

# Impact of climate change on photovoltaic performance

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Leon GAILLARD



# Agenda

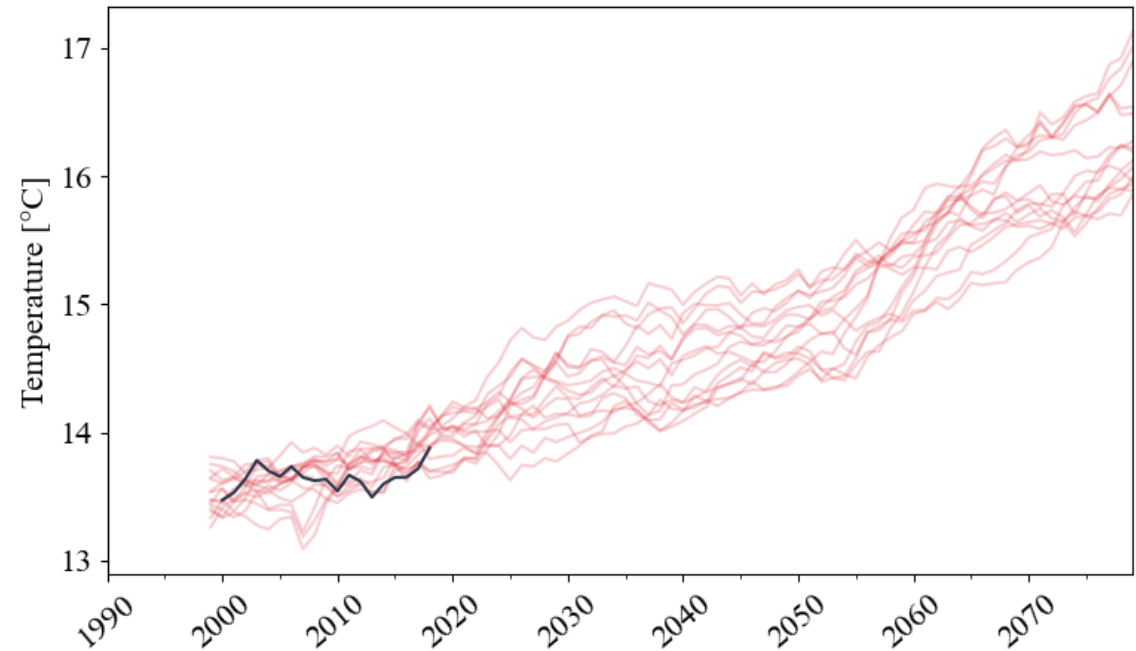


Introduction  
Research Question  
Methodology  
Results  
Conclusion

# Introduction

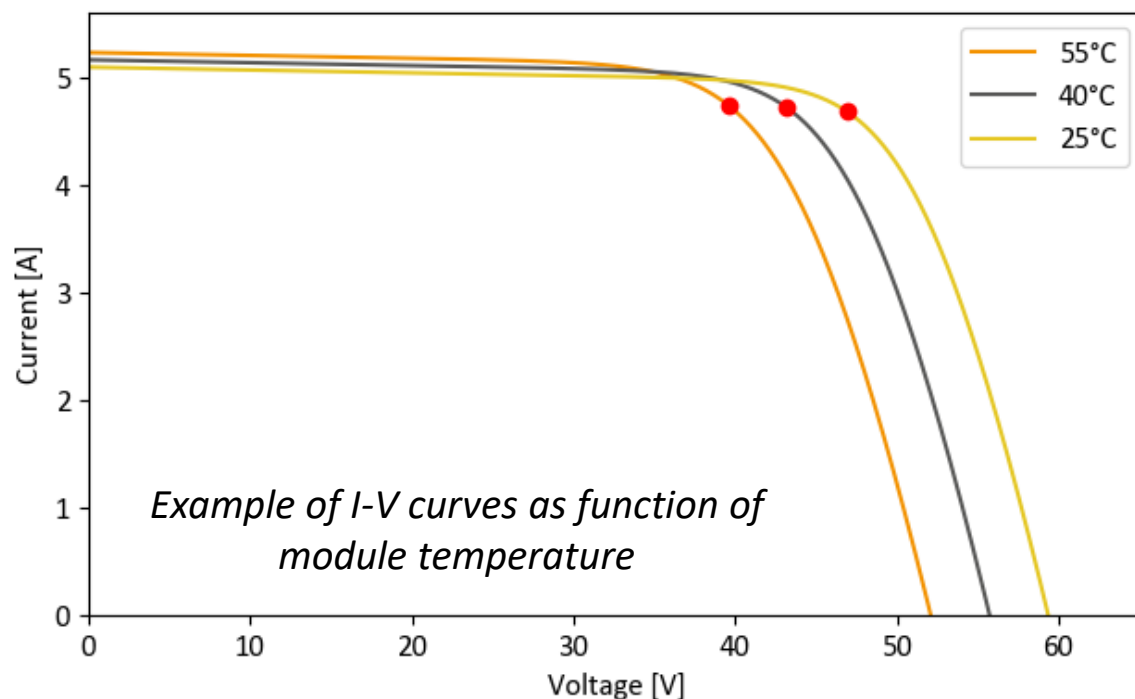
Due to climate change, environmental variables are inevitably going to change...

*Yearly average temperature projections  
according to RCP8.5 at Bordeaux*

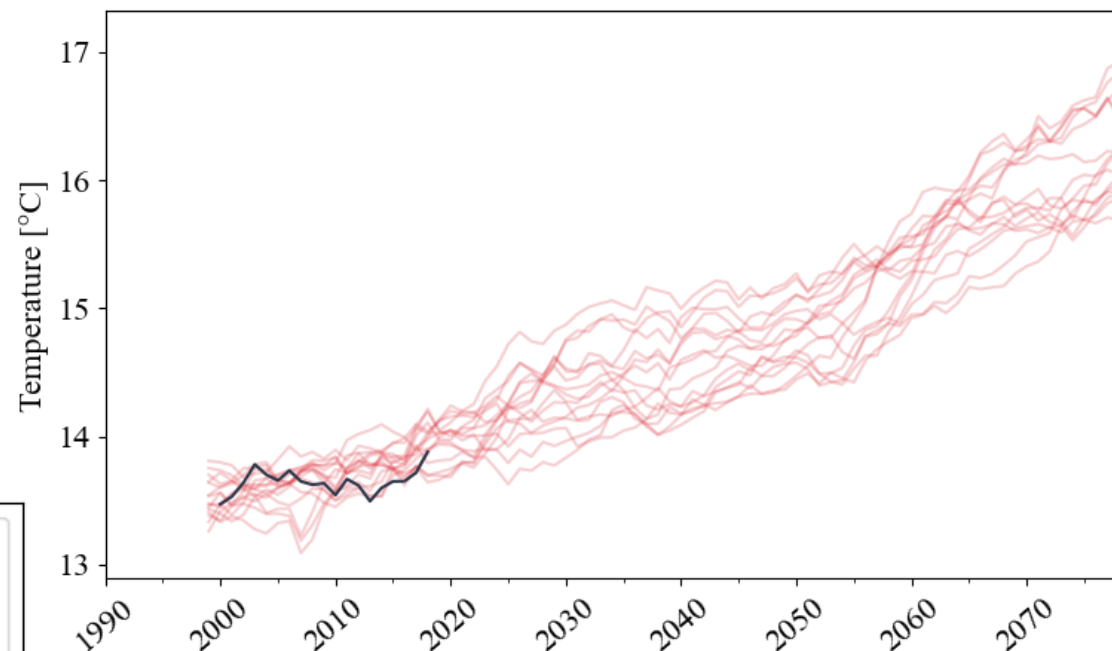


# Introduction

Due to climate change, environmental variables are inevitably going to change...



