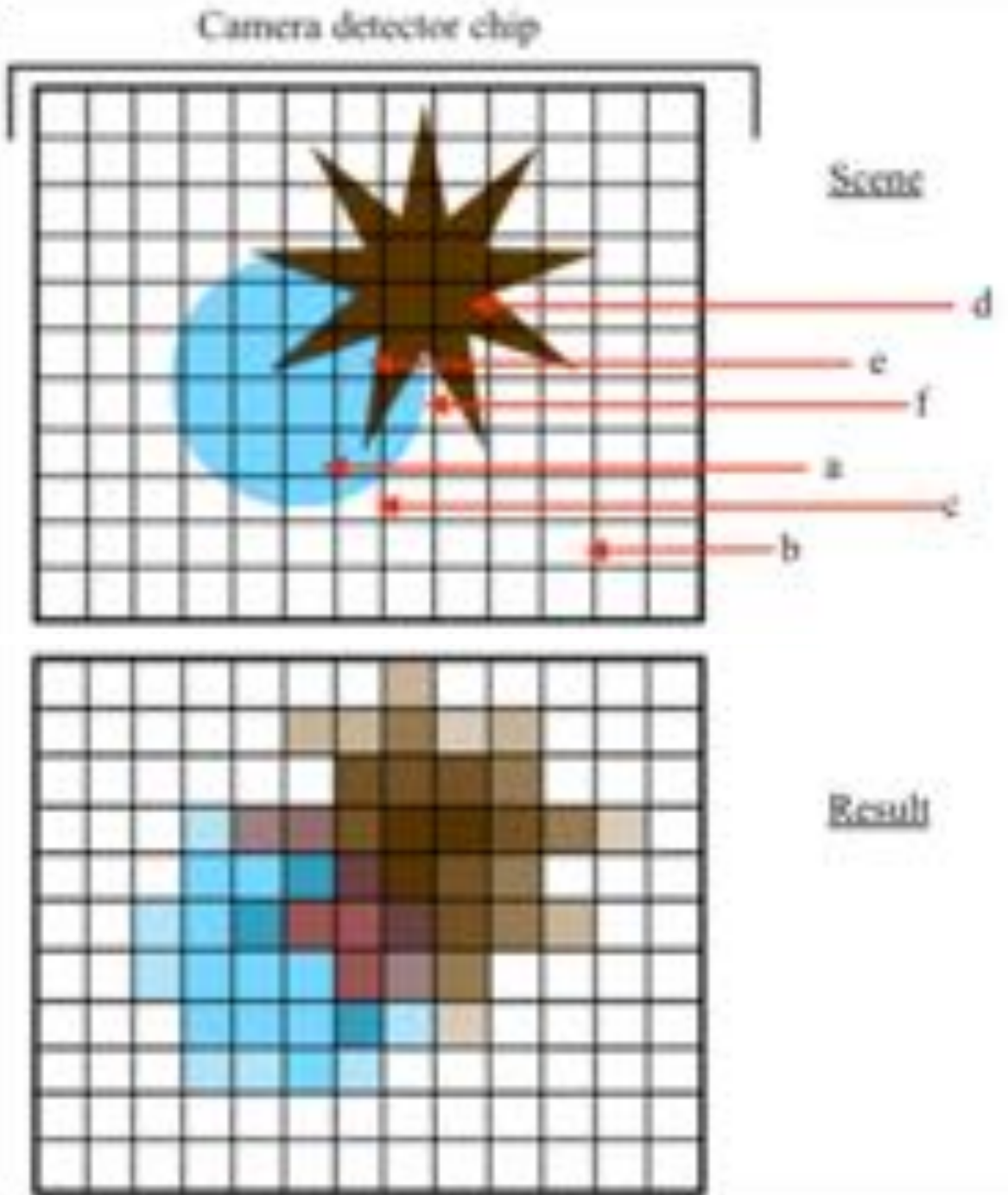


Scattering of photons by water vapour (fog)



Things in the way





So eventually...



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Mosaic image and detections — Red: History detections, Cyan: Current View.



