

# Composite material thermal characterization for a digital twin-based model of an automated tape-laying process

MSc. Jhonny de Sá Rodrigues

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# Introduction

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1. Introduction
  - 1.1 Automated Tape Laying Process
  - 1.2 Problem
  - 1.3 Objectives

# Introduction

## Automated Tape Laying Process

The Automated Tape Laying (ATL) Process uses prepregs to consolidate a structure

It is composed out of:

1. Material

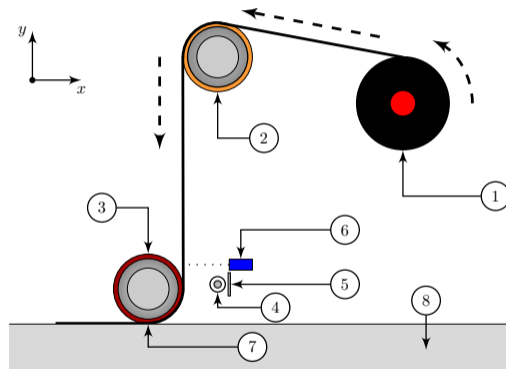


Figure 1. Process machine elements

## Introduction

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2. Guide roll

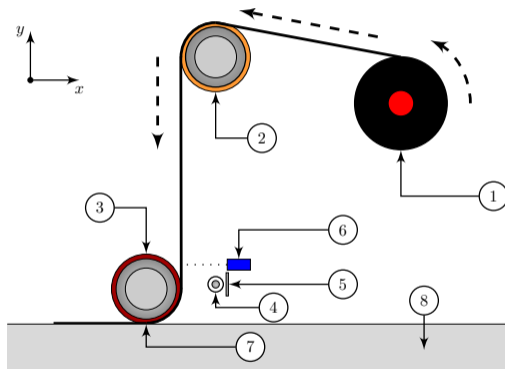


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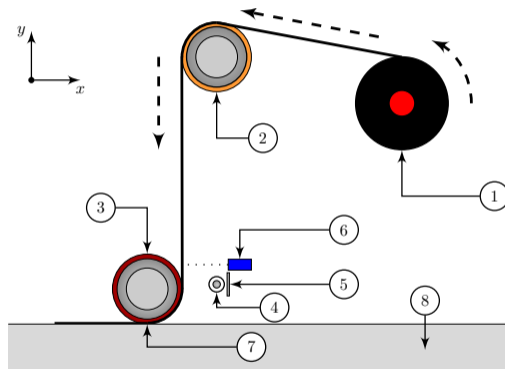


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# Introduction

## Automated Tape Laying Process

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3. Compaction roll
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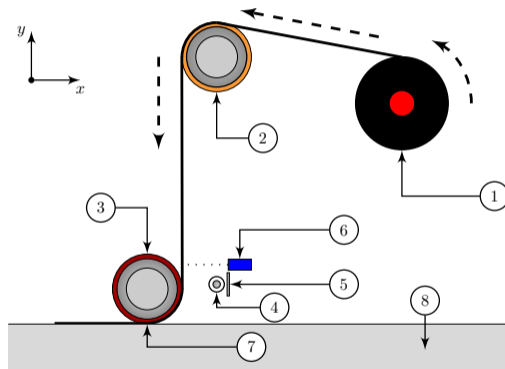


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3. Compaction roll
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5. Reflector

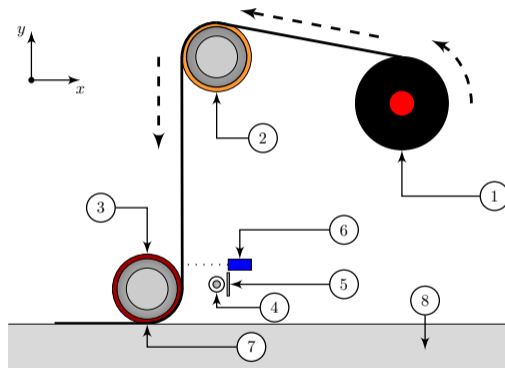


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# Introduction

## Automated Tape Laying Process

The Automated Tape Laying (ATL) Process uses prepregs to consolidate a structure

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1. Material
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3. Compaction roll
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5. Reflector
6. Temperature sensor

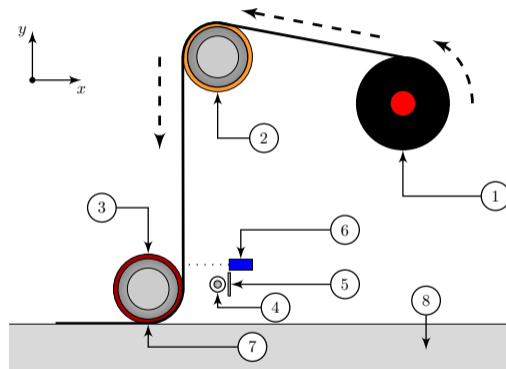


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# Introduction

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The Automated Tape Laying (ATL) Process uses prepregs to consolidate a structure

It is composed out of:

1. Material
2. Guide roll
3. Compaction roll
4. Heating element
5. Reflector
6. Temperature sensor
7. Nip point

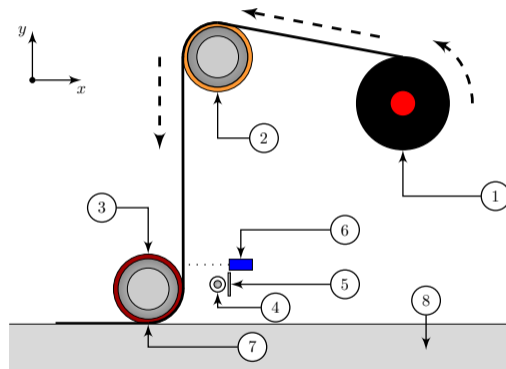


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7. Nip point
8. Mould

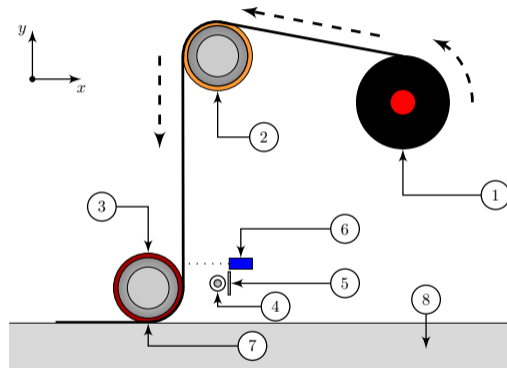


Figure 1. Process machine elements

# Introduction

## Automated Tape Laying Process

The case of study is an ATL machine located at INEGI's laboratories, Porto, Portugal

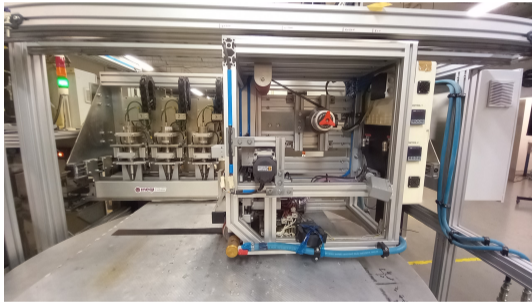


Figure 2. Real ATL process machine. Front view

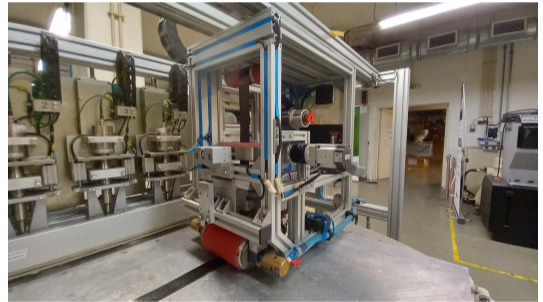


Figure 3. Real ATL process machine.



# Introduction

## Problem

- The relevant temperature is located at the **Nip Point**. Indicator 7 at Figure 4.
- **No sensor** can be placed

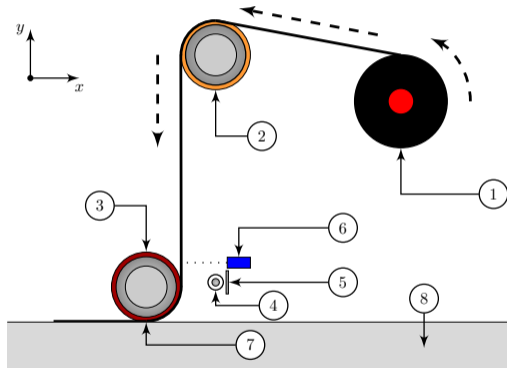


Figure 4. Process machine elements

# Introduction

## Problem

- The relevant temperature is located at the **Nip Point**. Indicator 7 at Figure 4.
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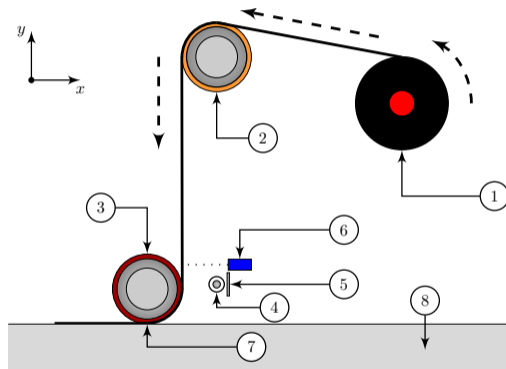


Figure 4. Process machine elements

# Introduction

## Problem

- The relevant temperature is located at the **Nip Point**. Indicator 7 at Figure 4.
- **No sensor** can be placed
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- A popper model needs to **replicate** the real process. *Digital Twin*

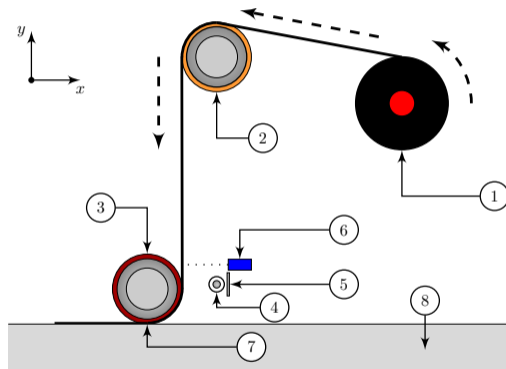


Figure 4. Process machine elements



# Introduction

## Problem

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# Digital Twin

- The model **requires knowing the thermal properties as function of temperature** for the composite material:

# Introduction

## Problem

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# Digital Twin

- The model **requires knowing the thermal properties as function of temperature** for the composite material:
  - ▶ Thermal conductivity
  - ▶ Thermal-Optical properties

# Introduction

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# Digital Twin

- The model **requires knowing the thermal properties as function of temperature** for the composite material:
  - ▶ Thermal conductivity
  - ▶ Thermal-Optical properties
  - ▶ Specific heat

# Introduction

## Problem

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Fundamental equation:

$$\begin{aligned}
 \frac{\partial}{\partial t} \int_{V_m} \rho_m \cdot c_p(T_m) \cdot T_m dV_m &= \int_{V_m} q''_{rad,m} \cdot dS_m + \int_{V_m} q''_{conv,m} \cdot dS_m + \int_{V_m} q''_{cond,m} \cdot dS_m \\
 + \int_{V_m} k_m(T_m) \cdot (\nabla T_m \cdot \hat{n}) dS_m &- \int_{V_m} \rho_m \cdot c_p(T_m) \cdot T_m \cdot (U \cdot \hat{n}) \cdot dS_m
 \end{aligned} \quad (1)$$

Radiation energy balance:

$$\begin{aligned}
 [J_{\lambda,j}] &= [r_j]_{nx1} [G_{\lambda,j}]_{n \times n} + [\tau_j]_{nx1} [G_{\lambda,j}]_{n \times n} + [\epsilon_j]_{nx1} [E_{\lambda,j}]_{n \times n} \\
 [G_{\lambda,j}] &= ([I]_{n \times n} - [F]_{n \times n} ([r_j]_{nx1} + [\tau_j]_{nx1}) [F]_{n \times n} [\epsilon_j]_{nx1} [E_{\lambda,j}]_{n \times n})^{-1} \\
 [q''_{rad,m}] &= [J_{\lambda,j}] - [G_{\lambda,j}]
 \end{aligned} \quad (2)$$

# Introduction

## Objectives

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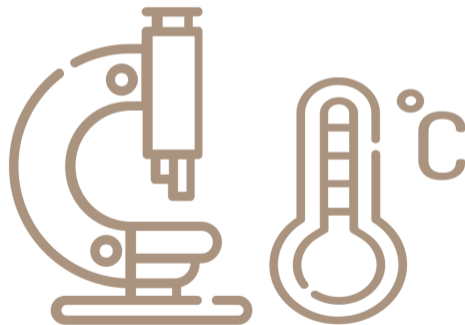
- Estimate the **temperature distribution** along the composite material including the **Nip Point**, as function of time.

# Introduction

## Objectives

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- Estimate the **temperature distribution** along the composite material including the **Nip Point**, as function of time.
- Measurements:

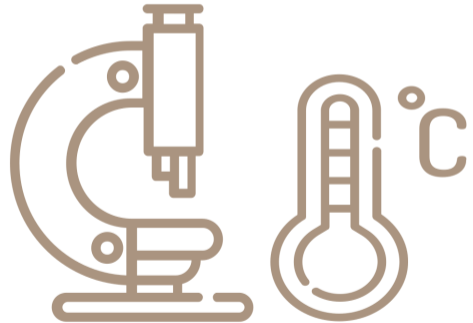


# Introduction

## Objectives

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- Estimate the **temperature distribution** along the composite material including the **Nip Point**, as function of time.
- Measurements:
  - ▶ Specific heat as function of temperature



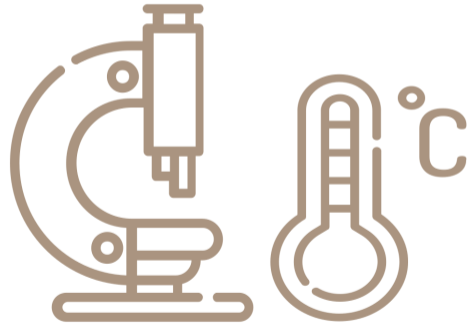


# Introduction

## Objectives

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- Estimate the **temperature distribution** along the composite material including the **Nip Point**, as function of time.
- Measurements:
  - ▶ Specific heat as function of temperature
  - ▶ Thermal conductivity as function of temperature

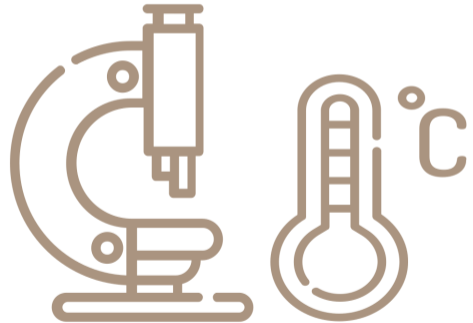


# Introduction

## Objectives

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- Estimate the **temperature distribution** along the composite material including the **Nip Point**, as function of time.
- Measurements:
  - ▶ Specific heat as function of temperature
  - ▶ Thermal conductivity as function of temperature
  - ▶ Thermal-optical properties as function of temperature



