

Thermal imaging: From Planck's law to ADAS performance improvement

Autosens USA 2024 Tutorial session

Thermal imaging: From Planck's law to ADAS performance improvement - Gabriel JOBERT

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Gabriel JOBERT

Application Engineer, PhD. Application Lab LYNRED

Tutorial educational goals:

- Identifying the use cases where system performance is improved by Thermal Imaging
- Pre-design a system fitted to the use cases: resolution, FOV
- Understand the key FOM of Thermal Imaging
- Settle and use a Thermal Camera

Have you other goals or expectation?

Thermal imaging is a proven technology used since decades in many markets as defense, industry or security. For ADAS it is gaining interest at a fast rate due to complementarity in advanced conditions with established sensor technologies. However, thermal imaging remains perceived as an expensive and niche technology. In this tutorial, Lynred a global leader in the thermal imaging sensor market will demystify it and will give you the keys to design your own system.

After a landscape of thermal imaging applications and position with current sensing technologies, you will learn the building blocks of a thermal camera, the physical laws to consider and metrics related. Fields will be radiometry, optics, microelectronic, Image Signal Processing, AI & fusion.

Those learnings will then be applied to estimate range detection on real use-cases like the future NHTSA PAEB rulemaking proposition or on your owns.

As a recreational ending, you will be able to manipulate a thermal camera!

Contents

- 1. Why automotive industry need other modalities?
- 2. What is infrared?
- 3. Key principles of thermal imaging
- 4. Camera performance metrics
- 5. Image processing
- 6. ADAS sensors and architecture
- 7. Camera integration in automotive
- 8. Computer vision for automotive
- 9. Lynred Display Kit Demo

Coffee break 11.15-11.45 am!

Beware! I might use the metric system

$$^{\circ}F = (^{\circ}C \times 1.8) + 32$$

1m = 3.281 ft

1 km/h = 0.62 mph

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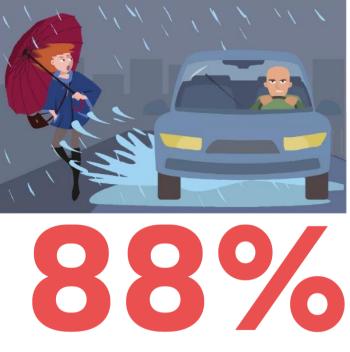
Why automotive industry need other modalities?

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Global Status Report On Road Safety 2018







of pedestrian travel is on 1- or 2 - star roads

> No sidewalk No safe crossing, No street light 60 km/h traffic

Source: WHO

Pedestrians fatalities happens in low visibility conditions...

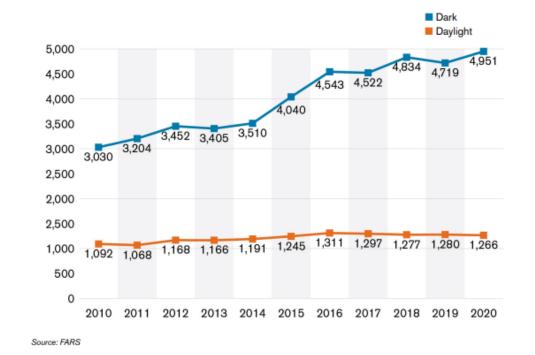


Pedestrian fatalities on Advanced light and/or Advanced weather conditions:

80% in the US70% in Europe







Pedestrian safety features Fails in deadliest situations

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EU objectives and US rulemaking proposition



EU Vision Zero ambitions to reduce by half the number of fatalities by 2030 and approach Zero by 2050

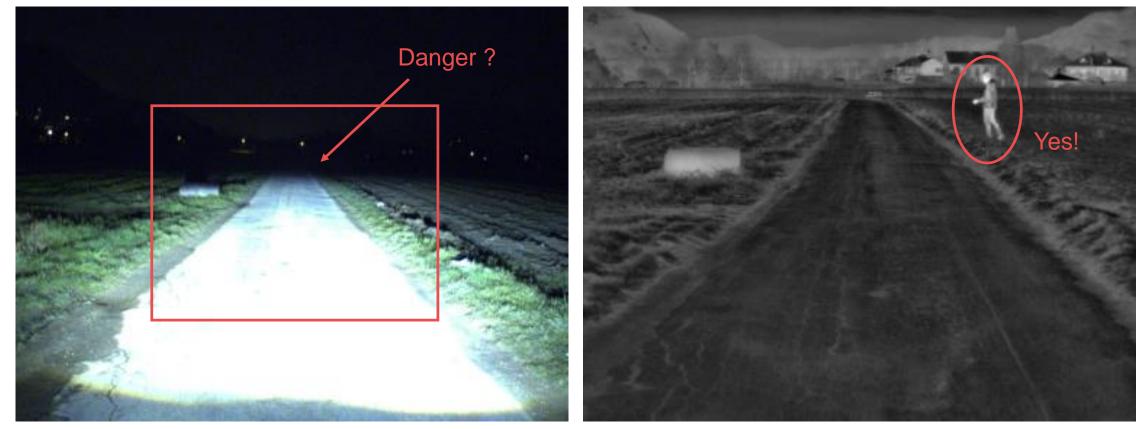
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Example: Driving at night

Country side road without streetlight, Night without moon, Clear wheather, 7.2°C, 93.4%RH



Xenon low-beam according to ECE-R98

Night vision with thermal imaging !

What's infrared ?

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85% EXPORT



> 2 MILLION DETECTORS SHIPPED SINCE 1986



15% OF SALES INVESTED IN **R&D**



FULL INFRARED SPECTRUM COVERAGE



> 133 PATENT FAMILIES > 680 PATENT FILED



STRONG PARTNERSHIPS CEA LETI – ONERA – III-V LAB



















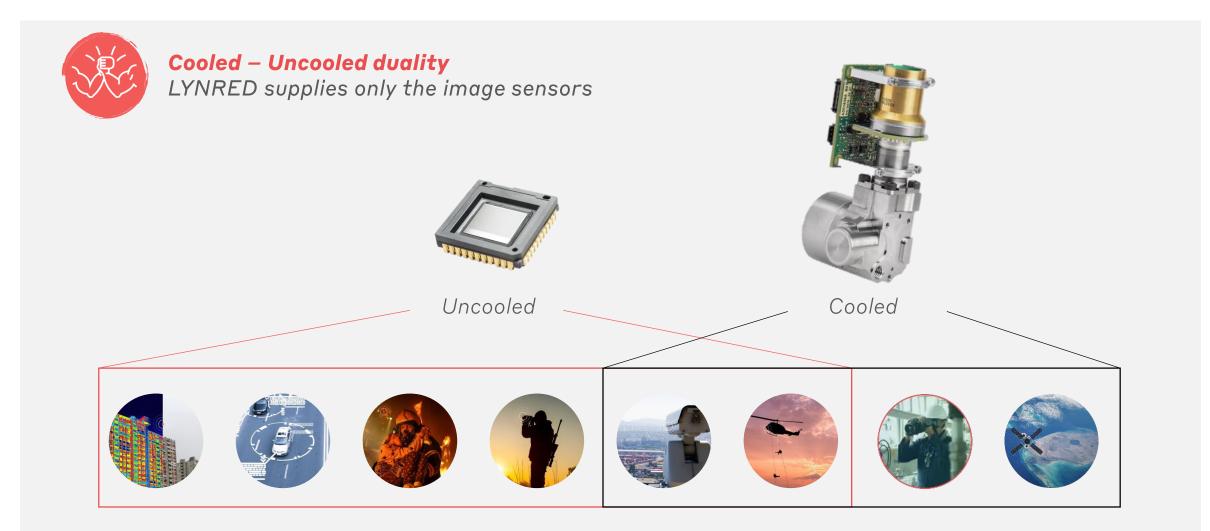




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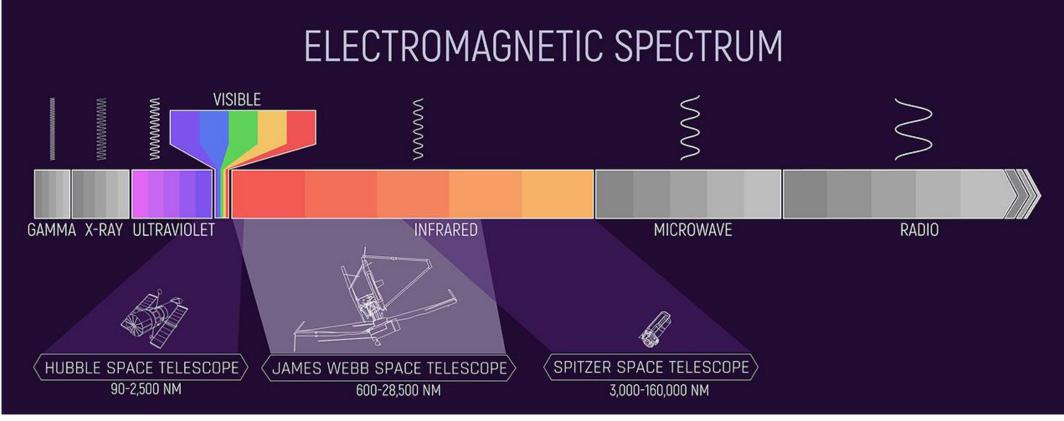
in designing and manufacturing high quality infrared imagers.

