

# Impact of climate change on photovoltaic performance

EUPVSEC 2023

*18/09/2023*

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Leon GAILLARD



# Agenda

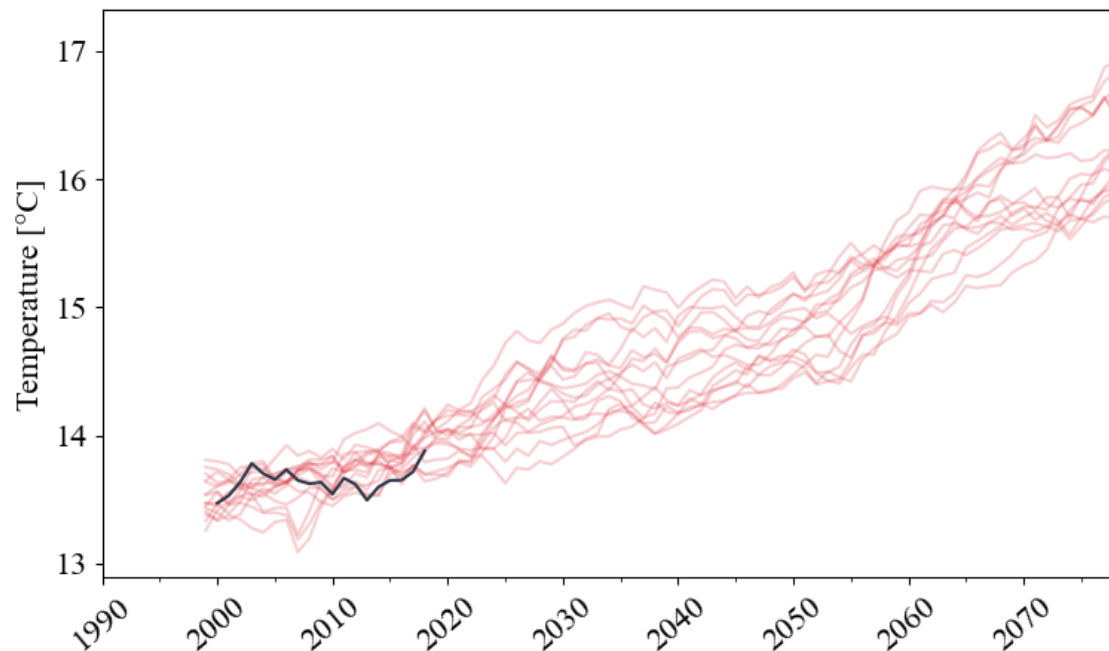


Introduction  
Research Question  
Methodology  
Results  
Conclusion

# Introduction

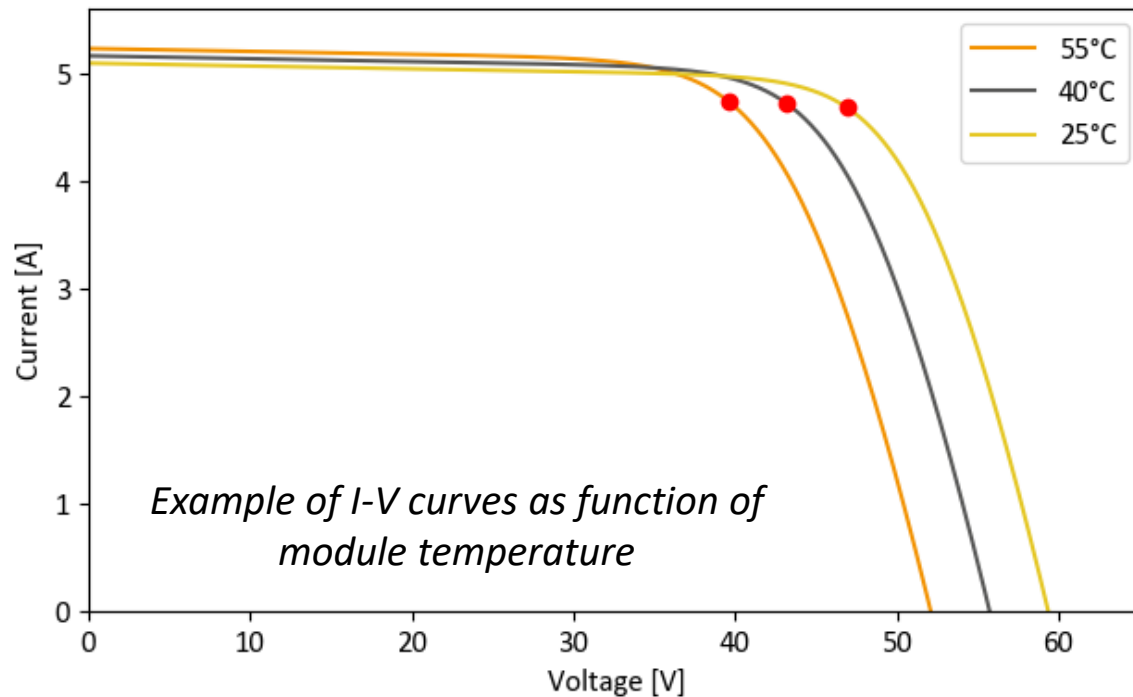
Due to climate change, environmental variables are inevitably going to change...