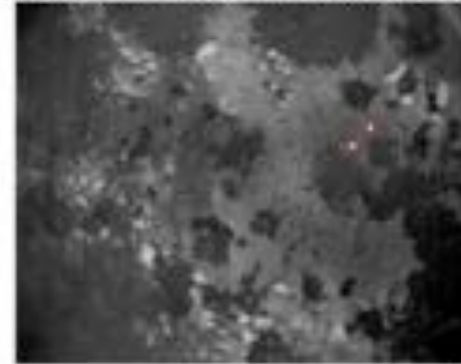
Input Image — Green: Current Detections (Bright Area)



Mosaic Image and detections — Red: History detections, Cyan: Current View.



Input Image — Green: Current Detections (Bright Area)



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Object detection and classification in thermal
infrared camera data using YOLOv3

Astro-Ecology group

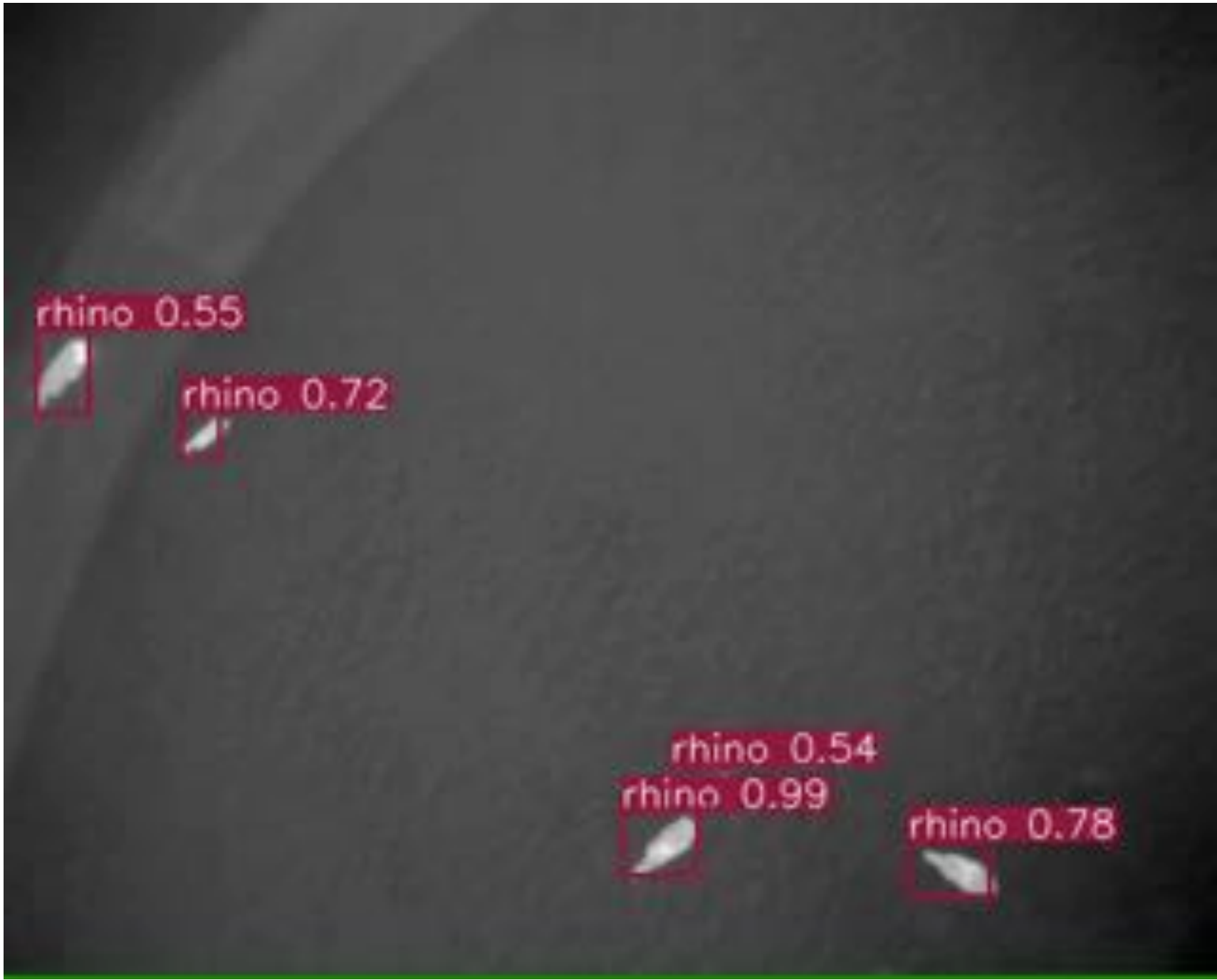
Astrophysics Research Institute



LIVERPOOL
JOHN MOORES
UNIVERSITY