A DUAL OFFER ENSURING SOVEREIGNTY



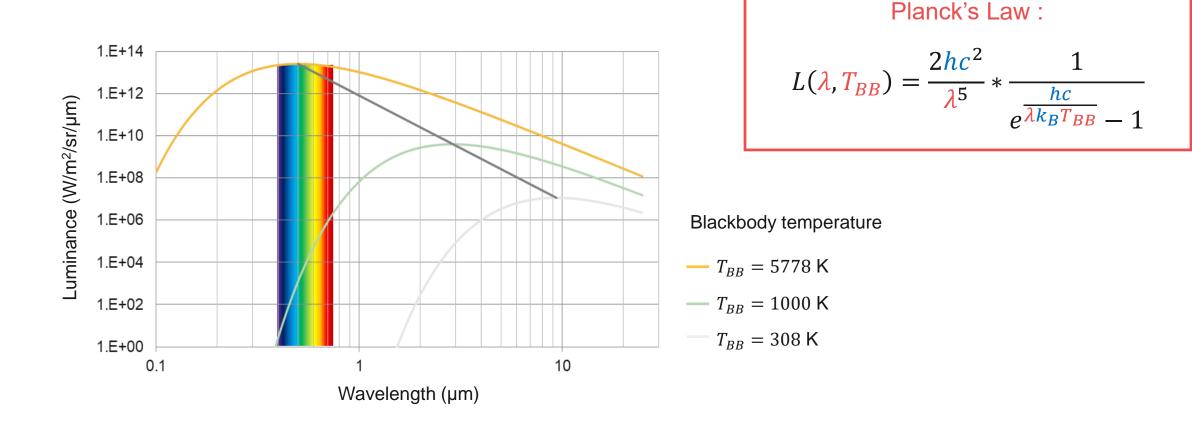
Electromagnetic spectrum

Infrared : Wavelengths between 0.7µm and 100µm



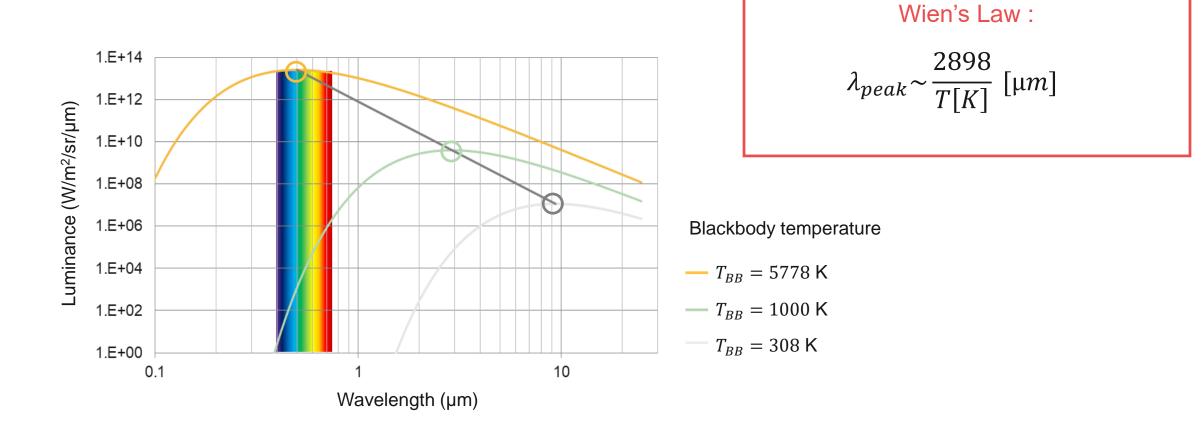
Blackbody radiation : Planck's law

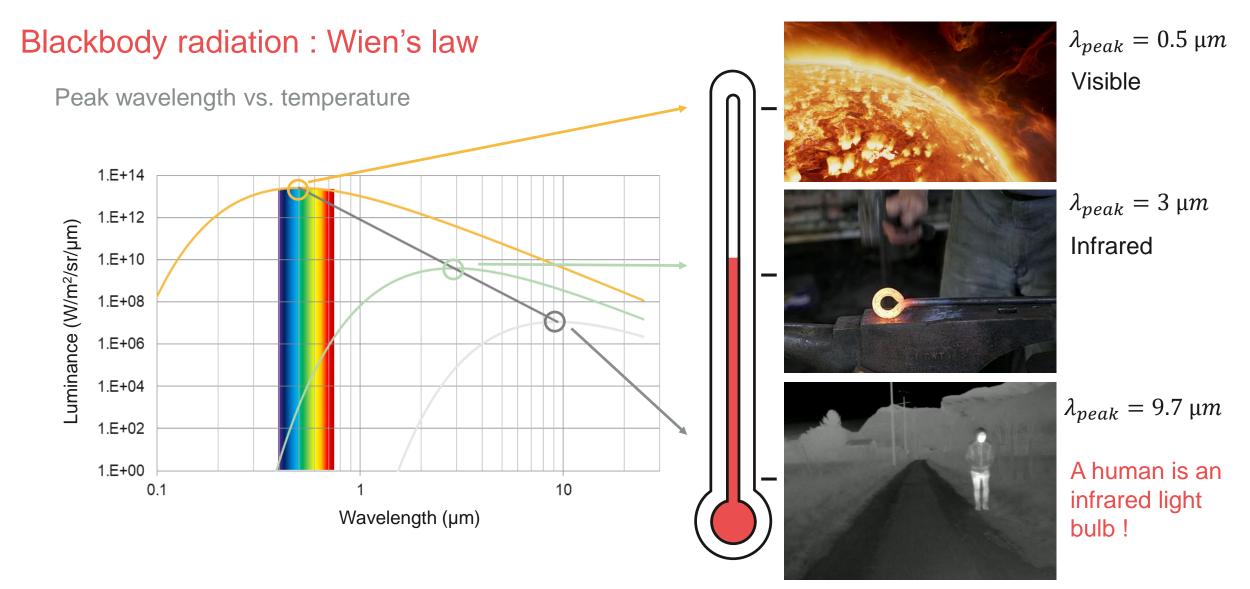
Luminance spectrum depends on the temperature



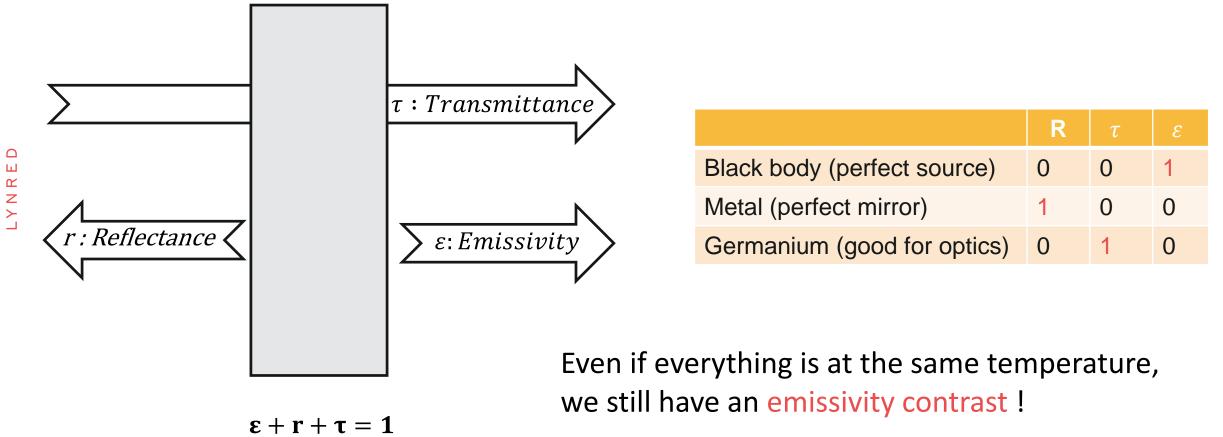
Blackbody radiation : Wien's law

Peak wavelength vs. temperature

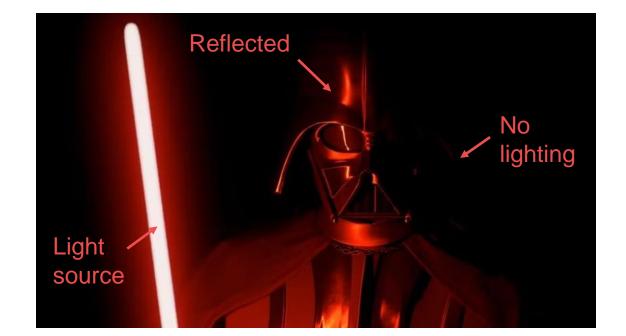




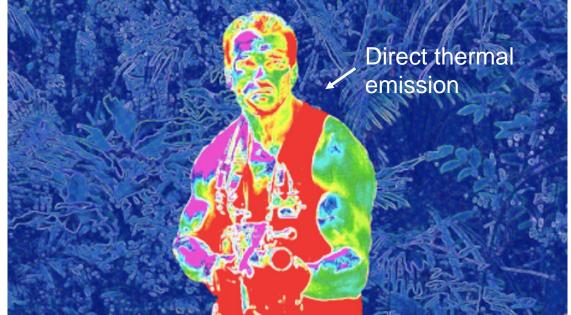
Emissivity, transmission & reflexion



Reflection or thermal emission?

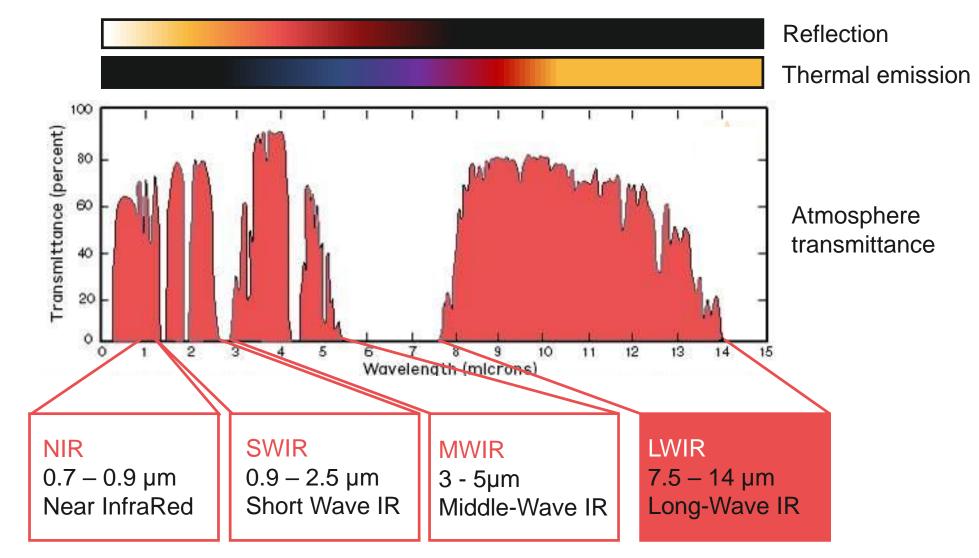


Reflection from external light source → Active imaging

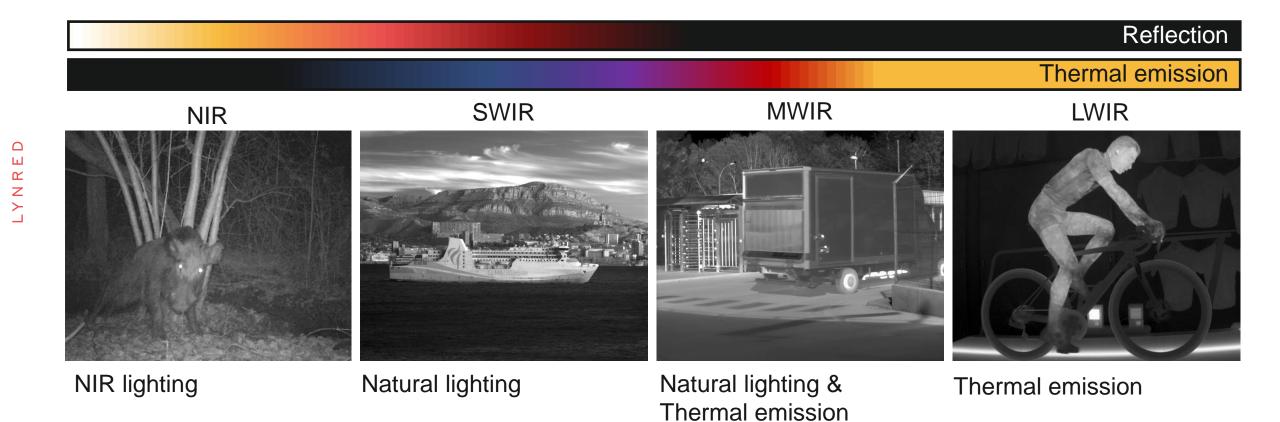


Direct thermal emission
→ No light source needed
→ Passive imaging

InfraRed bands



InfraRed bands : image examples



QUIZZ : SWIR? MWIR ? LWIR ?



Answer: MWIR !

Sensor : Daphnis HD

QUIZZ : SWIR? MWIR ? LWIR ?



Answer: LWIR !

Sensor : ATTO1280

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QUIZZ : SWIR? MWIR ? LWIR ?



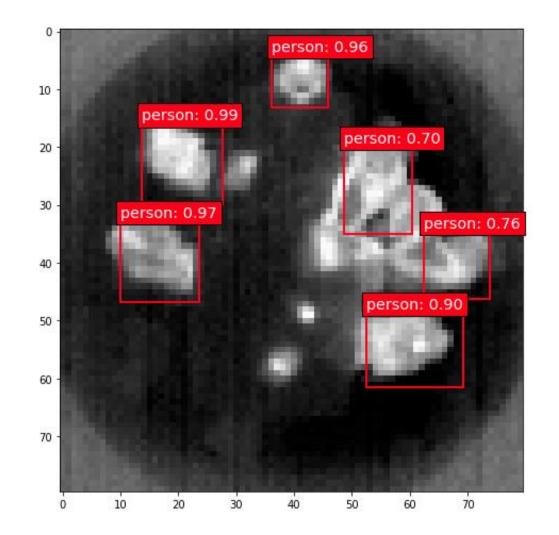
Answer: SWIR !