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

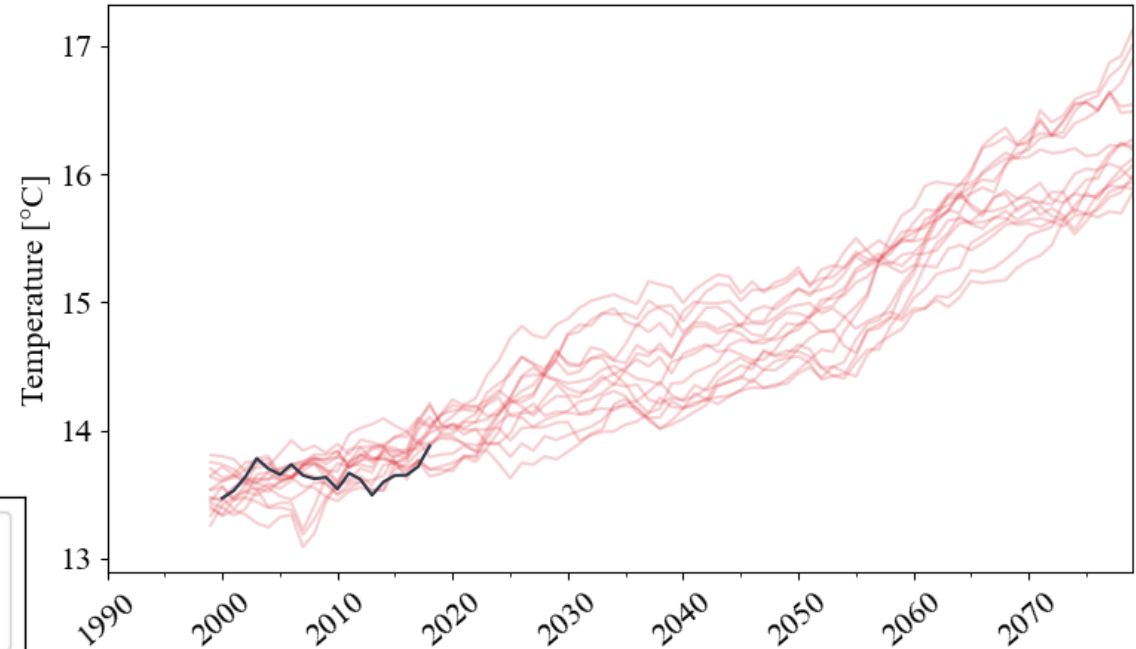


# Introduction

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## 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