Yearly average temperature projections  
according to RCP8.5 at Bordeaux



... and will result in different PV operating conditions such as, for instance, more temperature losses

## Research question

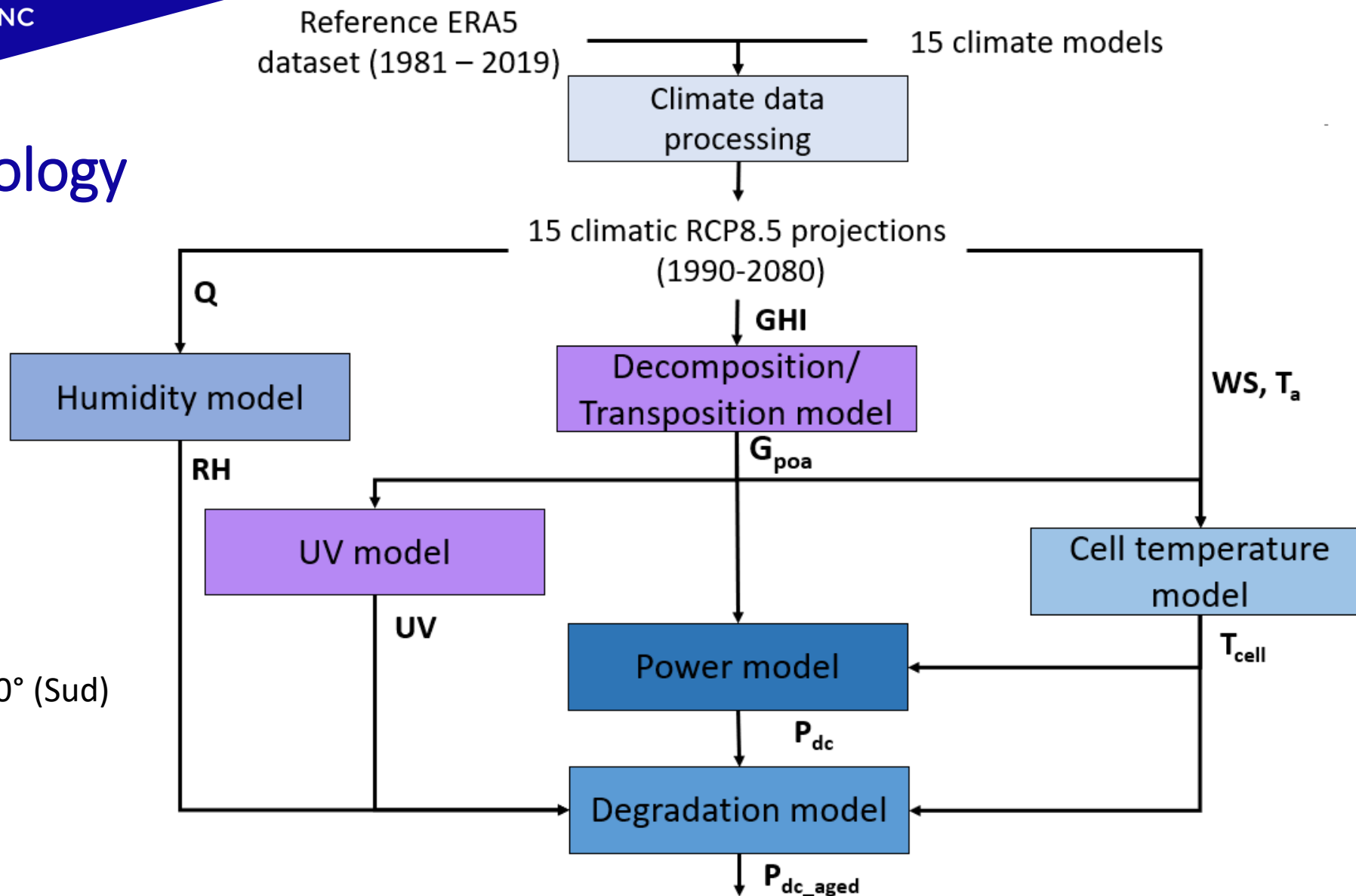
How do climate projections translate to  
PV performance losses ?