Sensor : SNAKE

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QUIZZ: SWIR? MWIR? LWIR ?



Answer: LWIR !

Sensor : MICRO80

Inexpensive, low resolution thermal imaging could be used for Child Presence Detection

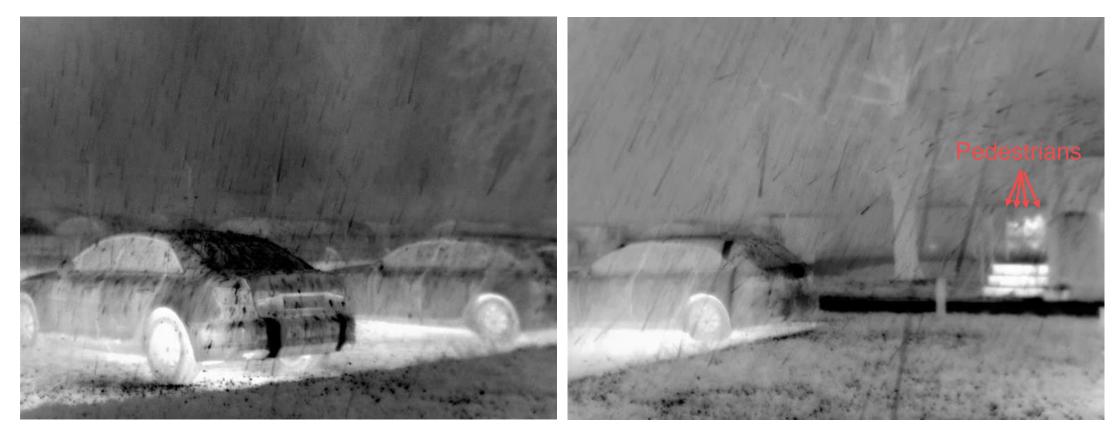
Light scattering

Smoke bomb Light scattering is ineffective in LWIR compared to visible, due to the longer wavelength



Heavy rain & hailstrom

The worst conditions to experience...

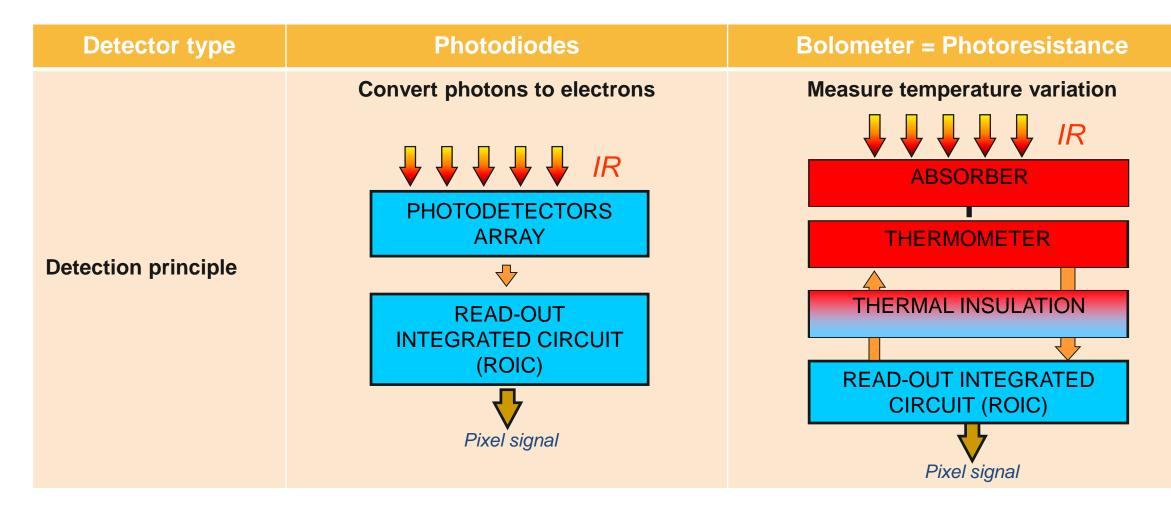


Key principles of thermal imaging

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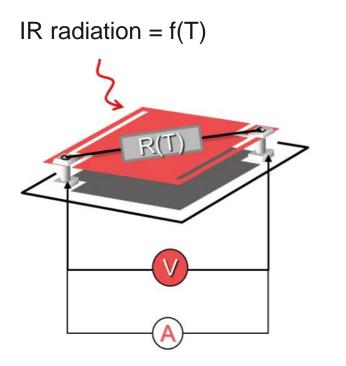
2 main detection types



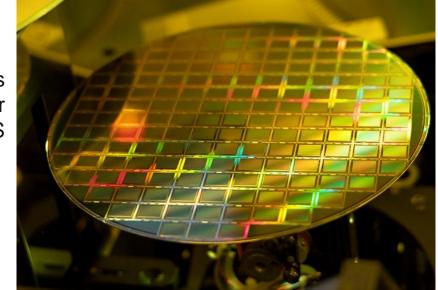
A microbolometer array provides an image with pixel values, like any camera

Microbolometer arrays : Uncooled thermal imaging

Cost effective thermal image sensors



Bolometers arrays chips in a 200mm wafer CMOS & MEMS



Thermo-resistance measurement A bolometer is basically a thermometer

Thermal night-vision : from military to civilian applications

SWaP-C : Size, Weight, Power, Cost



Sophie Optima @Thales



TELOS @PulsarNV

Lynred microbolometers product porfolio

80×80	QVGA	VGA	XGA	SXGA
<mark>M80-044</mark> 80 x 80 − 34µm	ATTO320 320x240 - 12μm PICO384 GEN2 384x288 - 17μm	ΑΤΤΟ640 640x480 - 12μm ΡΙϹΟ640 GEN2 640x480 - 17μm	ATTO1024 1024x768 - 12μm PICO1024-048 1024x768 - 17μm	ΑΤΤΟ1280 1280x1024 - 12μm

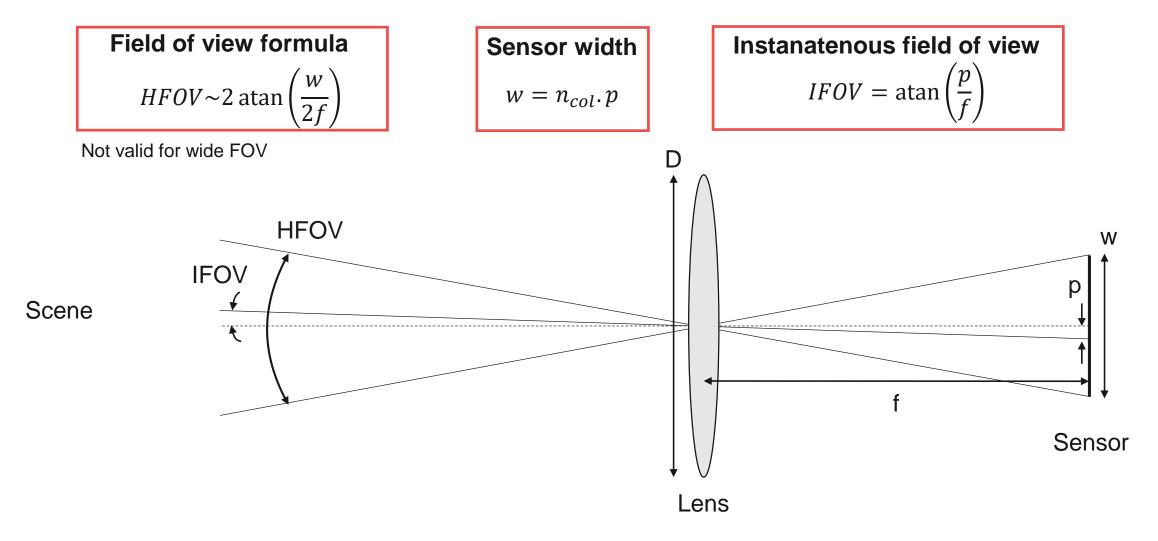
Same lens, different image formats

Format	Array size	MPixels	Camera power [W]
SXGA	1280 x 1024	1.3	4
VGA	640 x 480	0.3	1
QVGA	320 x 240	0.08	0.4

Bigger format gives more context information



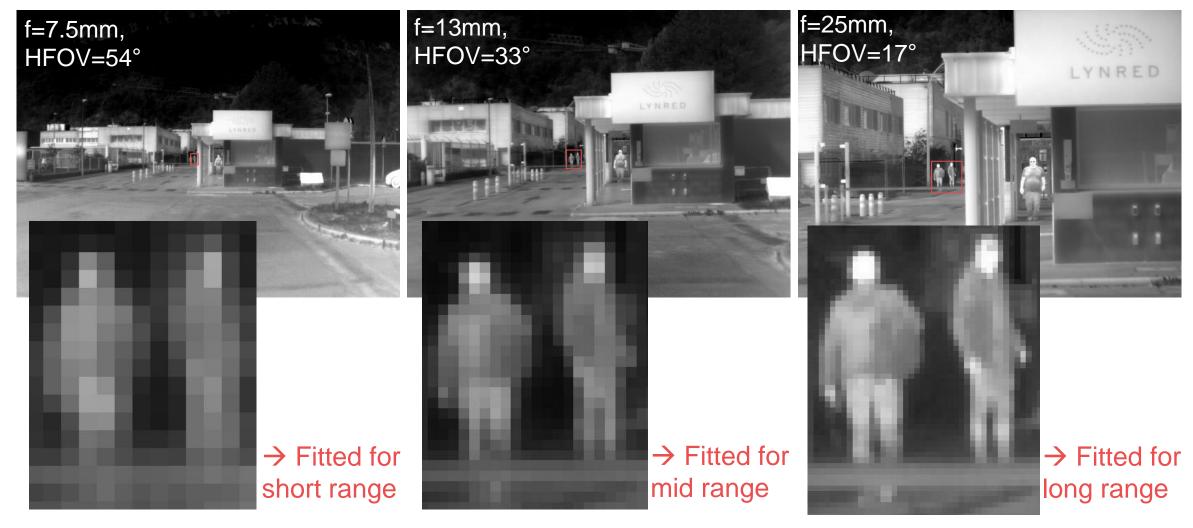
Field of view & resolution



Focal length, on same sensor

(ATTO640, 640x480 @12µm pitch)