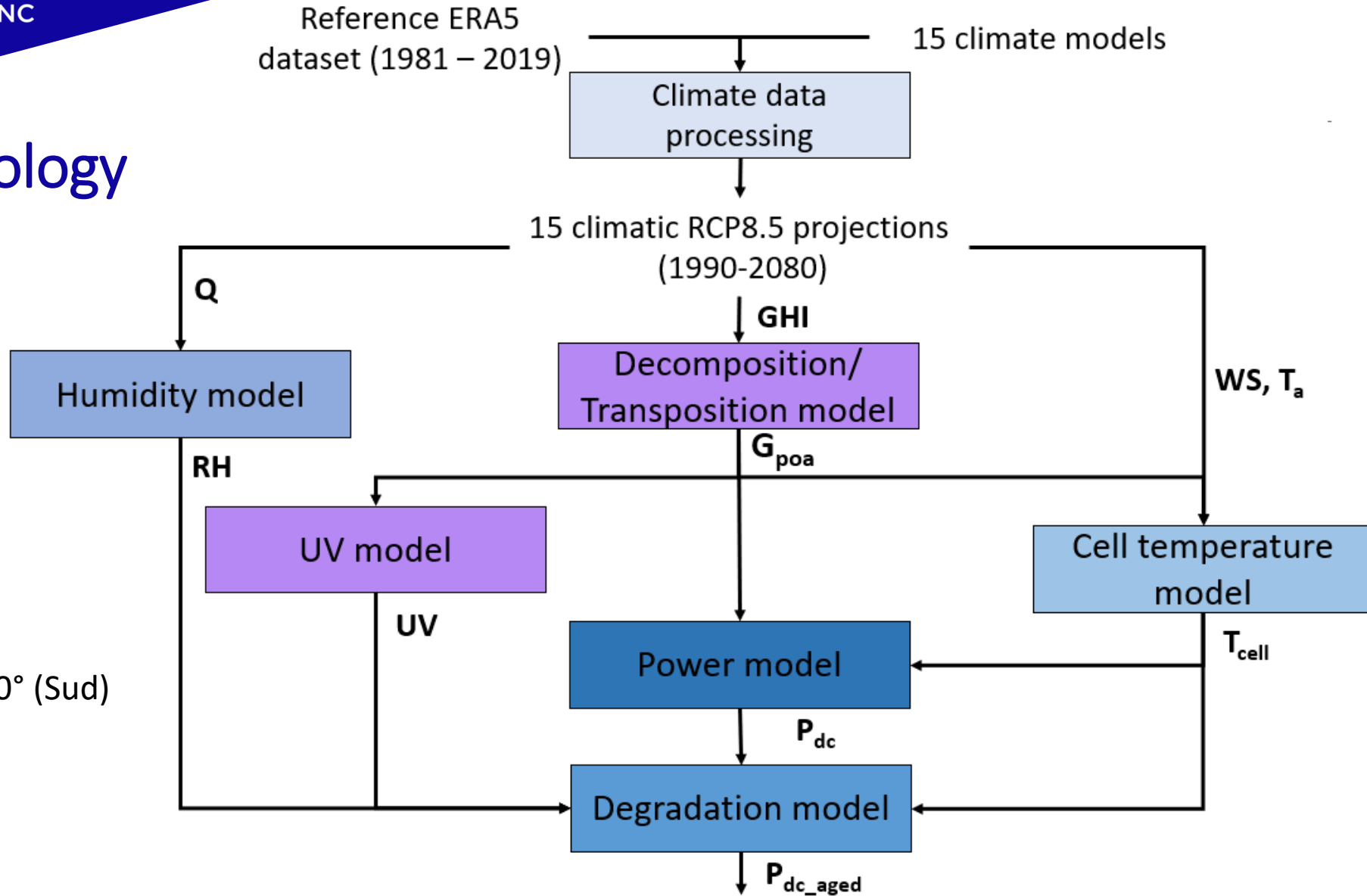
How do climate projections translate to  
PV performance losses ?

# Agenda



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# Methodology



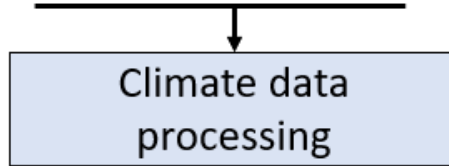
PV installation  
 - Azimuth = 180° (Sud)  
 - Tilt = 30°