Rhino paddock at Knowsley Safari

Credit: Josh Veitch-Michaelis



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Please upload a picture for detection

Important: Please make sure that your image size is above 800 x 600 for best results. Lower resolution images may not be detected

Choose File no file selected

Your picture will automatically upload for classification

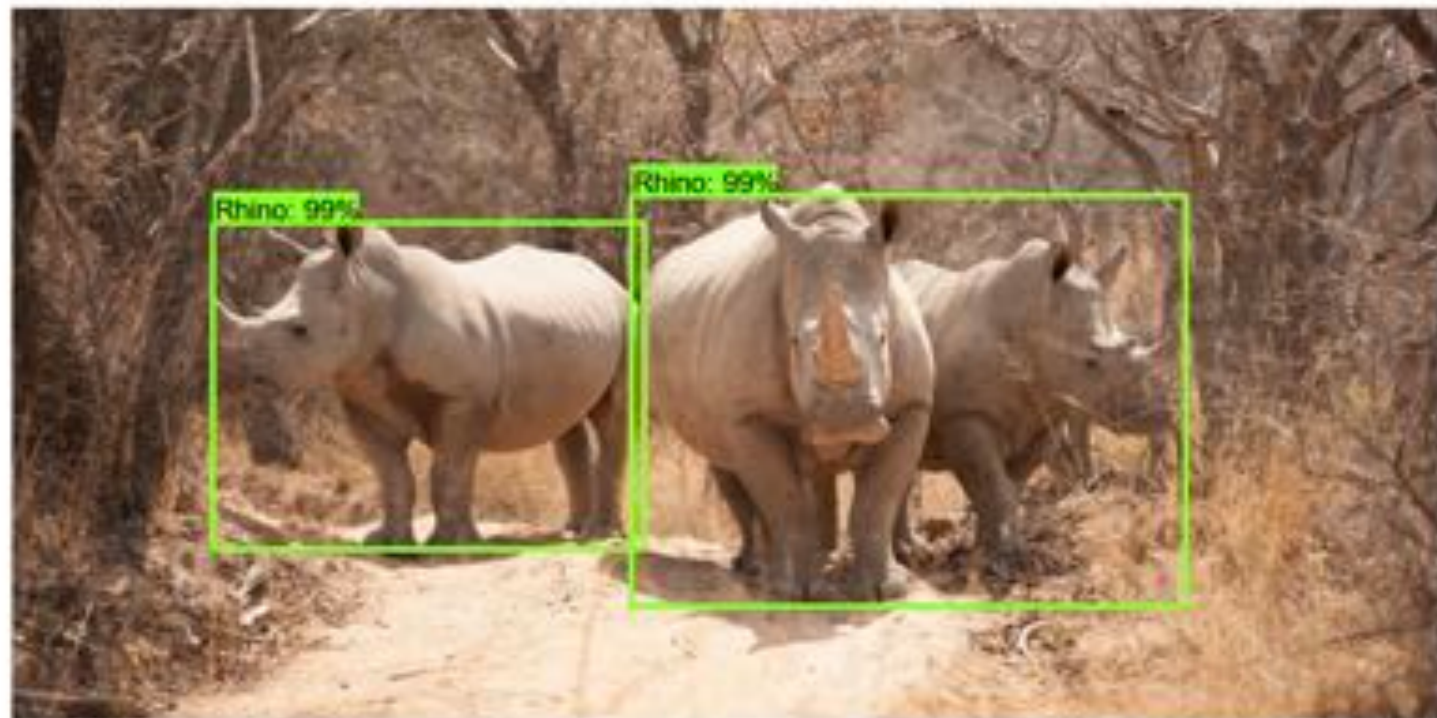


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Complete

Result:

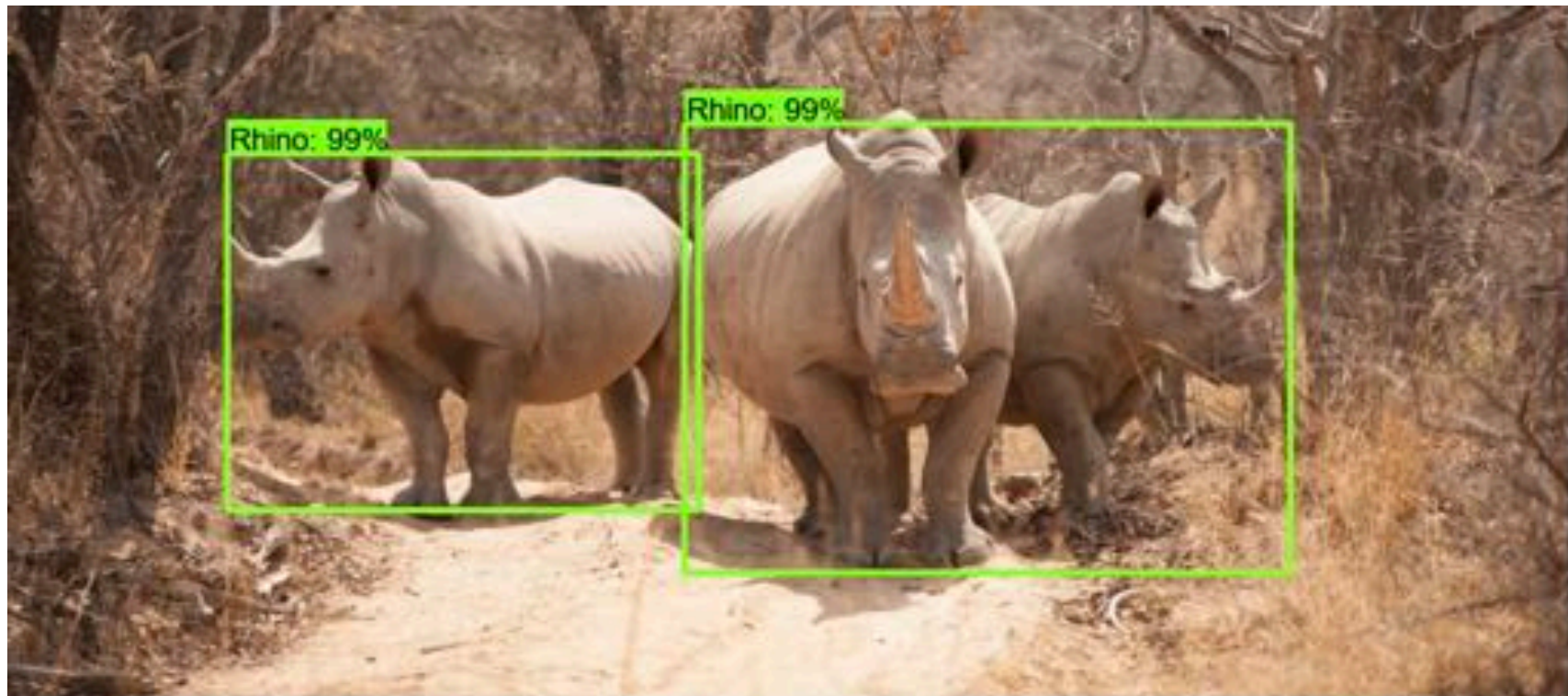


File name: rhino.jpg

Grade:[{"id": 1, "name": 'Rhino'}, {"id": 1, "name": 'Rhino'}]

Description: No information available for this classification

[Click here to return to home page](#)



File name: rhino.jpg

Grade:{{'id': 1, 'name': 'Rhino'}, {'id': 1, 'name': 'Rhino'}}

Description: No information available for this classification

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If this result is incorrect, please report it below:

What was wrong?