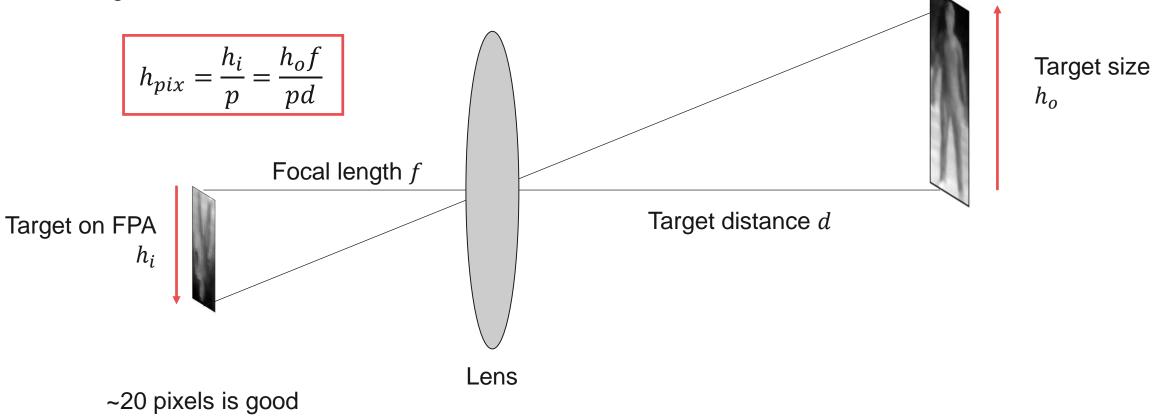
Pedestrians at 70m



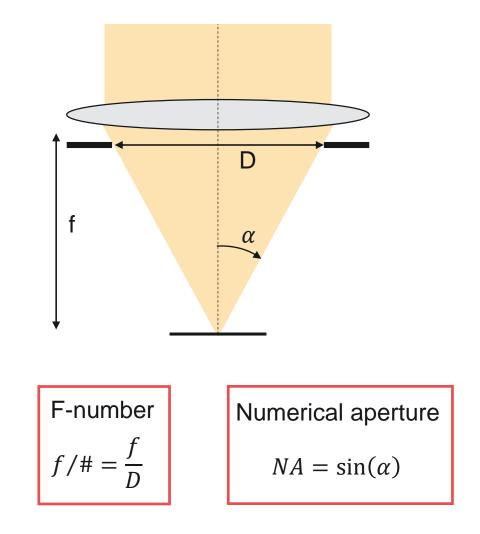
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Your use case

Pixel on target method

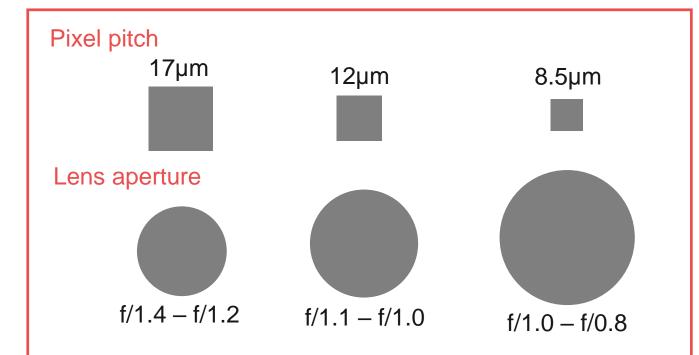


Lens aperture (f-number)



Aperture is equivalent to the energy gathered by the optic: « photon funnel » The lower number, the higher energy collected

Recommendations:



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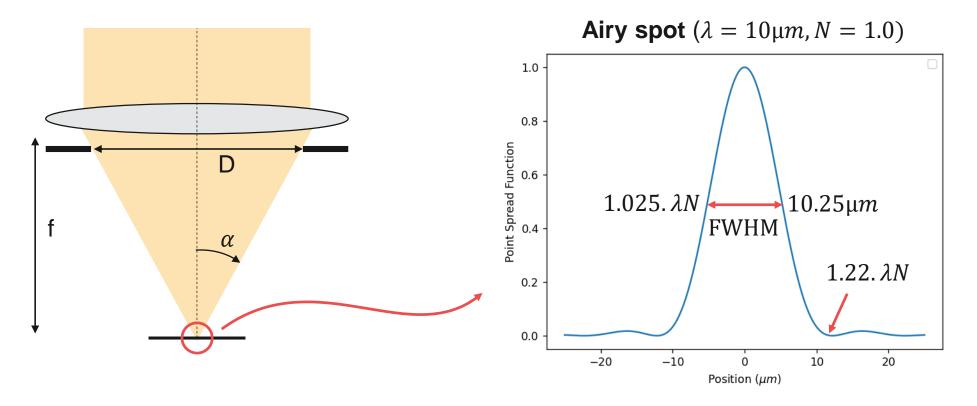
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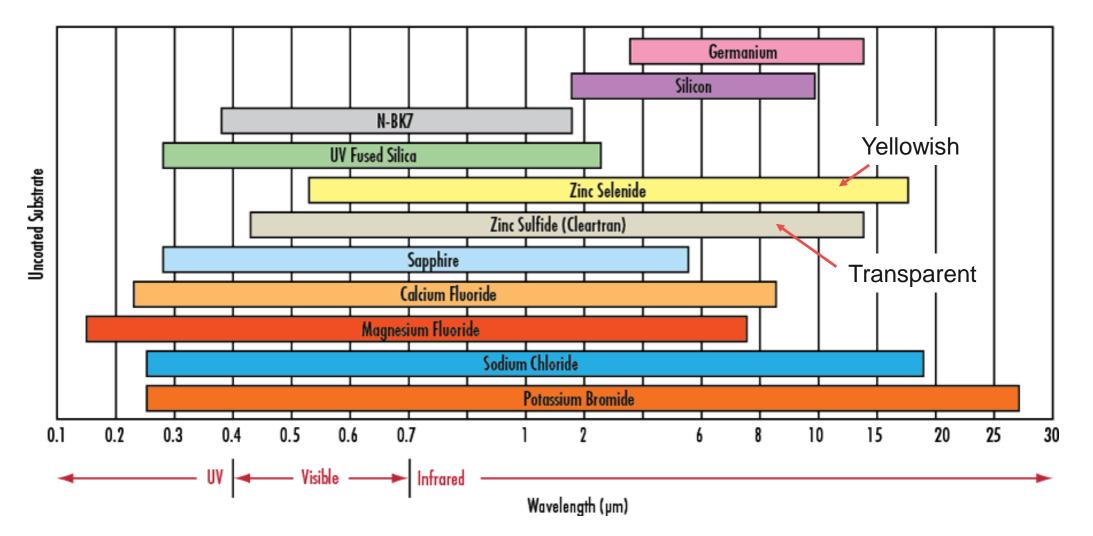
Point Spread Function : diffraction limit



 \rightarrow The diffraction spot (blur) is comparable with the pixel's pitch



Infrared materials



Infrared materials: Germanium vs. Chalcogenide glasses

Germanium has is the best know material for LWIR optics thanks to its long history, high refractive index and low optical dispersion. The production process is more expensive though.

Chalcogenide glass, such as Umicore GASIR®, is the material of choice for high volume thermal sensing applications thanks to lower production cost and moldability.

Name	Composition	λ Range (µm)	Refr. index @10µm		
Germanium (crystalline)	Ge	1.8-14	4.004		
GASIR-2 / IRG25 / IG5 / BD-2	$Ge_{28}Sb_{12}Se_{60}$	1.0-12	2.602		
GASIR-5 / IRG26 / IG6 / BD-6	As ₄₀ Se ₆₀	1.0-14	2.770		
NRL4 / BDNL4	Not available	1.0-15.5	2.636		
(A few among many) Negative thermal expansion coefficient					

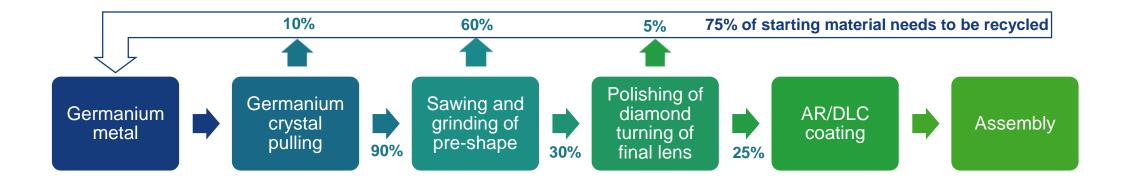
Good for athermal lenses

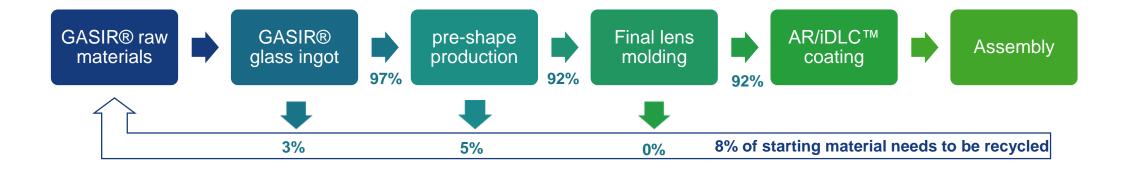


RED



Germanium vs. Chalcogenide manufacturing







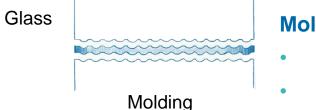
Cost Reductions driven by Technology Roadmap

2m – 10m units per year enables different technology routes



Material

- Technology improvements to glass manufacture
- Technology improvements to pre-shape process



Molding

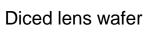
- Improved tooling
- Automation of load/unload



Coating

Coated wafer





Coated Lansasembly



Larger coating chambers with improved tooling

- "Pick and place" assembly automation
- Dedicated fast test station with automated load/unload

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Lenses

Umicore Tessella™

Wafer molding technology

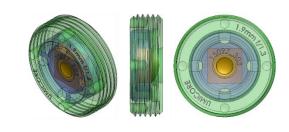
An enabling technology for high-volume, cost-effective thermal optics

Advantages

- Optimum number of lenses per molding shot
- Highest number of lenses in the coating chamber
- Reduced handling costs

Important to note

- Limited to small size optics < 4mm</p>
- Tooling investment cost

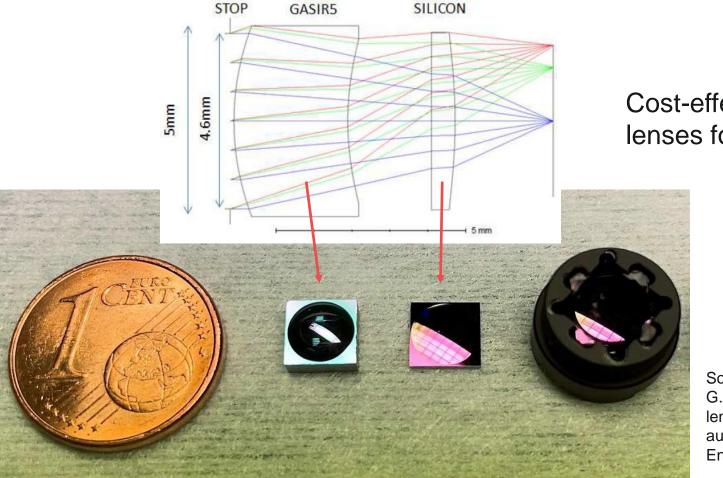






Wafer level optics (WLO)