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

# Methodology

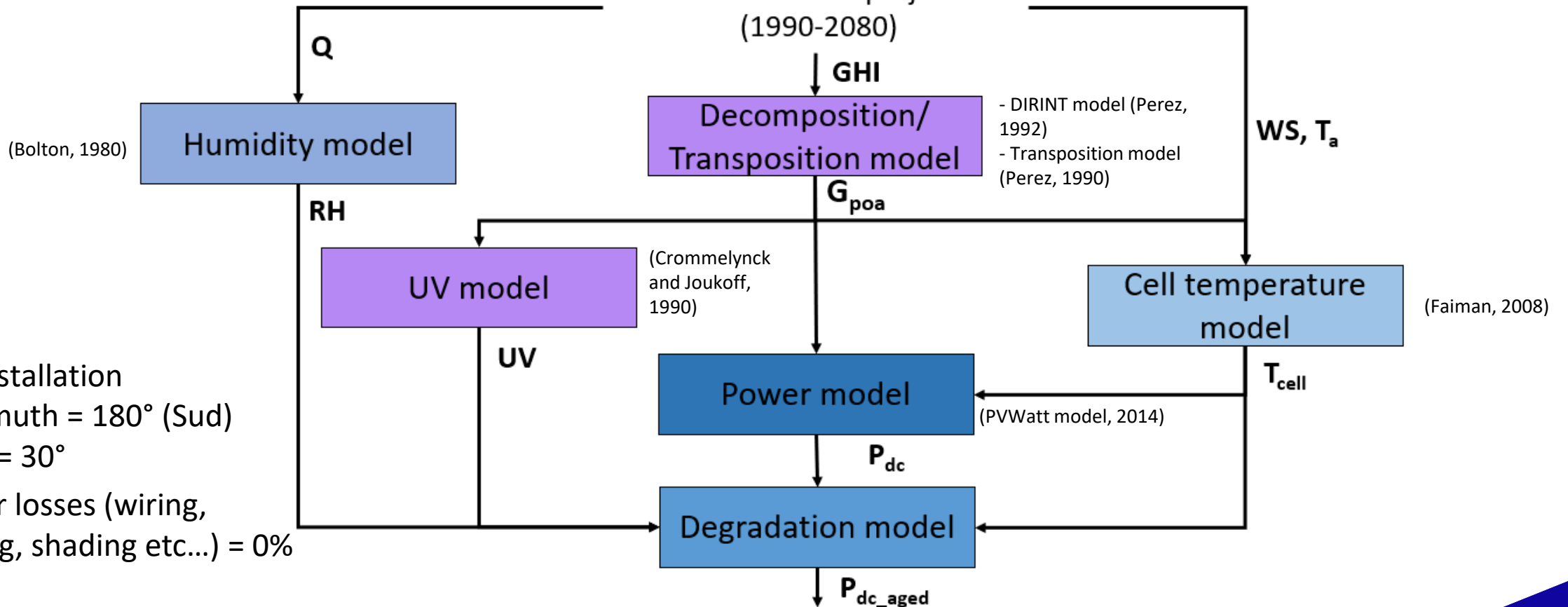
Reference ERA5 dataset (1981 – 2019)

15 climate models  
 Eurocordex



- 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%

PR Comparison:

1990-2020 vs 2020-2050 vs 2050-2080



# 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.

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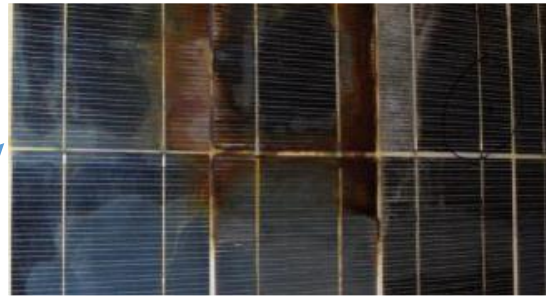
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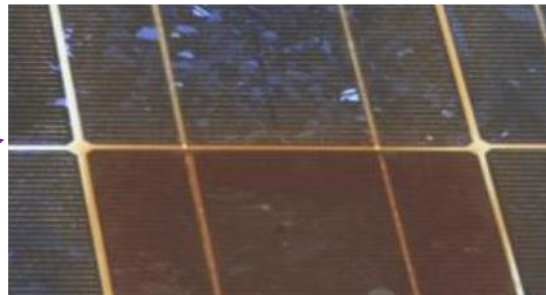
Actually,  $k(y)$  depends on environmental variables

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



## Hydrolysis-driven degradation

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



## Photo-degradation

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



## Thermo-mechanical degradation

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

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# Methodology, natural ageing

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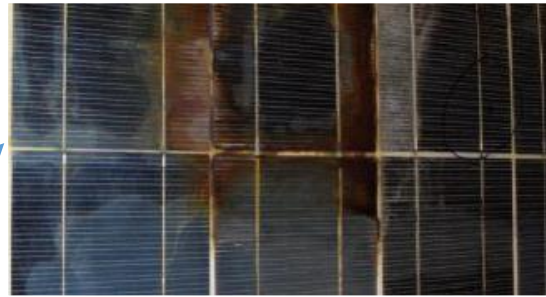
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**Parameters extracted from Kaaya's study 2019\***, on an open rack installation, mc-Si, with polymer backsheet and aluminium frame

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## Methodology, PR

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

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

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

$$n_{ageing}(\mathbf{y}) = 1 - \exp\left(-\left(\frac{\Gamma}{k(\mathbf{y}) \cdot (\mathbf{y} - \mathbf{y}_0)}\right)^\mu\right)$$