# Materials and Methods

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## 2. Materials and Methods

### 2.1 Composite material

### 2.2 Thermal characterization

# Materials and Methods

## Composite material

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Toray Cetex - TC910

PA6 matrix base

**Thermal properties** according to its data-sheet:

- Glass transition temperature: 60 °C

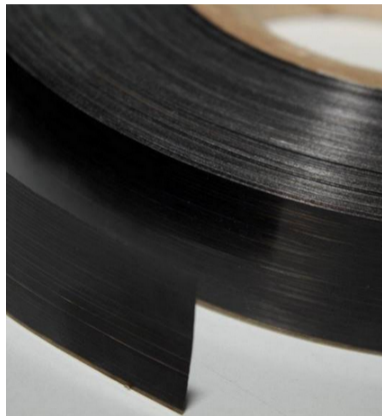


Figure 5. Composite material prepreg.  
PA6 matrix-based

# Materials and Methods

## Composite material

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Toray Cetex - TC910

PA6 matrix base

**Thermal properties** according to its data-sheet:

- Glass transition temperature: 60 °C
- Melting temperature: 233 °C



Figure 5. Composite material prepreg.  
PA6 matrix-based

# Materials and Methods

## Composite material

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Toray Cetex - TC910

PA6 matrix base

**Thermal properties** according to its data-sheet:

- Glass transition temperature: 60 °C
- Melting temperature: 233 °C
- Specific heat as function of temperature: ???



Figure 5. Composite material prepreg.  
PA6 matrix-based

# Materials and Methods

## Composite material

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Toray Cetex - TC910

PA6 matrix base

**Thermal properties** according to its data-sheet:

- Glass transition temperature: 60 °C
- Melting temperature: 233 °C
- Specific heat as function of temperature: ???
- Thermal conductivity as function of temperature: ???



Figure 5. Composite material prepreg.  
PA6 matrix-based

# Materials and Methods

## Composite material

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Toray Cetex - TC910

PA6 matrix base

**Thermal properties** according to its data-sheet:

- Glass transition temperature: 60 °C
- Melting temperature: 233 °C
- Specific heat as function of temperature: ???
- Thermal conductivity as function of temperature: ???
- Thermal-optical properties as function of temperature: ???

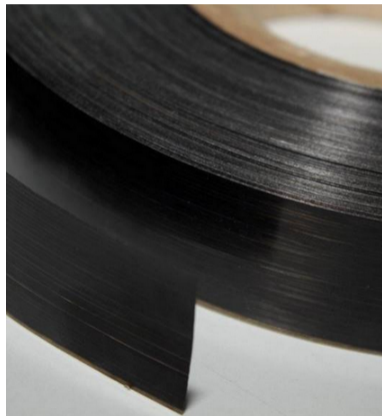


Figure 5. Composite material prepreg.  
PA6 matrix-based



# Materials and Methods

## Thermal characterization

---

### Standard test procedures

#### SPECIFIC HEAT

- Standard test procedure:
  - ▶ ASTM E 1269-01
- Test apparatus:
  - ▶ Differential Scanning Calorimeter Q200 from TA Instruments.



Figure 6. DSC Q200 TA Instruments

# Materials and Methods

## Thermal characterization

### Standard test procedures

### THERMAL CONDUCTIVITY

- Standard test procedure:
  - ▶ Laser Flash method. ASTM E-1461

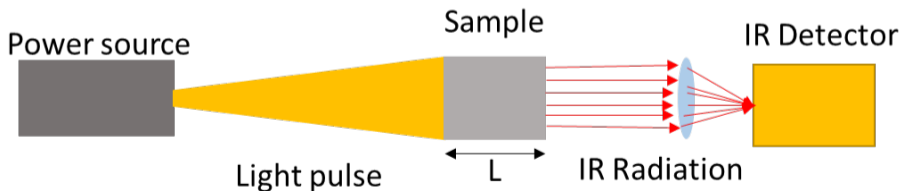


Figure 7. Laser Flash method working principle

# Materials and Methods

## Thermal characterization

### Standard test procedures

### THERMAL CONDUCTIVITY

- Standard test procedure:
  - ▶ Laser Flash method. ASTM E-1461

There is no such machine at INEGI's laboratory

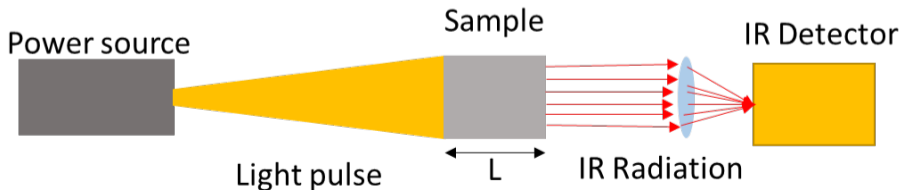


Figure 7. Laser Flash method working principle

# Materials and Methods

## Thermal characterization

### Standard test procedures

## THERMAL CONDUCTIVITY

- Standard test procedure:
  - ▶ Laser Flash method. ASTM E-1461

The machine only measures in **one direction**

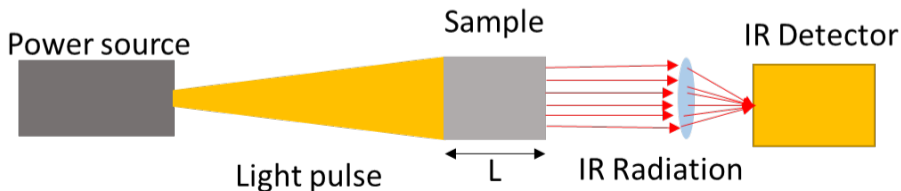


Figure 7. Laser Flash method working principle

# Materials and Methods

## Thermal characterization

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### In-house test procedures