Umicore Tessella™

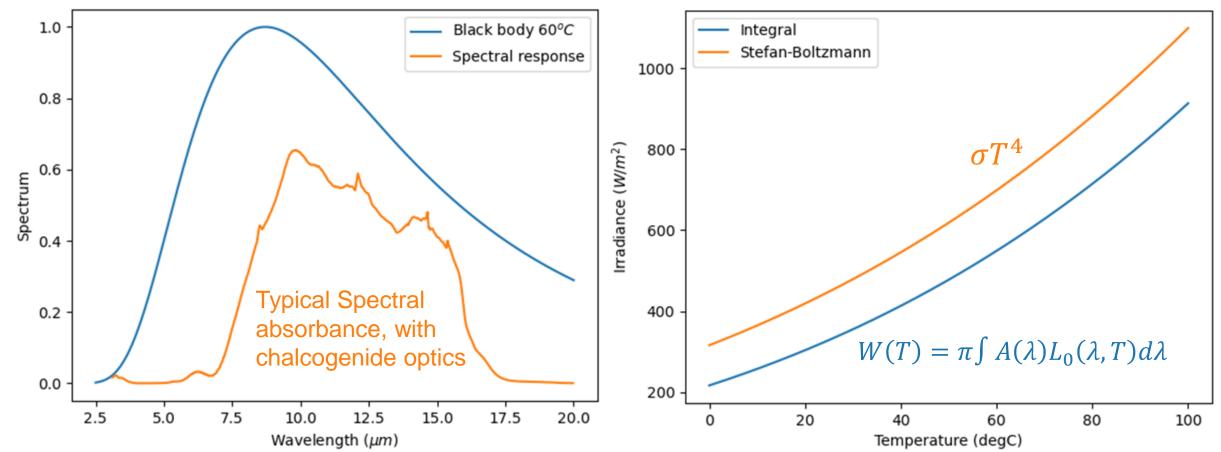


Cost-effective infrared lenses for small sensors

Source:

G. Druart et al., Study of infrared hybrid Chalcogenide Silicon lenses compatible with wafer-level manufactuing process for automotive application, SPIR Optical Design and Engineering VIII, 2021



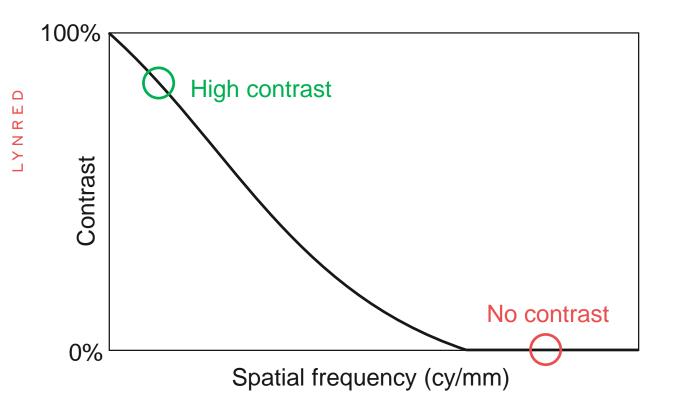


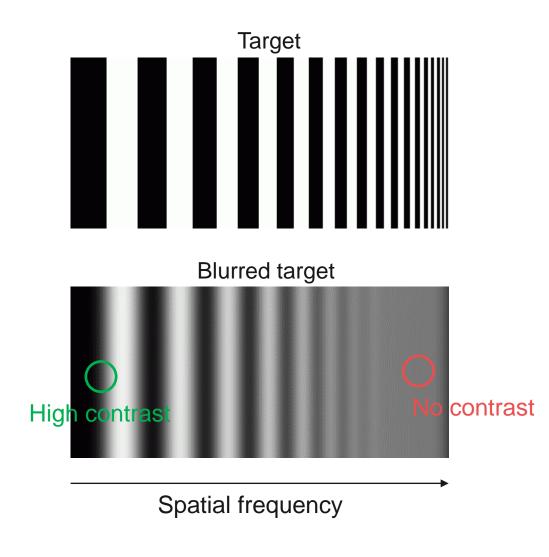
Camera performance metrics

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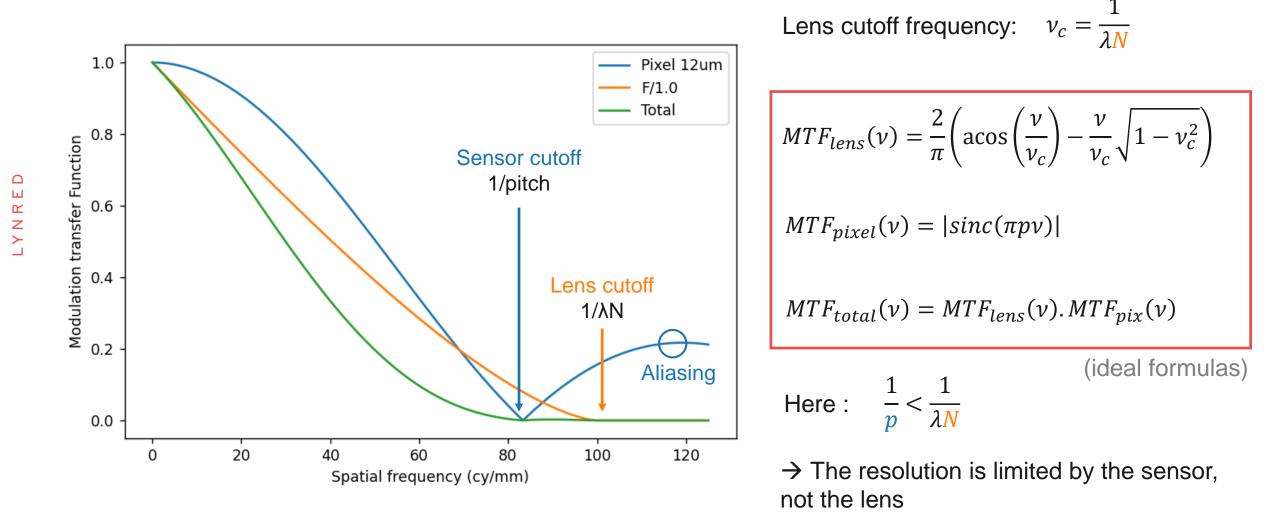
Modulation Transfer Function (MTF)

Represents the ability the resolve fine details MTF is the Fourier transform of the PSF





MTF of an optronic system



What's limiting the resolution ? Lens or pixel ?

Pixelated









The resolution is limited by the lens's diffraction → Oversampled

 $\frac{1}{p} < \frac{1}{\lambda N}$

The resolution is limited by the sensor, the image is aliased → Undersampled The lens is a perfect antialiasing filter → Well sampled

 $\frac{-}{p} \approx \frac{-}{\lambda N}$

Responsivity

Expresses the camera's sensitivity to temperature variation

We take two averaged uniform images in front of a blackbody : Hot & Cold

 $Resp[LSB/K] = \frac{\overline{Img}(T_2) - \overline{Img}(T_1)}{T_2 - T_1}$



Blackbody @HGH

Responsivity depends on :

- Sensor (e.g. pixel pitch)
- FPA temperature
- Lens aperture (f/#)
- Optics/window transmission
- Camera settings

Noise Equivalent Temperature Difference (NETD)

Expresses the camera's ability to distinguish small temperature differences Equivalent to SNR=1

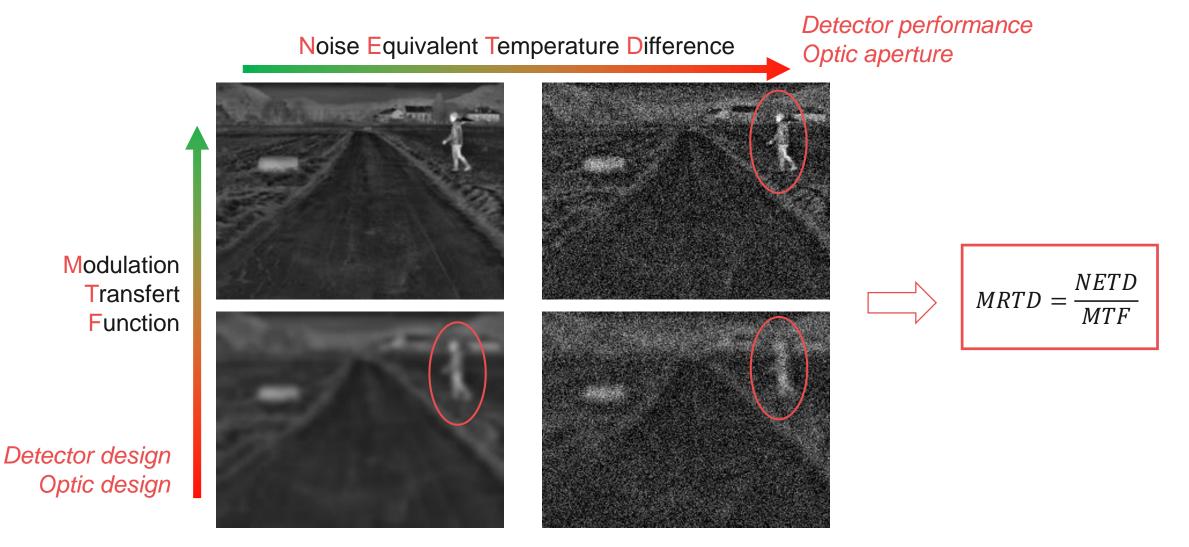
 $\sigma[LSB]$ NETD[mK] =

Temporal standard deviation of a unform scene (blackbody)

Typical values:

- ATTO640D-02 sensor : <50mK
- ATTO640 camera with optics : ~60mK

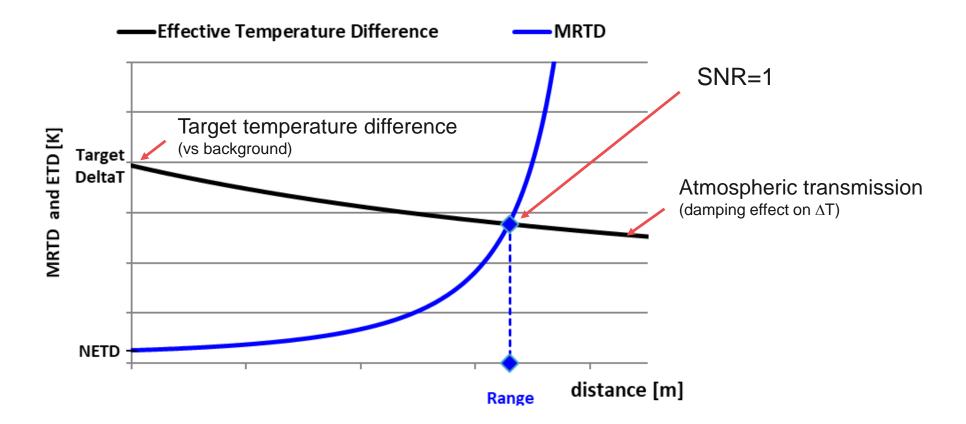
Minimal Resolvable Temperature Difference (MRTD)



Range simulation

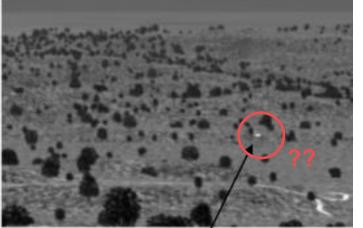
Range: distance where SNR=1

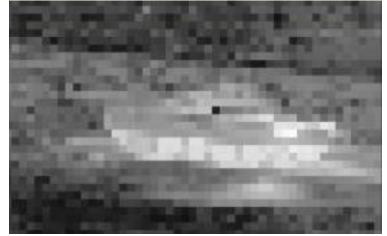
ETD : Effective Temperature Difference



DRI : Johnson criteria

Let's borrow tools from the military !