Kaaya's Model\*\*

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

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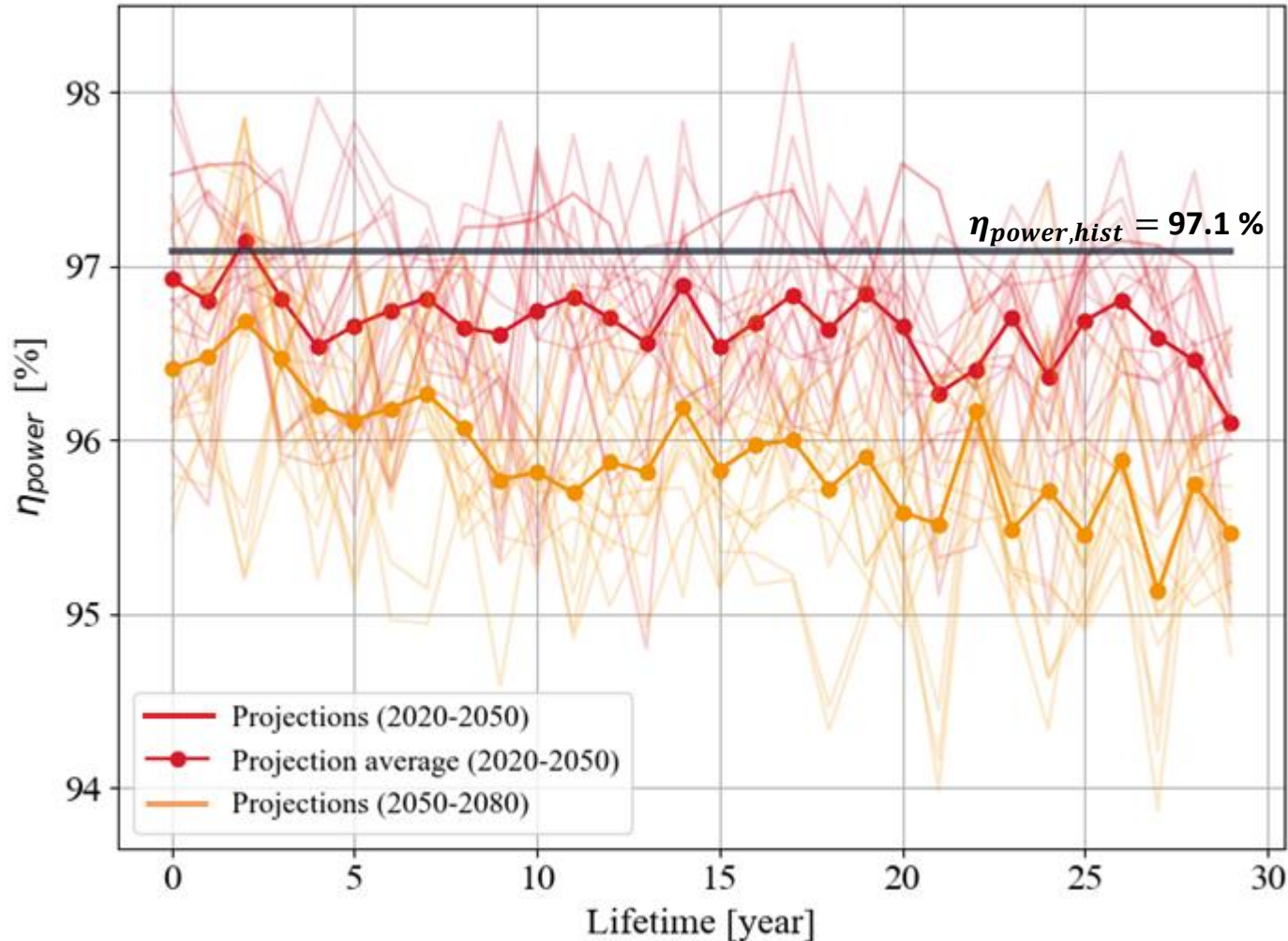


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# Results, Bordeaux case study