### THERMAL CONDUCTIVITY

- Thermal-Vacuum chamber
  - ▶ Pressures under  $10^{-5}$  mPa

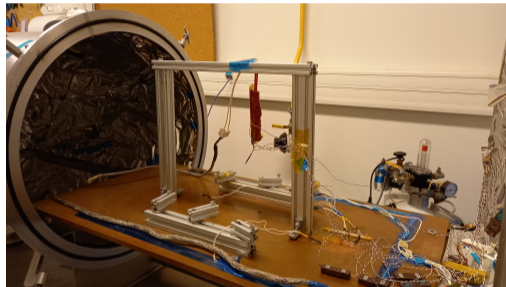


Figure 8. Thermal conductivity in-house procedure

# Materials and Methods

## Thermal characterization

---

### In-house test procedures

#### THERMAL CONDUCTIVITY

- Thermal-Vacuum chamber
  - ▶ Pressures under  $10^{-5}$  mPa
- No external interferences
  - ▶ Radiation
  - ▶ Convection

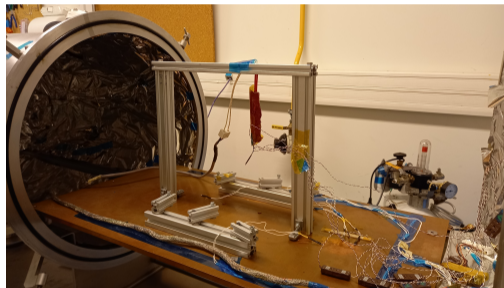


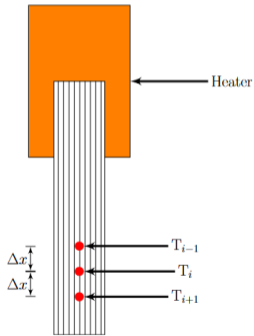
Figure 8. Thermal conductivity in-house procedure

# Materials and Methods

## Thermal characterization

### In-house test procedures

### THERMAL CONDUCTIVITY



$$\frac{dT}{dt} = \alpha_x (cp(T), \rho, k_x(T)) \cdot \left( \frac{d^2 T}{dx^2} \right) \quad (3)$$

$$\frac{T_i^{P+1} - T_i^P}{\Delta t} = \frac{k_x(T_i^P)}{\rho \cdot cp(T_i^P)} \cdot \left( \frac{T_{i+1}^P - 2T_i^P + T_{i-1}^P}{\Delta x^2} \right) \quad (4)$$

Figure 9. Thermal conductivity in-house procedure. Theoretical principle

# Materials and Methods

## Thermal characterization

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### In-house test procedures

## THERMAL CONDUCTIVITY

- The heater is an electrical resistance

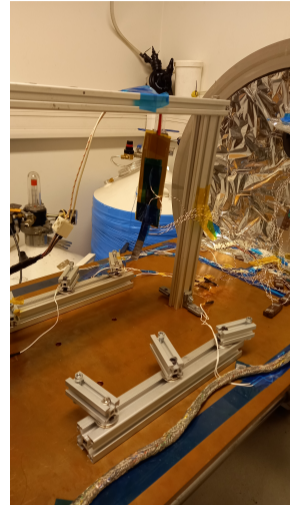


Figure 10. Thermal conductivity in-house test equipment



# Materials and Methods

## Thermal characterization

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### In-house test procedures

#### THERMAL CONDUCTIVITY

- The heater is an electrical resistance
- The heater has an aluminium plate to conduct the heat from the resistance to the composite material

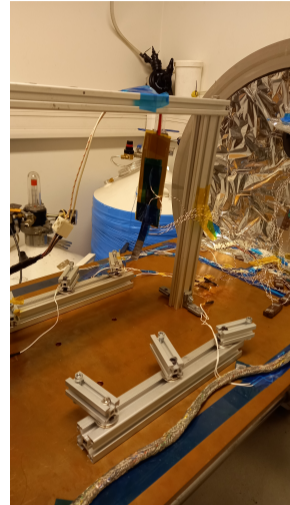


Figure 10. Thermal conductivity in-house test equipment

# Materials and Methods

## Thermal characterization

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### In-house test procedures