# Agenda



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# Methodology



PV installation  
- Azimuth = 180° (Sud)  
- Tilt = 30°

PR Comparison:  
1990-2020 vs 2020-2050 vs 2050-2080

# Methodology

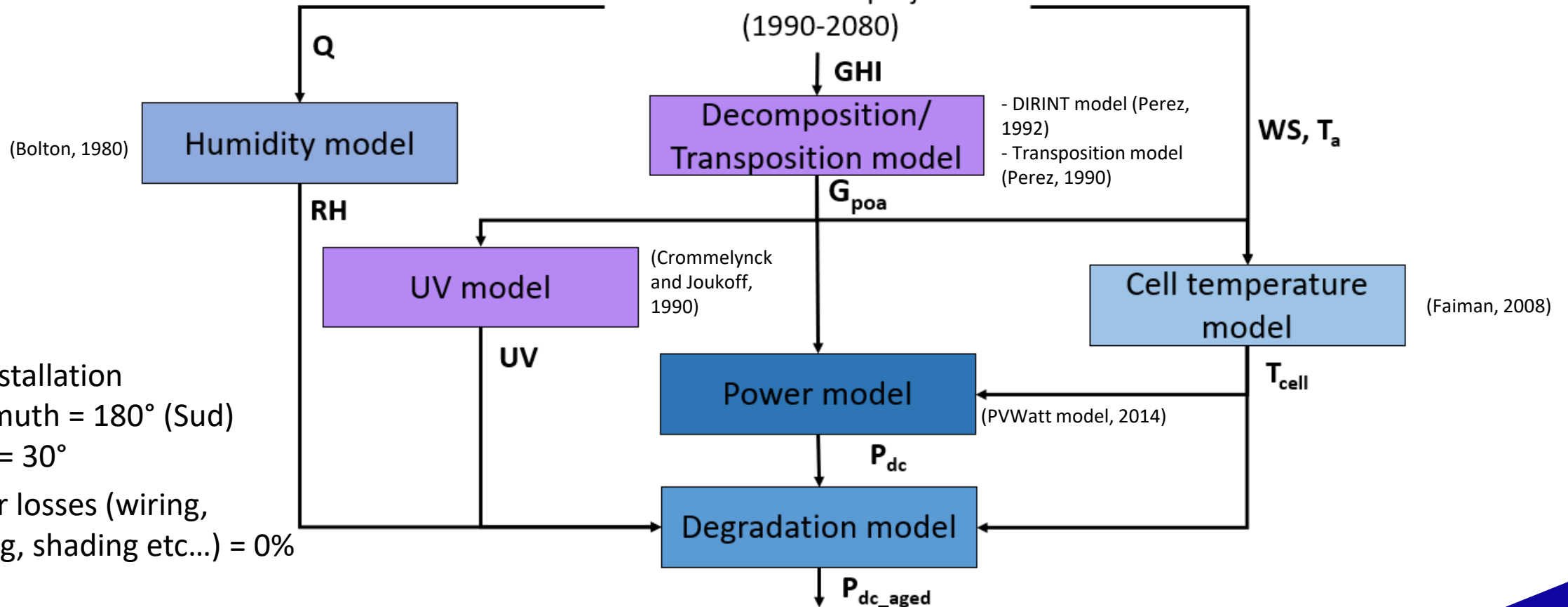
Reference ERA5  
dataset (1981 – 2019)

15 climate models  
Eurocordex

Climate data  
processing

- Bias correction method (Panofsky, 1968)
- Hourly interpolation (Hyman, 1983)

15 climatic RCP8.5 projections  
(1990-2080)



PV installation  
- Azimuth = 180° (Sud)  
- Tilt = 30°

Other losses (wiring,  
soiling, shading etc...) = 0%



# Methodology, natural ageing

Kaaya's model\*

$$\eta_{ageing}(y) = 1 - \exp\left(-\left(\frac{\Gamma}{k(y) \cdot (y - y_0)}\right)^\mu\right)$$

with:

- $y_0$  the installation year
- $(\Gamma, \mu)$  empirical constants
- $k(y)$  the total degradation rate

\* Ismail, Kaaya & Köhl, Michael & Mehilli, Amantin - Panos & Sidrach-de-Cardona, M. & Weiss, Karl. (2019). Modeling Outdoor Service Lifetime Prediction of PV Modules: Effects of Combined Climatic Stressors on PV Module Power Degradation. IEEE Journal of Photovoltaics. PP. 1-8. 10.1109/JPHOTOV.2019.2916197.

# Methodology, natural ageing

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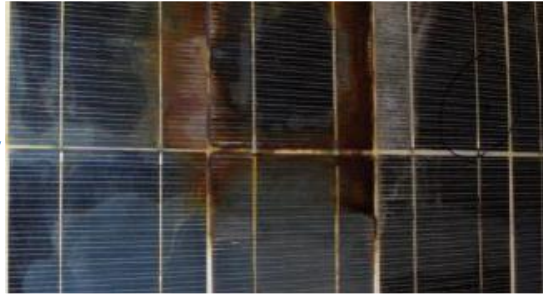
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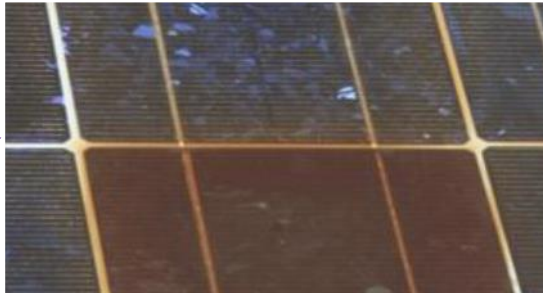
Actually,  $k(y)$  depends on environmental variables

$$k(y) = f(k_H(y), k_P(y), k_{Tm}(y))$$



## Hydrolysis-driven degradation

$$k_H(y) = A_H \cdot RH(y)^n \cdot \exp\left(-\frac{E_{ah}}{k_B \cdot T_{mod}(y)}\right)$$



## Photo-degradation

$$k_P(y) = A_p \cdot UV(y)^x \cdot (1 + RH(y)^n) \cdot \exp\left(-\frac{E_{ap}}{k_B \cdot T_{mod}(y)}\right)$$



## Thermo-mechanical degradation

$$k_{Tm}(y) = A_t \cdot C_N \cdot (273 + \Delta T(y))^\theta \cdot \exp\left(-\frac{E_{at}}{k_B \cdot T_{max}(y)}\right)$$

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\*\* Pictures: Cécile Miquel et al. Dysfonctionnement électriques des installations photovoltaïques: points de vigilance. PTVIGI1801. AQC - HESPUL, Oct. 1, 2018 et Marc Köntges et al. Review of Failures of Photovoltaic Modules. IEA-PVPS T13-01:2014. IEA PVPS T13, 2014.

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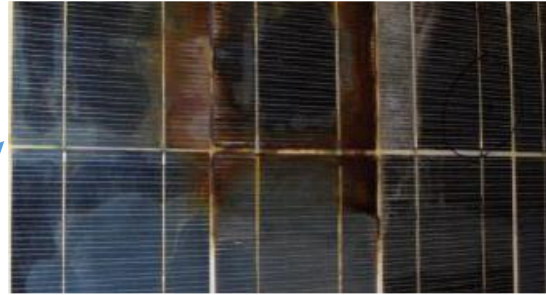
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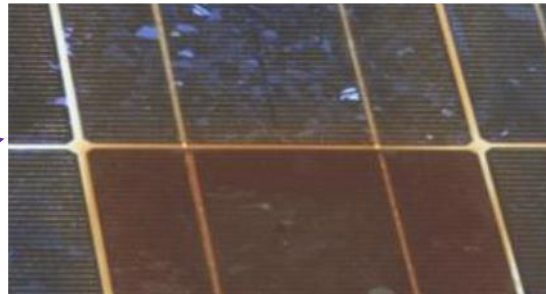
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**Parameters** extracted from Kaaya's study 2019\*, on an open rack installation, mc-Si, with polymer backsheet and aluminium frame



## Hydrolysis-driven degradation

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## Methodology, PR

$$PR(y) = \eta_{power}(y) \cdot n_{ageing}(y)$$

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$$PR(y) = \eta_{power}(y) \cdot n_{ageing}(y)$$

$$\eta_{power}(y) = \frac{\int_y P_{out}(t) dt / \int_y G_{POA}(t) dt}{P_0 / G_{ref}}$$