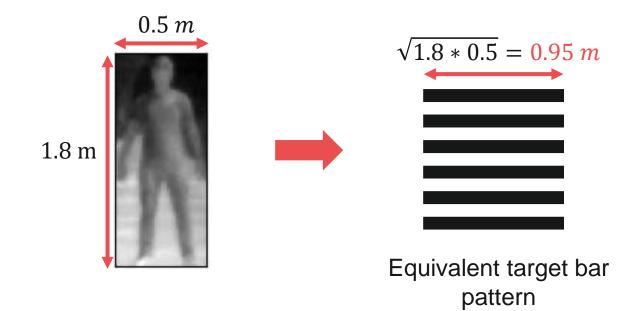




Detection: I can see something

Recognition: I know it's a tank Identification: I understand if he's an enemy or not

DRI range for a human

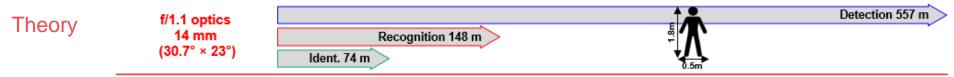


Criteria for 50% probability:

- Detection = 0.75 cycles
- Recognition = 3 cycles
- Identification = 6 cycles

DRI range estimation

DRI ranges for Johnson's criteria (70% probability) for human (0.5×1.8m) with ATTO640-02 (12µm pitch VGA microbolometer detector)



Ranges for Mid Lat. Summer Urban, visi 5km, f/1.1 optics with 80% transmission and Perfect OTF

Hot summer ΔT=0.5°C temperature difference*



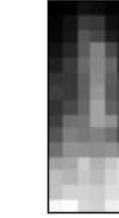




Identification

70m

Recognition





*It really depends on both the target and background texture !

Image processing

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Non Uniformity Correction (NUC)

□ Removes the fixed pattern noise (FPN) due to the pixels response dispersion

 $I_{corr} = G(Raw - O) -$

Gain and offset map are obtained during the **factory calibration** Depends on sensor's temperature



NUC

NB: A mechanical shutter can be used to update the Offset map when the sensor's temperature drifts, The stream is interrupted during the aquisition of the new reference (shutter closed)



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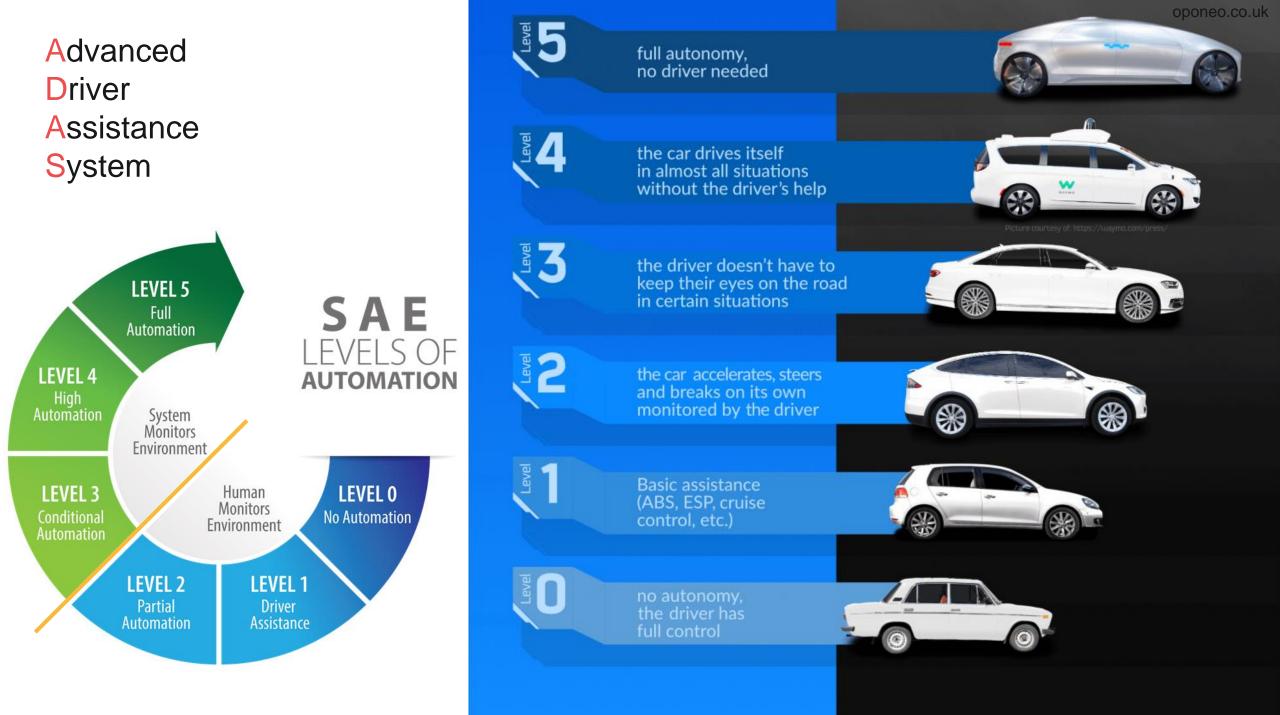
Tone-Mapping (or Automatic Gain Control, AGC)

Display full thermal dynamics (+200°C) from 16bits to a displayable image in 8its grayscale Like an HDR algorithm



ADAS sensors and architecture

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Autonomous vehicle architecture

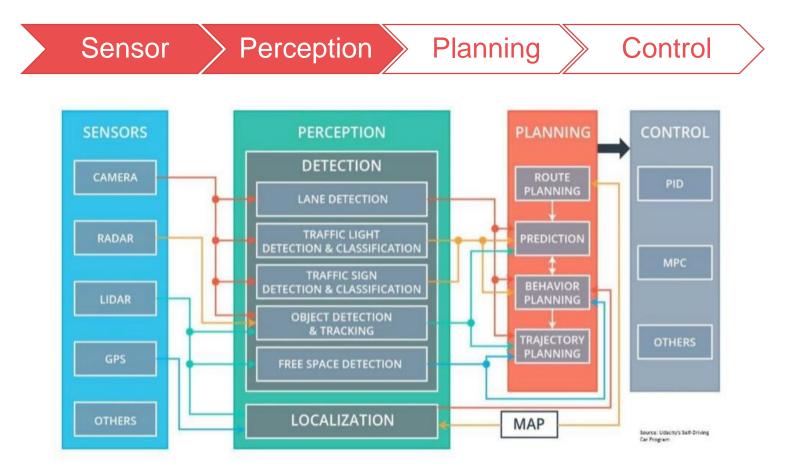


Figure 1: Autonomous vehicle functionality breakdown. Source: Udacity Self-driving Program.

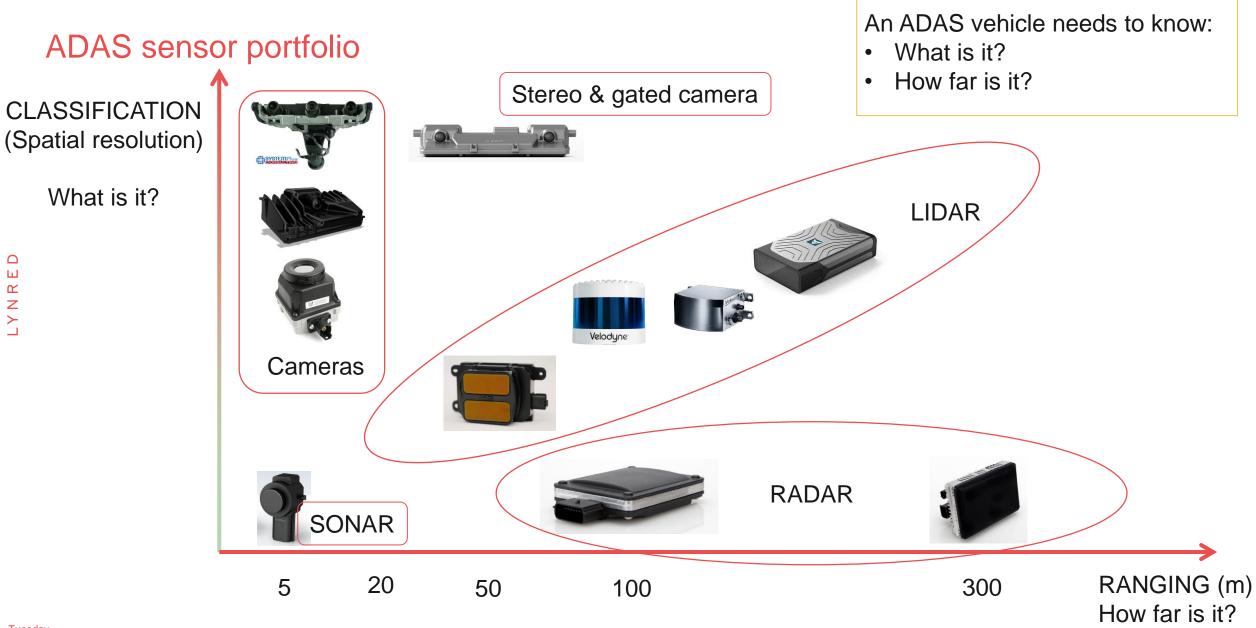
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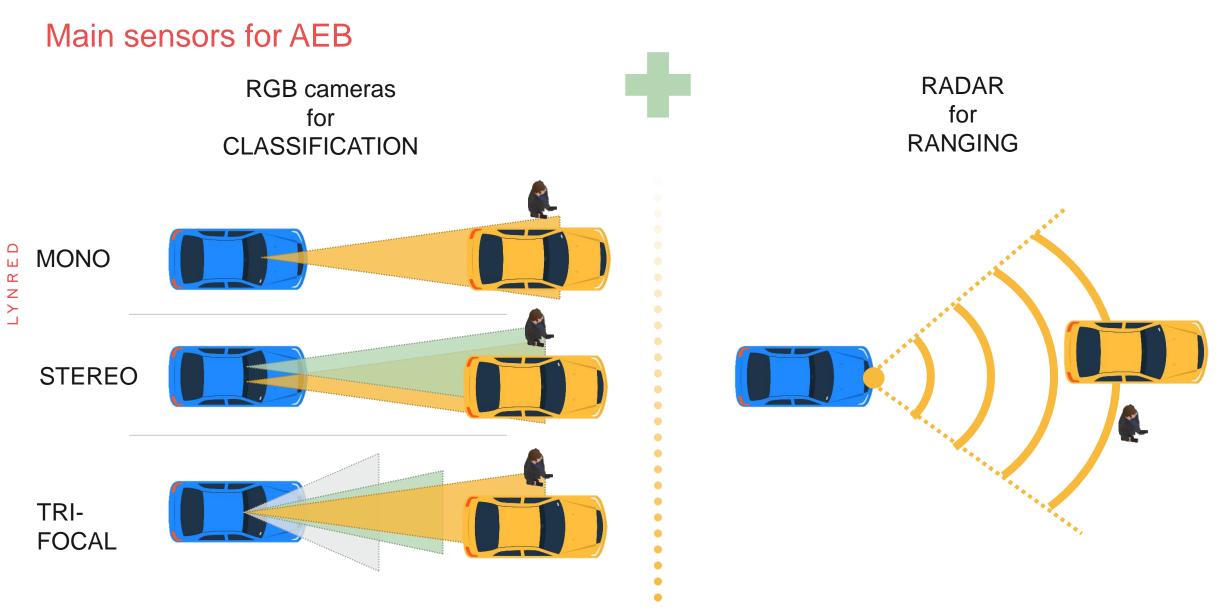
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Source: Udacity, Boeing

Sensors playground for ADAS

Wave type	Electro-magnetic					Acoustic
Band	VISIBLE	NIR 905 nm	SWIR 1550nm	LWIR	Micro wave 24 & 77 GHz	Ultrasound 58 KHz
Sensor	CMOS Image Sen	sor (CIS)	InGaAs or CQD	Bolometer	GaAs sensors	Ultrasonic sensor
Passive application	Camera, (Mono, S	tereo, Triple)	Camera	Camera (Mono, Stereo)		
Active application	Gated camera, LI	DAR			RADAR	SONAR