## THERMAL-OPTICAL PROPERTIES

- Emissivity and absorptivity
- Reflectivity

# Materials and Methods

## Thermal characterization

### In-house test procedures

### THERMAL-OPTICAL PROPERTIES

- Emissivity and absorptivity
- Reflectivity

Standard procedure to calibrate pyrometers

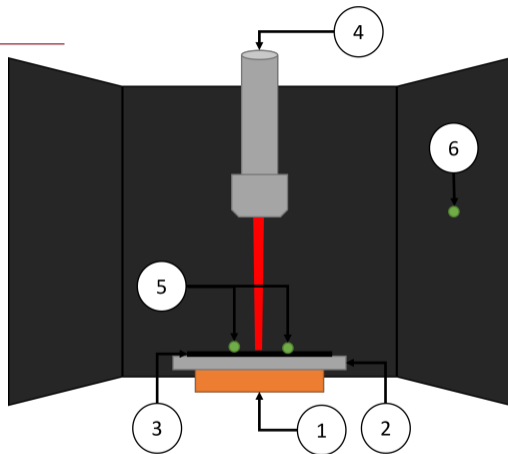


Figure 11. In-house designed test procedure for thermal-optical properties measurement

# Materials and Methods

## Thermal characterization

### In-house test procedures

### THERMAL-OPTICAL PROPERTIES

- Emissivity and absorptivity
- Reflectivity

Standard procedure to calibrate pyrometers

1. Heating element
2. Aluminium plate
3. Material sample
4. Pyrometer
5. Contact temperature sensor, material
6. Contact temperature sensor, ambient

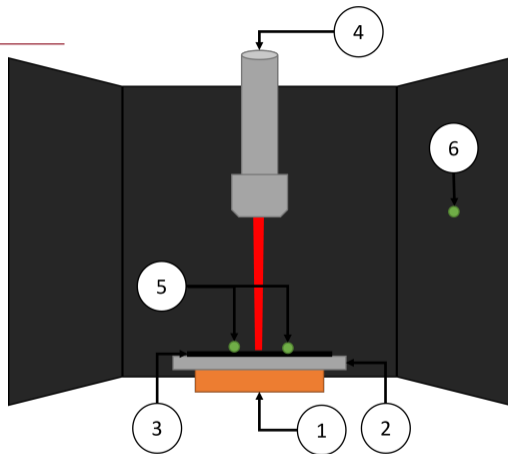


Figure 11. In-house designed test procedure for thermal-optical properties measurement

# Materials and Methods

## Thermal characterization

### In-house test procedures

## THERMAL-OPTICAL PROPERTIES

Basic correlations:

$$\varepsilon + \tau + \rho = 1 \quad (5)$$

$$\tau = 0 \quad \varepsilon \approx \alpha \quad (6)$$

$$\varepsilon + \rho = 1 \quad (7)$$

$$\varepsilon_{\text{mat}} = \frac{\varepsilon_{\text{pyro}} \cdot T_{\text{pyro}}^4 - T_{\text{enclosure}}^4}{T_{\text{mat}}^4 - T_{\text{enclosure}}^4} \quad (8)$$