$P_{out}(t)$  computed with PVWatts Model\*

$$\eta_{ageing}(y) = 1 - \exp\left(-\left(\frac{\Gamma}{k(y) \cdot (y - y_0)}\right)^\mu\right)$$

Kaaya's Model\*\*

\*Aron P. Dobos. PVWatts Version 5 Manual. Sept. 4, 2014

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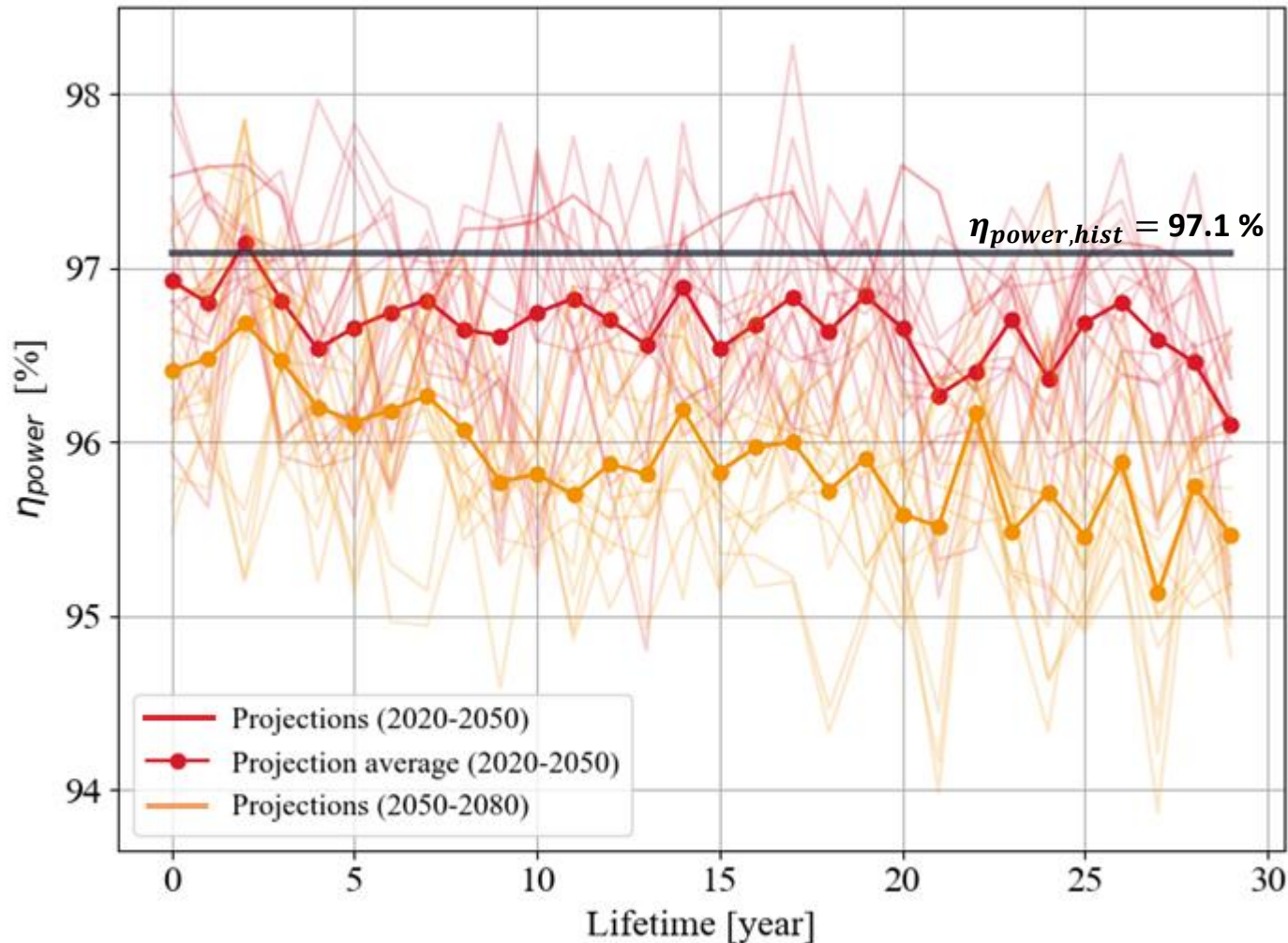


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# Results, Bordeaux case study

$$PR(y) = \eta_{power}(y) \cdot \eta_{ageing}(y)$$

$\eta_{power}$  over time of 15 climate projections on 2020-2050 and 2050-2080 at Bordeaux



$\eta_{power}$  trend over time:

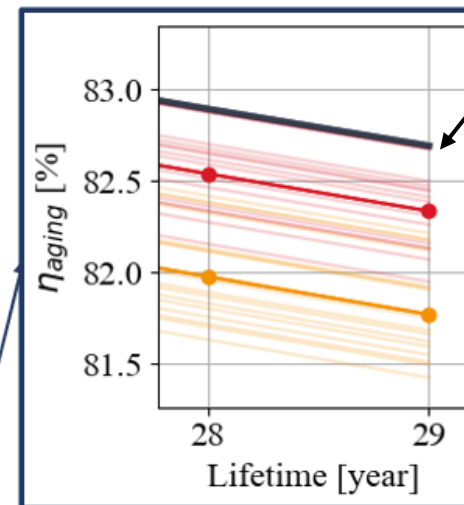
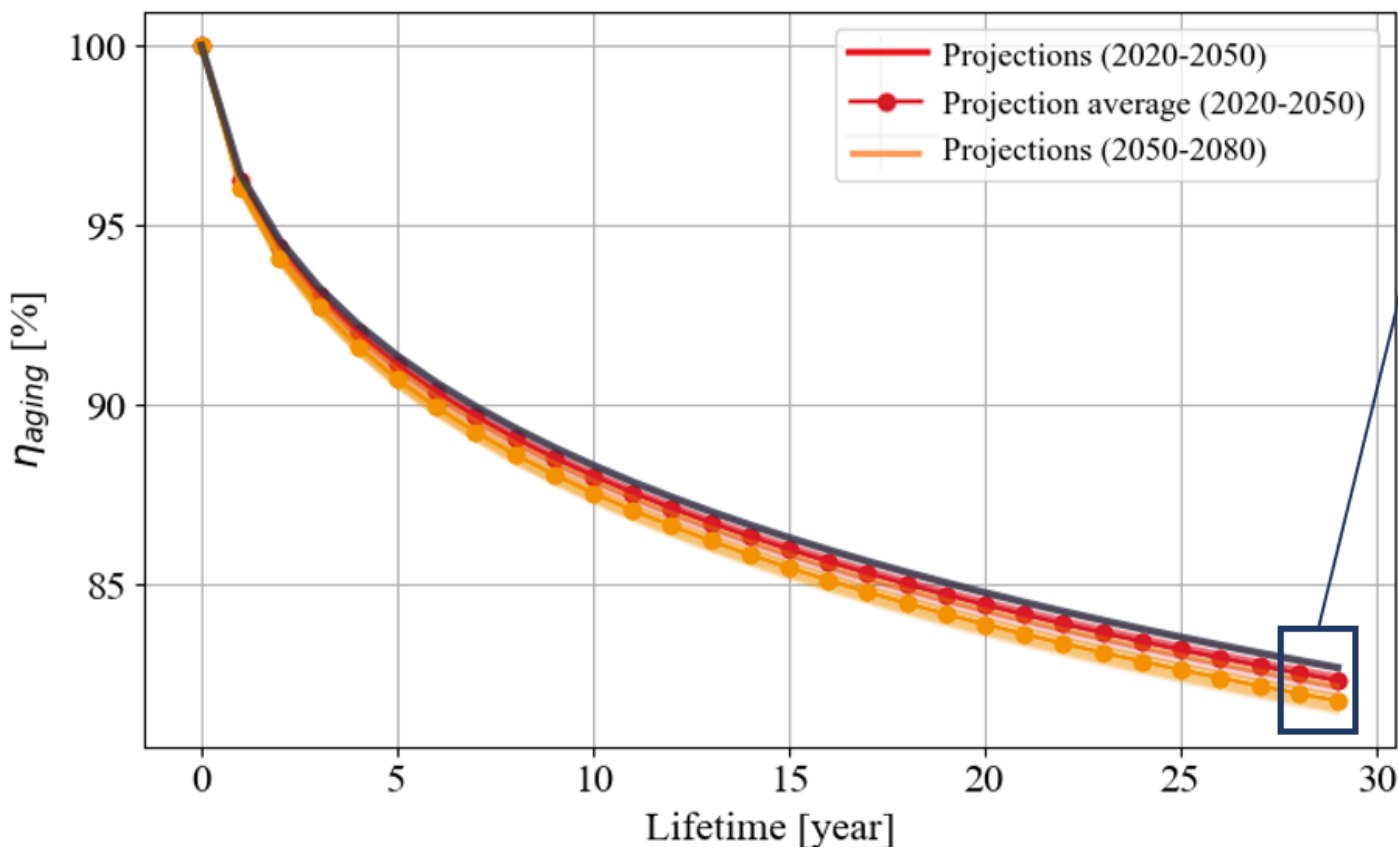
- Overall decrease
- More volatile



# Results, Bordeaux case study

$$PR(y) = \eta_{power}(y) \cdot \eta_{ageing}(y)$$

$\eta_{ageing}$  over time of 15 climate projections on 2020-2050 and 2050-2080 at Bordeaux



$\eta_{ageing,hist}(y)$  calculated with  $k_{hist} = 0.34 \text{ year}^{-1}$

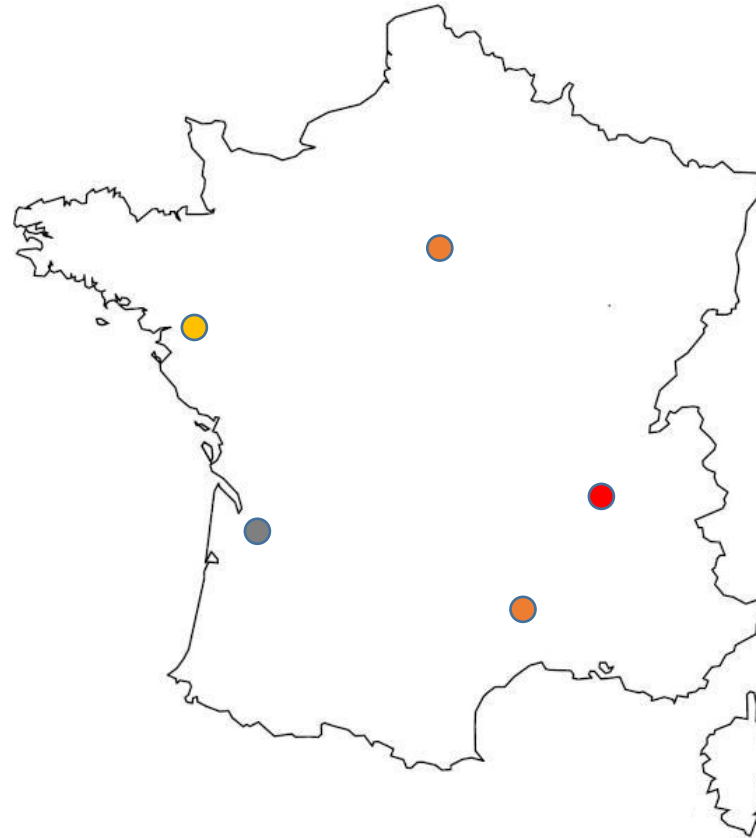
- Slight decrease of performance on  $\eta_{ageing}$