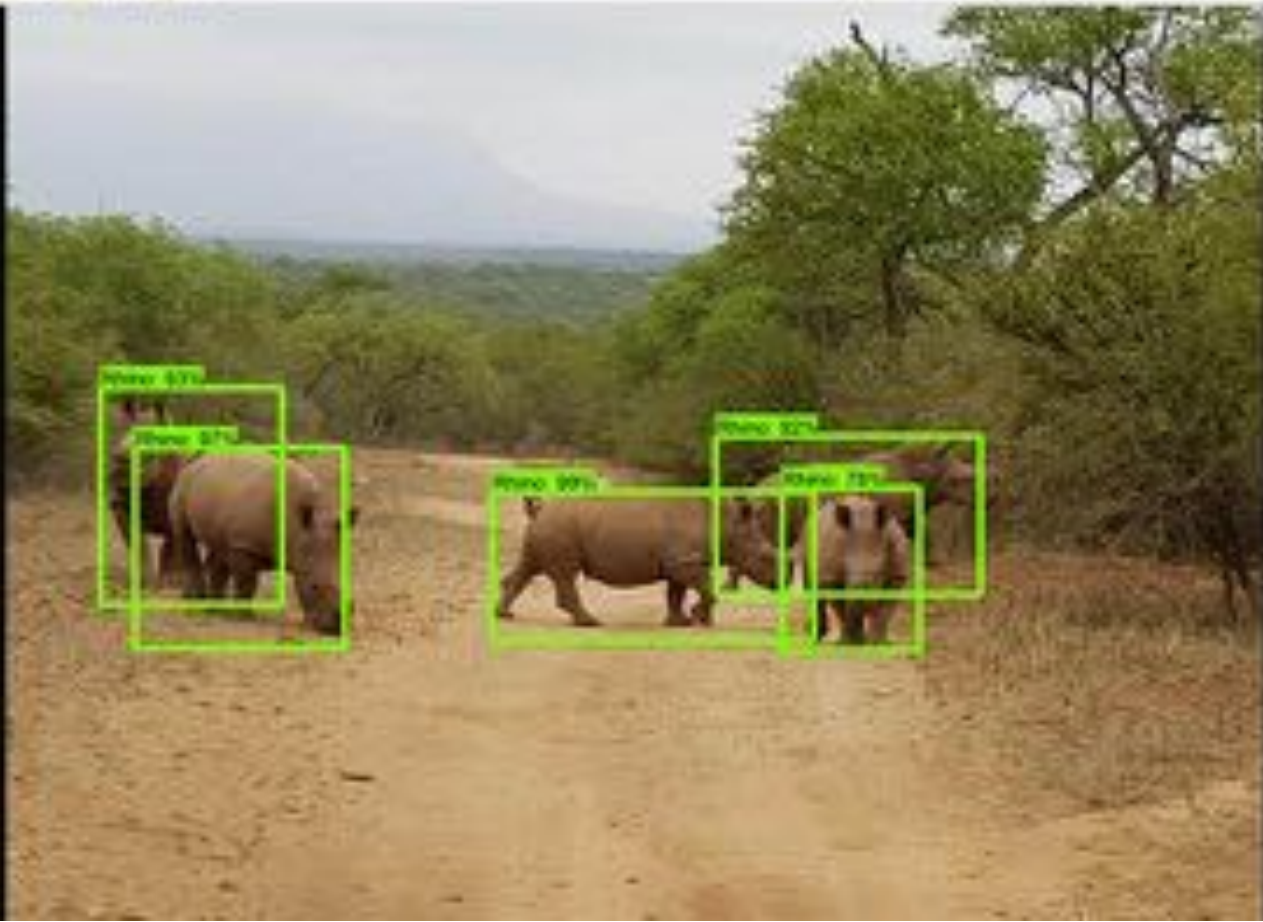
Rhino Object Detection

Model Version: 1 Date:22/06/2018 Epoch:9622

Choose file The-3-rhinos_in-vad1.jpg

Upload





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1. Challenge we are trying to address
2. Background/timeline of the project
3. Long-term goals
4. **Progress towards long-term goals**
5. Questions

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5. **Questions**

Thanks!



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