Figure 12. In-house designed test procedure

# Results

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## 3. Results

3.1 Specific heat

3.2 Thermal Conductivity

3.3 Thermal-Optical properties

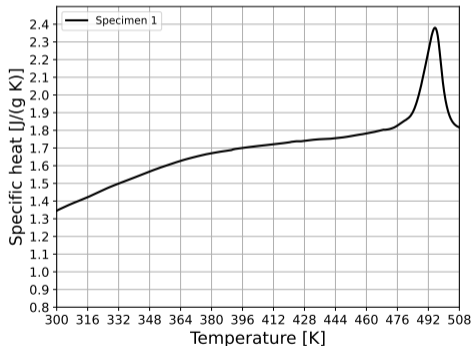
3.4 Simulation

# Results

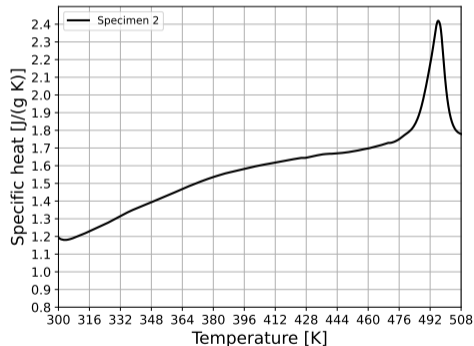
## Specific heat

### Specific heat

The results from the standard procedure for the composite material sample



(a) Test sample 1



(b) Test sample 2

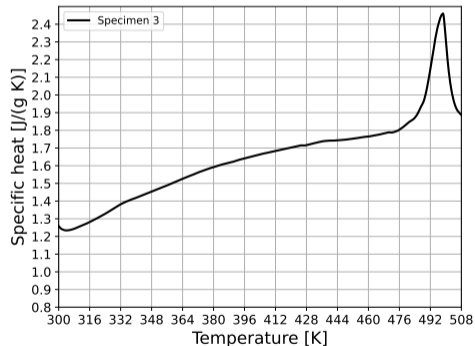
Figure 13. Specific heat results 1

# Results

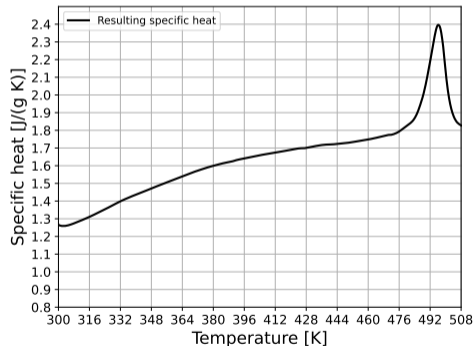
## Specific heat

### Specific heat

The results from the standard procedure for the composite material sample



(a) Test sample 3



(b) Specific heat mean

Figure 14. Specific heat results 2

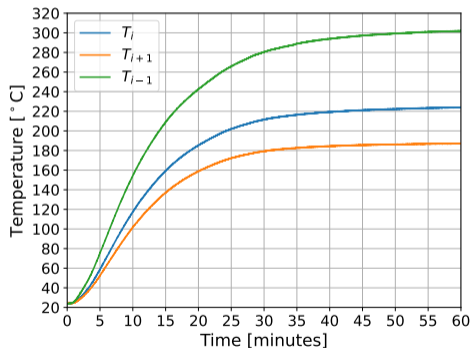


# Results

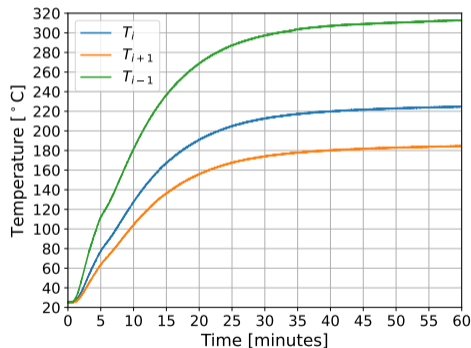
## Thermal Conductivity

### Thermal conductivity

The results from the in-house designed procedure for the composite material sample



(a) Test sample 1



(b) Test sample 2

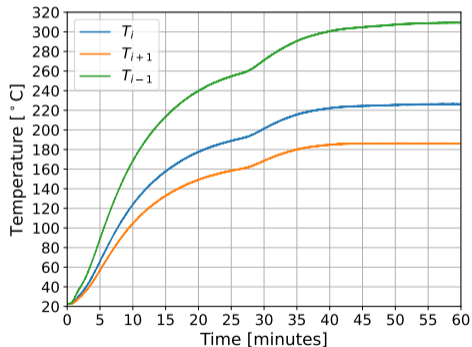
Figure 15. Thermal conductivity results 1

# Results

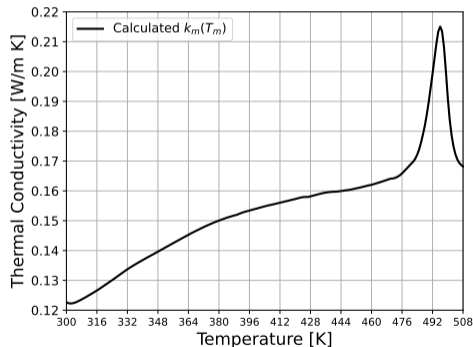
## Thermal Conductivity

### Thermal conductivity

The results from the in-house designed procedure for the composite material sample



(a) Test sample 3



(b) Thermal conductivity mean

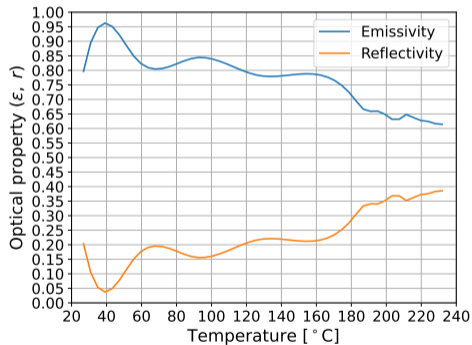
Figure 16. Thermal conductivity results 2

# Results

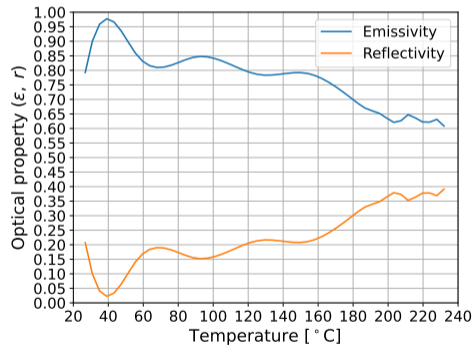
## Thermal-Optical properties

### Thermal-optical properties

The results from the in-house designed procedure for the composite material sample



(a) Test sample 1



(b) Test sample 2

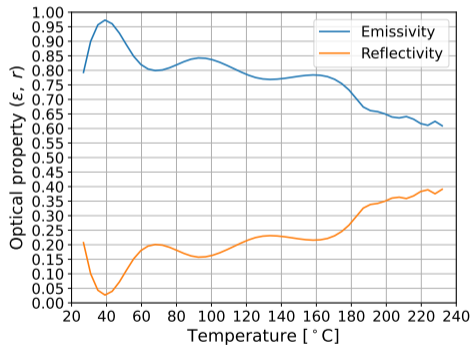
Figure 17. Thermal-optical properties results 1