**Average decrease over all projections after 30 years compared to  $\eta_{ageing,hist}$**

2020-2050	-0.4%
2050-2080	-0.6%

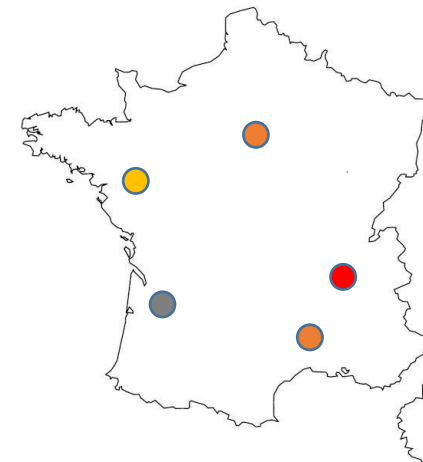
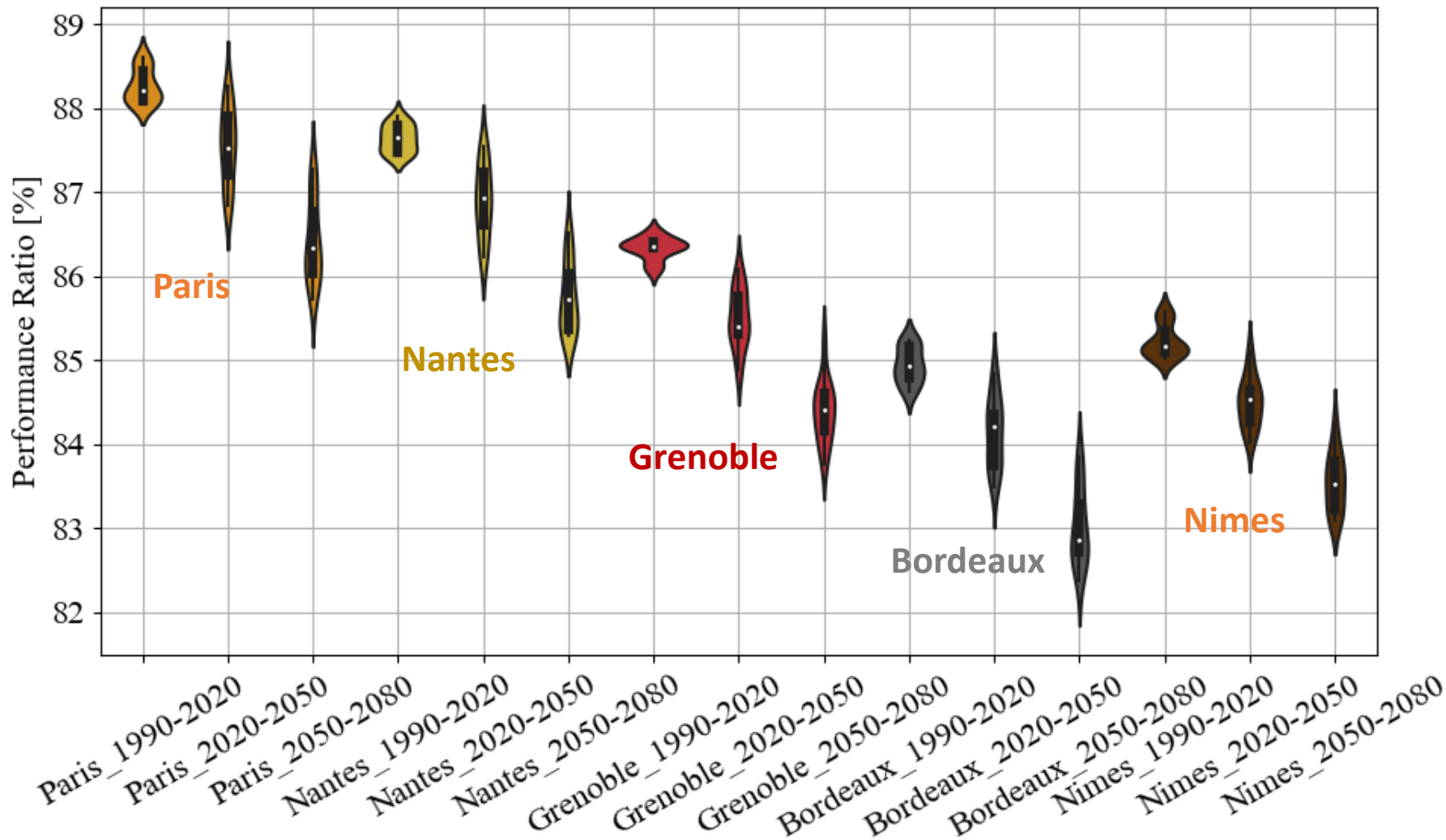


## Results, other French cities



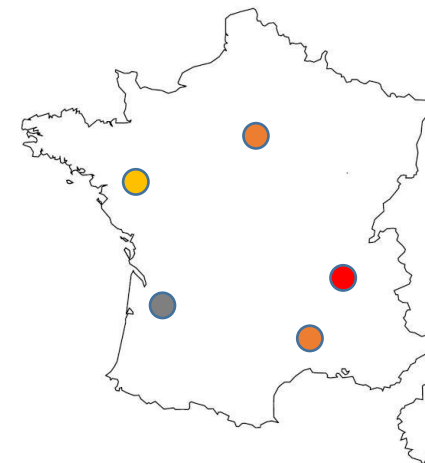
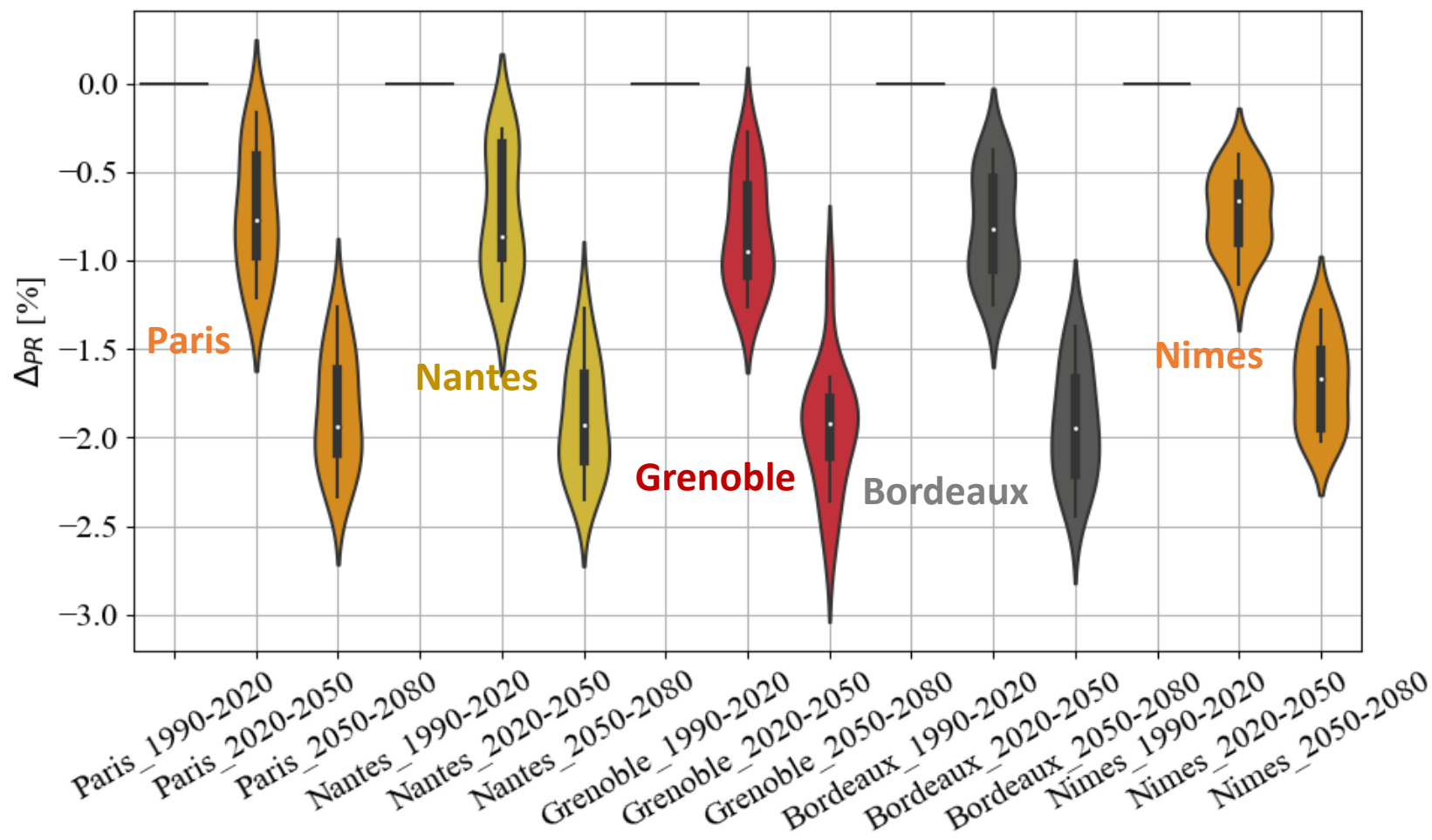
## Results, other French cities