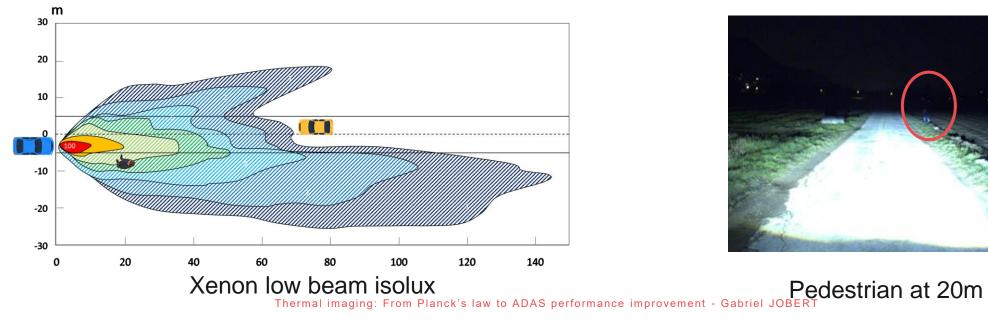




Current AEB sensors limitations

Sensor	Limitation	Examples		
RGB camera	Low light	Night: rely on streetlight		
	High Dynamic Range	Vehicle glaring, tunnel exit, sunrise/set		
	Adverse conditions	Rain, snow, fog		
RADAR	Spatial resolution	Pedestrian in front of a car		

RGB camera is not reliable in reduced visibility where fatalities happens





Thermal is complementary to RGB

Grenoble city at dusk



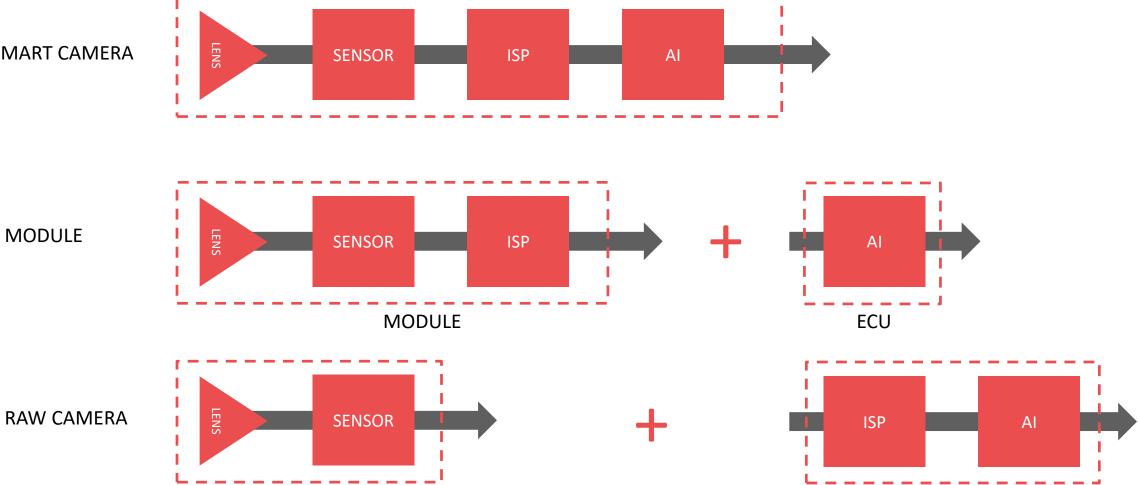


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Architecture – 3 options

ISP : image quality AI: Artificial intelligence ECU: Electronic control unit

SMART CAMERA



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SENSOR

ECU

WWW.LYNRED.COM

Camera integration in automotive

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Lynred Automotive Development Kit (ADK)



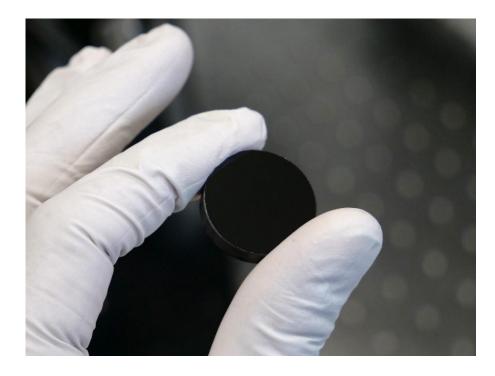
Not for sale. Only available under NDA and Loan Agreement with Lynred

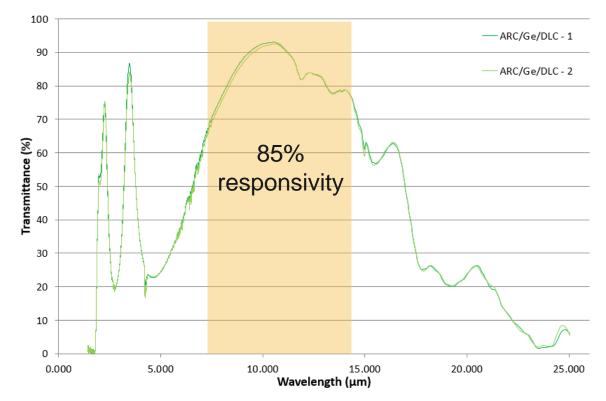
Water proof casing Infrared Window Heating/Defrosting (12V compatible)

VGA 12µm, USB camera Available lenses:

- 14mm f/1.0 → HFOV 31°
- 8.8mm f/1.0 \rightarrow HFOV 50°
- 6.2mm f/1.0 → HFOV 75°

Infrared Window





DLC : Diamond-Like Carbon coating Resistance to severe abrasion (MIL-C-675C military specifications) Black aspect

Windshield integration



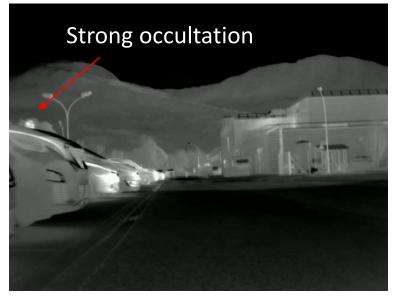


Come visit our booth !

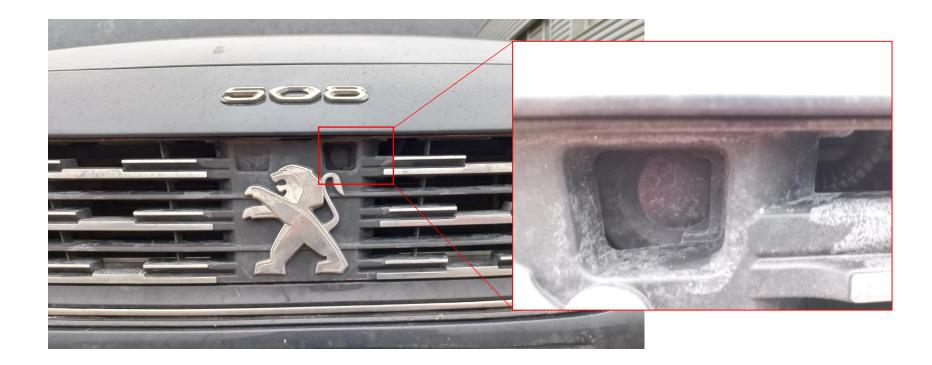
Lynred x Sekurit







Bumper or windshield ? Soiling



The bumper is not quite the cleanest place to put a camera

Impact of droplets

Visible image is distorded by



SEKURIT

GLAZING IN MOTION

Thermal still performs well even with droplets on the window

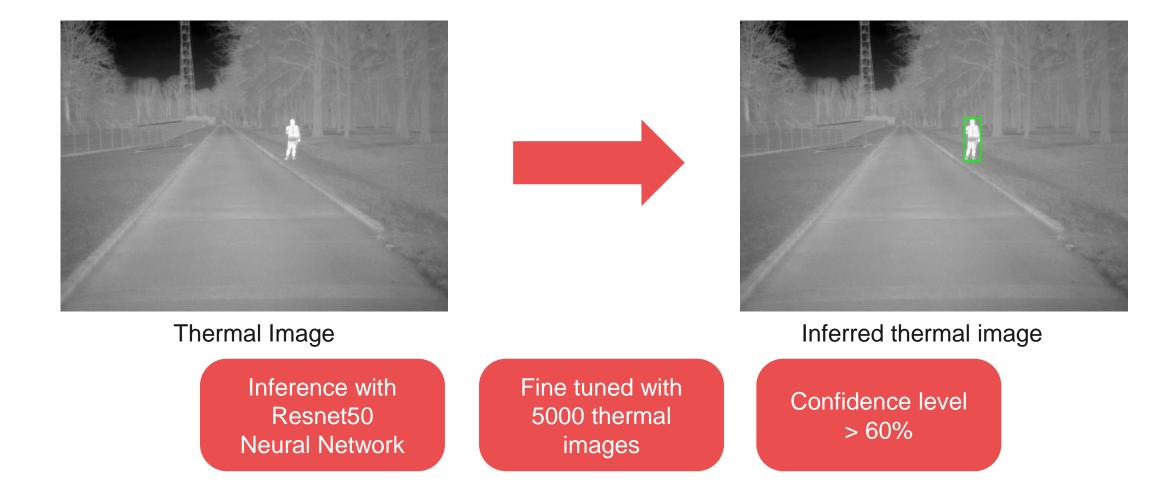


Computer vision for automotive

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Trouver le lien public de la publi JRC

Inferrence of thermal images



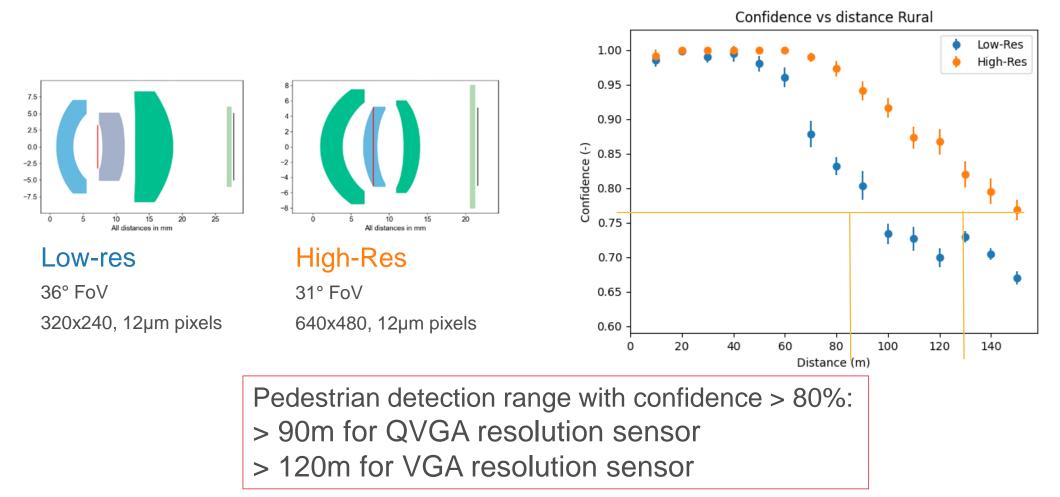
Source:

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Dona R. et al., On the Assessment of Thermal Cameras and their Safety Implications for Pedestrian Protection: a mixed Empirical and Simulation-based characterization, Joint Research Center, Transportation Research Record, 2024

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Pedestrial detection range, this time using AI