# Results

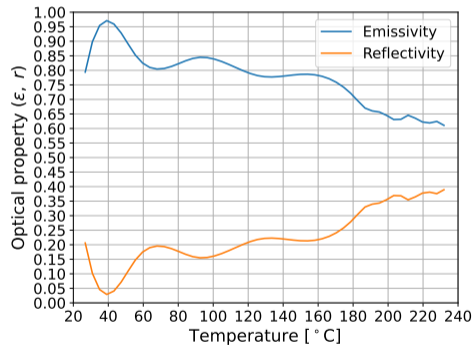
## Thermal-Optical properties

### Thermal-optical properties

The results from the in-house designed procedure for the composite material sample



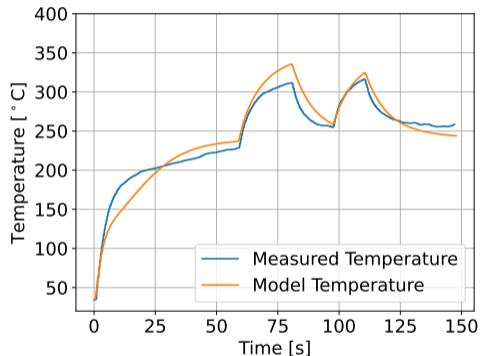
(a) Test sample 3



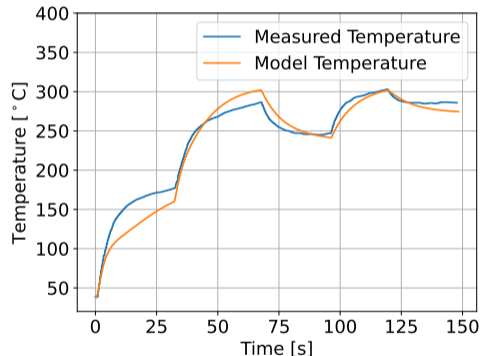
(b) Thermal-optical properties mean

Figure 18. Thermal-optical properties results 2

## Test and simulation



(a) Test and simulation 1



(b) Test and simulation 2

Figure 19. Test and simulation on the real machine\*

\* J. de Sá Rodrigues, P. T. Gonçalves, L. Pina, and F. Gomes de Almeida, "Modelling the Heating Process in the Transient and Steady State of an In Situ Tape-Laying Machine Head," *Journal of Manufacturing and Materials Processing*, vol. 6, no. 1, p. 8, Jan. 2022, doi: 10.3390/jmmp6010008. [Online]. Available: <http://dx.doi.org/10.3390/jmmp6010008>

# Conclusions

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## 4. Conclusions

# Conclusions

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- The Thermal conductivity test considers a uni-directional conductivity in a thin material sample, avoiding the convective effects.
  - ▶ Nonetheless, the radiation component has to be included into the fundamental equation to minimize the uncertainty.
  - ▶ Having a procedure which allows to neglect the convective effects, is significantly cheaper than producing material samples to measure the thermal conductivity perpendicular to the fibres.
  
- The thermal-optical test procedure, as a procedure to calibrate the optical readings of a pyrometer, allows to obtain the emissivity values as function of the composite material temperature.
  - ▶ This characteristic, allows to use any pyrometer available, including pyrometers with factory fixed parameters.

# Conclusions

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- The proposed methodology for thermal characterization of a composite material, specifically unidirectional prepregs, contributed to predict the temperature of the measuring point for the ATL process.
  - ▶ Knowing the composite properties, allows to fine adjust heat transfer parameters, minimizing the uncertainties.
  - ▶ The temperature distribution can be estimated then, a model-based control strategy can be applied, for example, a Model Predictive Control strategy.



# Acknowledgements

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## 5. Acknowledgements

# Acknowledgements

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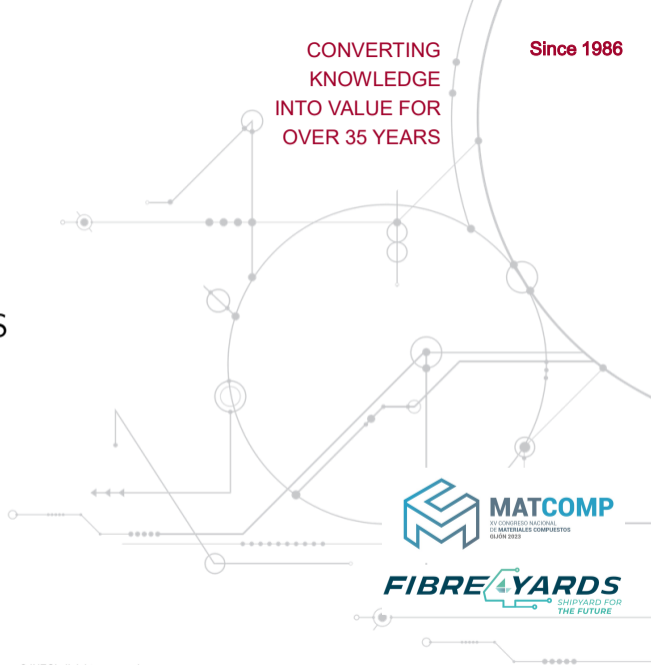
M.Sc. JHONNY DE SÁ RODRIGUES  
jsrodrigues@inegi.up.pt

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