*PR on 15 climate projections for different cities for a 30-year lifetime installation*



## Results, other French cities

$\Delta_{PR}$  on 15 climate projections on different cities for different climate periods compared to 1990-2020 for a 30-year lifetime installation



Very similar trends are observed for all cities with a PR median decreasing by:

- 0.5-1% on 2020-2050 vs 1990-2020
- 1.5-2% on 2050-2080 vs 1990-2020

## Conclusion

In this study, a **modeling chain quantifies** the impact of climate change.

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The impact on PV goes through **two** factors:

- **Decrease in instantaneous power**
- **Accelerated aging**

## Conclusion

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The impact on PV goes through **two** factors:

- **Decrease in instantaneous power**
- **Accelerated aging**

In the case studies, the impact of the **RCP8.5** future projections has repercussions **under 3% on the Performance Ratio.**



## Questions / Comments



## Backup slides



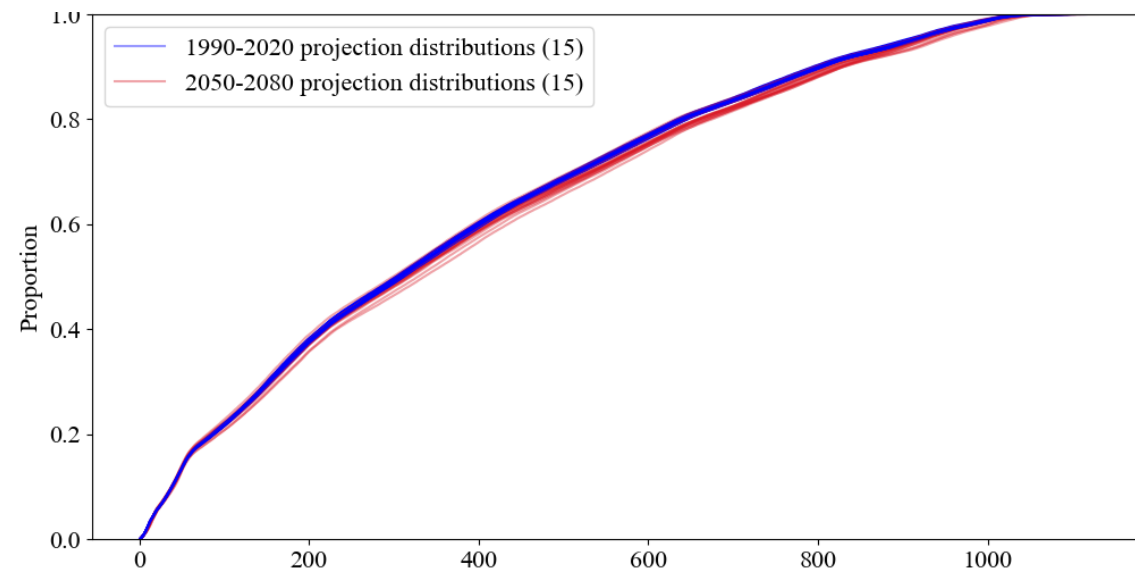
# Results, Bordeaux study case

## Environmental variables

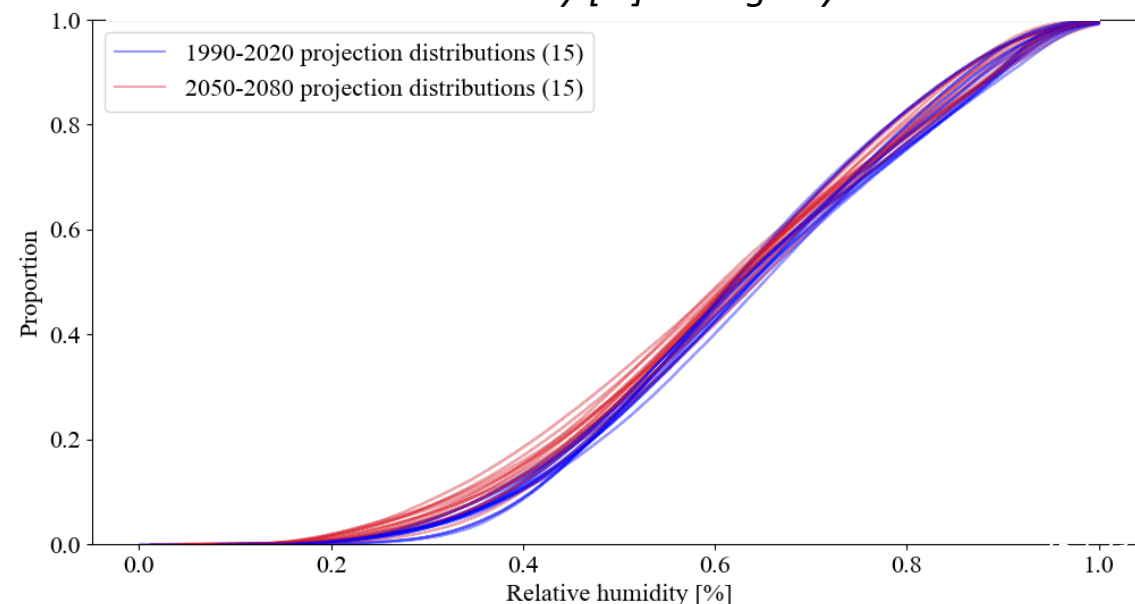
### 2050-2080 vs 1990-2020 (during daytime)

- Irradiation: Slight increase with +76 MWh/m<sup>2</sup>/year on average at most for all projections
- Relative humidity: Slight decrease with -2.2% on average at most for all projections

*The cumulative distribution function of the hourly irradiance [W/m<sup>2</sup>] during daytime*



*The cumulative distribution function of the hourly relative humidity [%] during daytime*