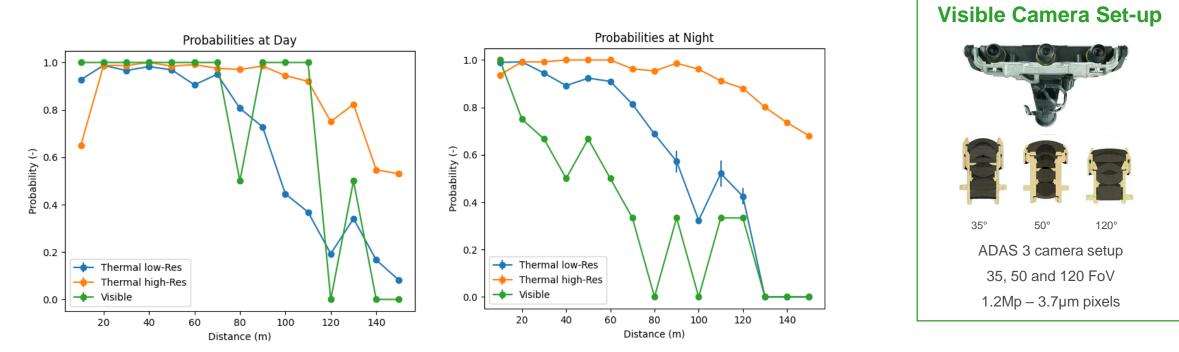


Source:

Dona R. et al., On the Assessment of Thermal Cameras and their Safety Implications for Pedestrian Protection: a mixed Empirical and Simulation-based characterization, Joint Research Center, Transportation Research Record, 2024

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Pedestrian detection vs lighting conditions for thermal and visible cameras



- ✓ Detection probability is **identical** whatever the **lighting conditions** for **thermal cameras**
- ✓ Detection probability drops dramatically when lighting conditions are degraded for visible camera

Combining Visible and Thermal camera would extend AEB daytime performances to nightime conditions

Source:

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Dona R. et al., On the Assessment of Thermal Cameras and their Safety Implications for Pedestrian Protection: a mixed Empirical and Simulation-based characterization, Joint Research Center, Transportation Research Record, 2024

Tuesday 21st May

Next generation of small pixel pitch : 8.5µm



Footage taken with : - VGA 8.5µm sensor - Lens 7.1mm, f/0.8

Prototype !

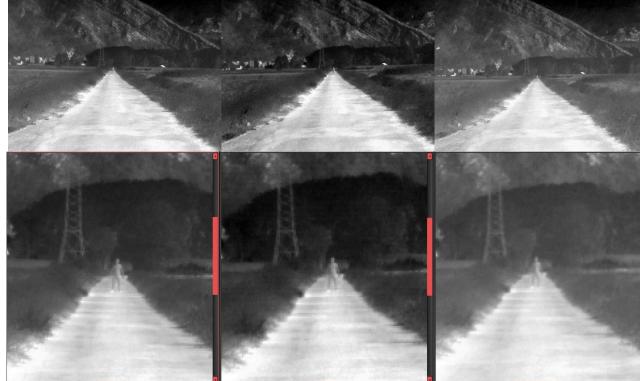
Come see the live demo on the booth !

Effect of Pixel pitch on detection range : cameras configuration

Parameter	VGA17µm	VGA12µm	VGA8.5µm
Focal Length and aperture	19mm f/1.0	14mm f/1.0	8.8mm f/1.0
Lens coating and Mean Transmission (8- 12µm)	High Efficiency AntiReflective Coating >94%	Diamond Like Carbon Coating >80%	Diamond Like Carbon Coating >80%
HFoV (°)	32	31	34
Camera NETD (mK)	33	67	91

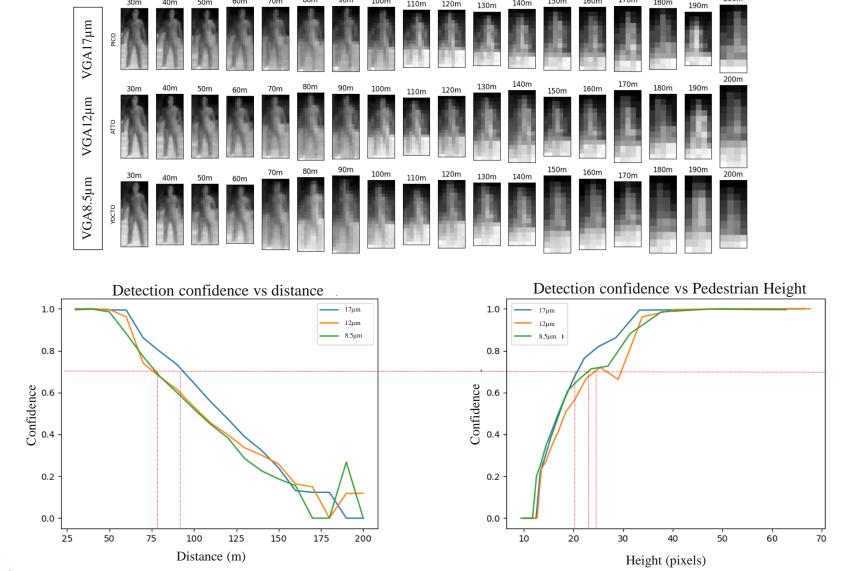
Tests parameters and conditions

- > All camera are VGA
- All cameras use f/1.0 optics
- Ambiant temperature : 28°C
- Resnet50 NN trained with
 5000 thermal images



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Thermal imaging: From Planck's law to ADAS performance improvement - Gabriel JOBERT



Effect of Pixel pitch on detection range : Results

Tests Results

- 17µm presents about 20%
 more range
- No significant degradation between 8.5µm and 12µm
- 23 pixels on target (in height) are enough to detect a pedestrian

Source:

S. Tinnes et al., Automatic Emergency Braking: How can affordable thermal camera improve reliability and extend use cases to nighttime conditions, SPIE Defense Commercial and Security, 2024

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Lynred fusion dataset

Labelled thermal Labelled visible

13k image pairs (visible/thermal) of labelled images & growing
9 classes (pedestrians, cars, buses, trucks, cyclists, motorbikes, traffic lights, traffic signs, scooter, train etc.)
Varietey of conditions (day, night, dusk, summer, winter, sunny, rain, fog)



Stereo recording setup

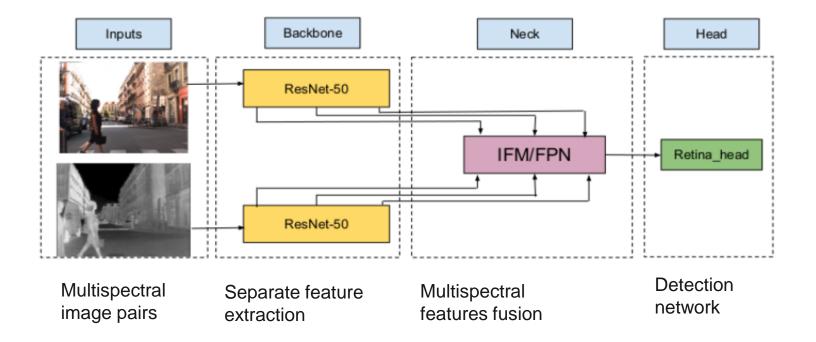
Other datasets: • KAIST: 95K images, 3 classes • FLIR: 9K images, 15 classes • CVC-14: 7K images, 1 class

 \rightarrow Still a need for more images

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IR-RGB fusion

Typical IR-RGB multimodal detection network, featuring a fusion of features from IR & RGB \rightarrow Improves the average precision in all conditions, day & night



Source : SIA Vision 2021, GMFNet: Gated Multimodal Fusion Network

Hardest conditions, but differently hard

Visibility impacted by scattering

Deep fog, and ice on windows

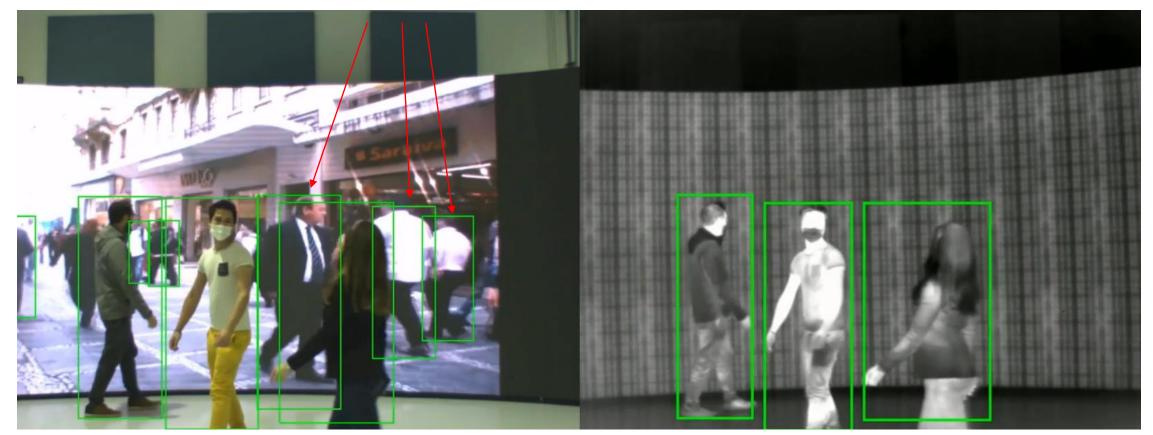
Visibility impacted by absorption

Modalities are impacted by very differents effects \rightarrow Fusion increase the robustness of detection

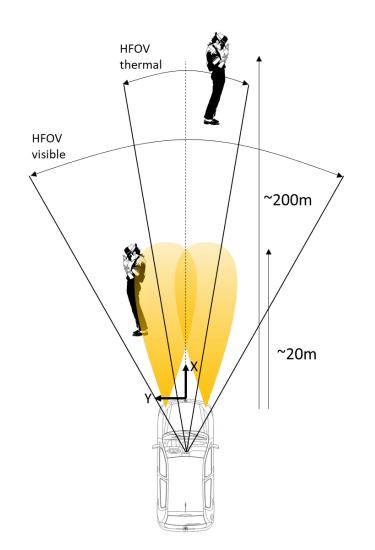
Less false positives using fusion

□ Screens, advertisements etc.

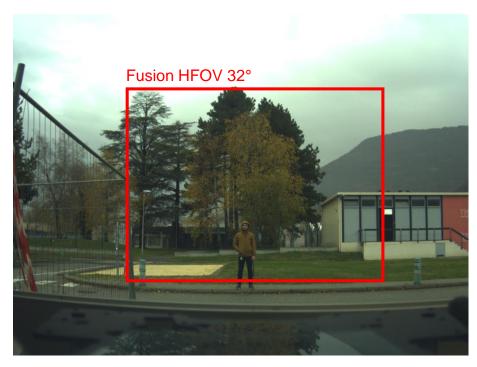
Detection from screen



Visible-IR field of views







Narrow FOV thermal camera→ Fitted for long range

Wide FOV visible camera → Fitted for short range

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Affordable thermal camera concept to reduce pedestrian fatalities

- An AEB system working day and night would require a large HFoV visible camera combined with a narrow HFoV thermal camera
- To detect a 1.8m high pedestrian over 23 pixels at 46m, a thermal camera would require an IFoV of 0.1°
- To cover a >30° HFoV, a resolution close to a QVGA with an optimized aspect ratio would be enough
- The use of **8.5µm pixel pitch** reduces the size of the FPA
- > The use of **f/1.0 optics** keeps the optics small and simple in design and integration
- > With an optic diameter of less than 5mm, Wafer Level Optics can be used to lower optic costs

Tier1s can build an AEB system based on a **<\$100 thermal camera**, that fullfils the **NHTSA requirements** for pedestrian detection in all lighting conditions