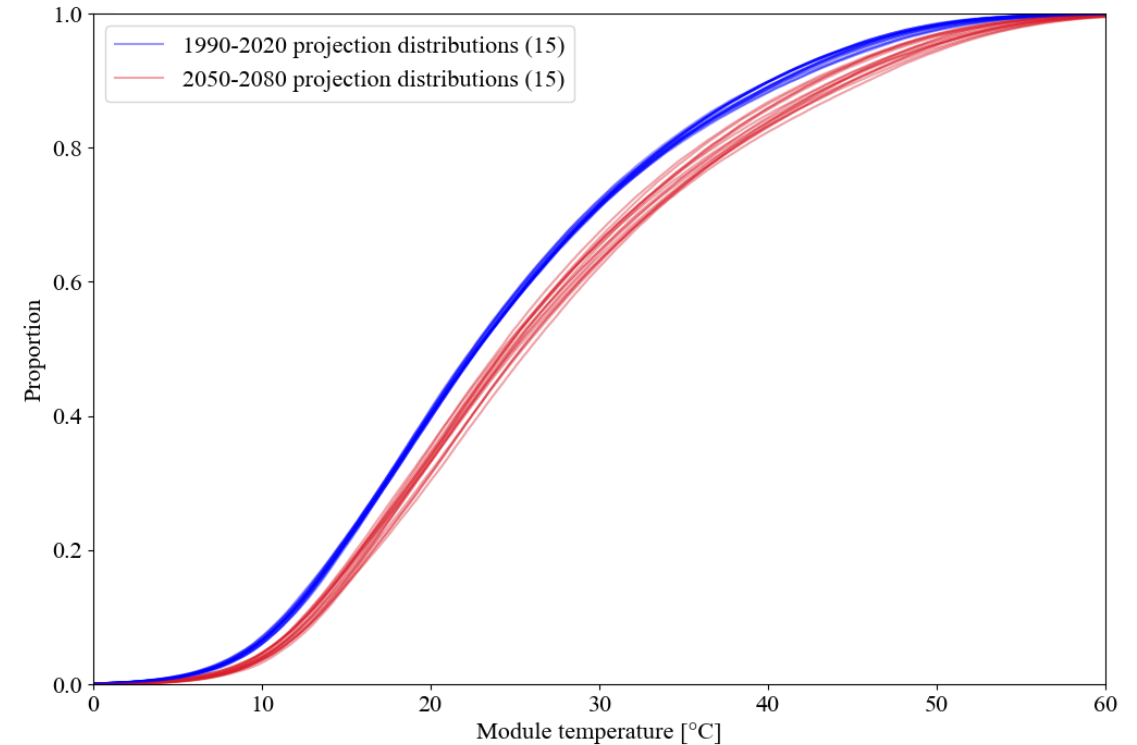
# Results, Bordeaux study case

## Environmental variables

### 2050-2080 vs 1990-2020 (during daytime)

- Irradiation: Slight increase with +28 kWh/m<sup>2</sup>/year on average at most for all projections
- Relative humidity: Slight decrease with -2.2% on average at most for all projections
- Module Temperature:
  - Quantile 5%: 1.5°C
  - Average: +2°C
  - Quantile 95%: +3.5°C

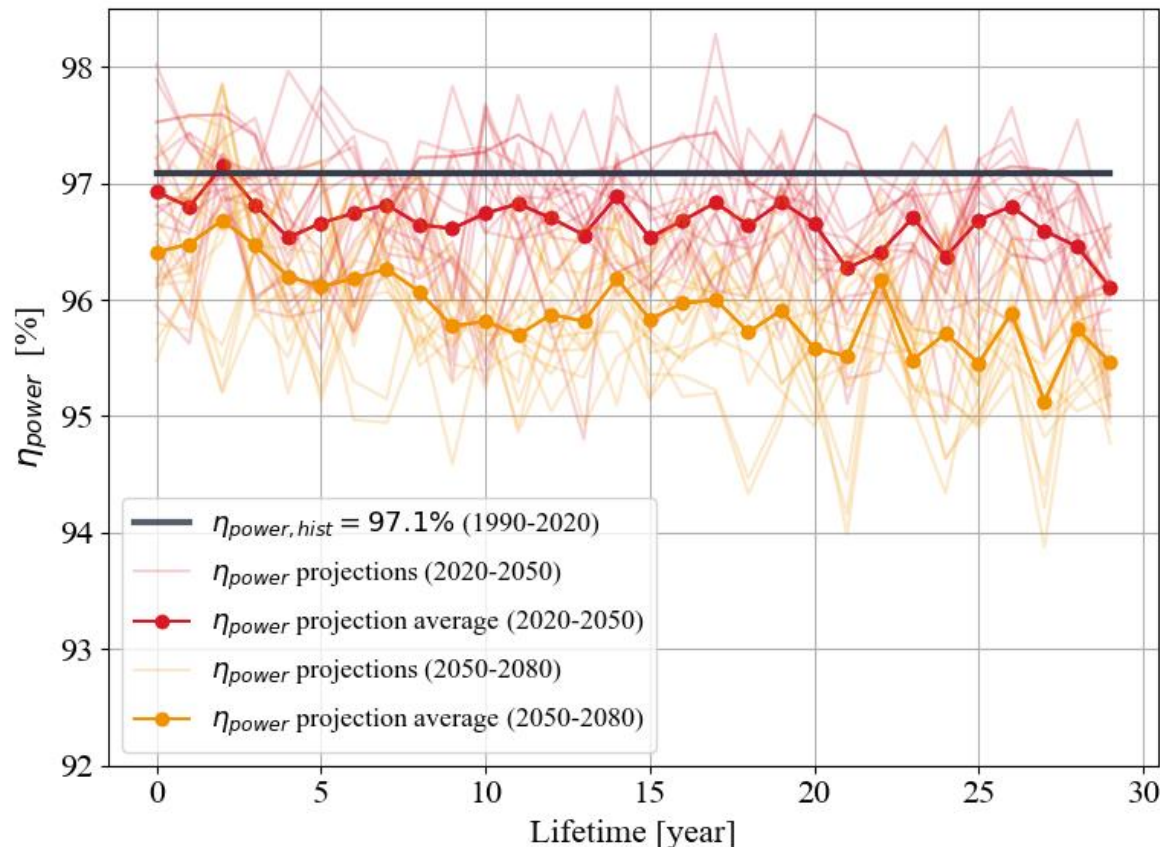
*The cumulative distribution function of the hourly module temperature [°C] during daytime*



# Results, Bordeaux study case

$$PR(y) = \eta_{power}(y) \cdot \eta_{ageing}(y)$$

$\eta_{power}$  over time of 15 climate projections on 2020-2050  
and 2050-2080 at Bordeaux



Historical  $\eta_{power, hist}$  (1990-2020) = 97.1 %

$\eta_{power}$  tendencies over time:

- Overall decrease
- More volatile

Standard deviation	
1990-2020 (ERA5 dataset)	0.43 %
2020-2050	0.49% (median) [0.37%, 60%]
2050-2080	0.59% (median) [0.41%, 0.67%]