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

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



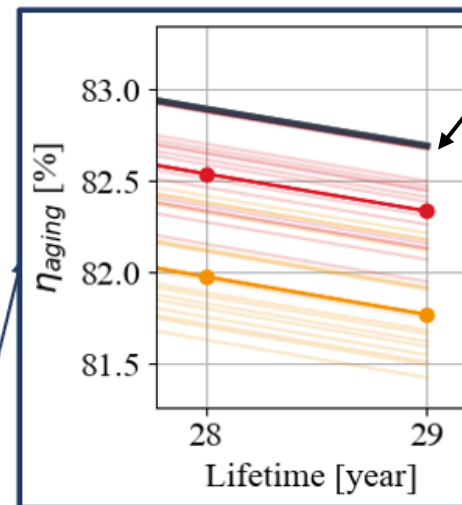
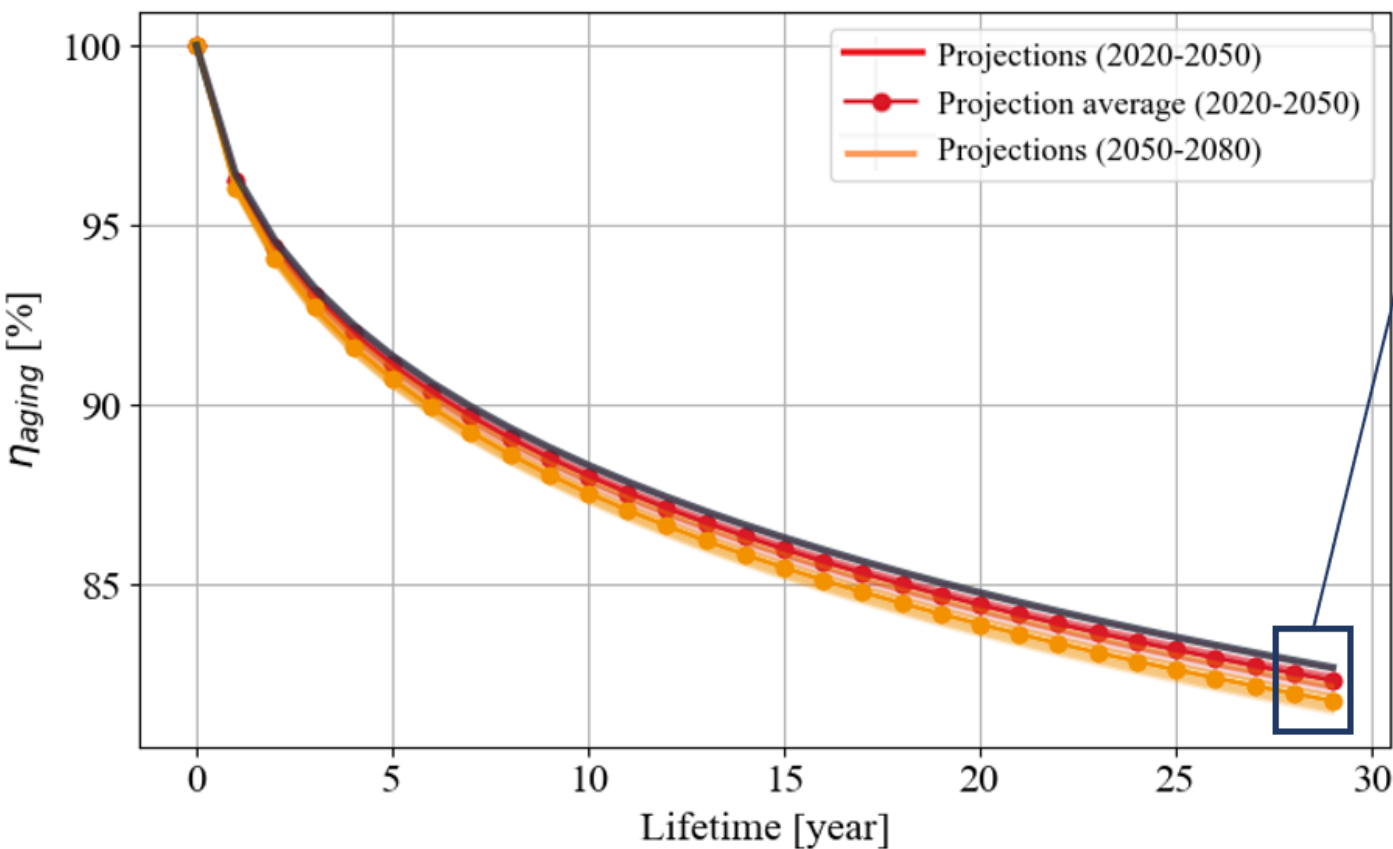
$\eta_{power}$  trend over time:

- Overall decrease
- More volatile

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

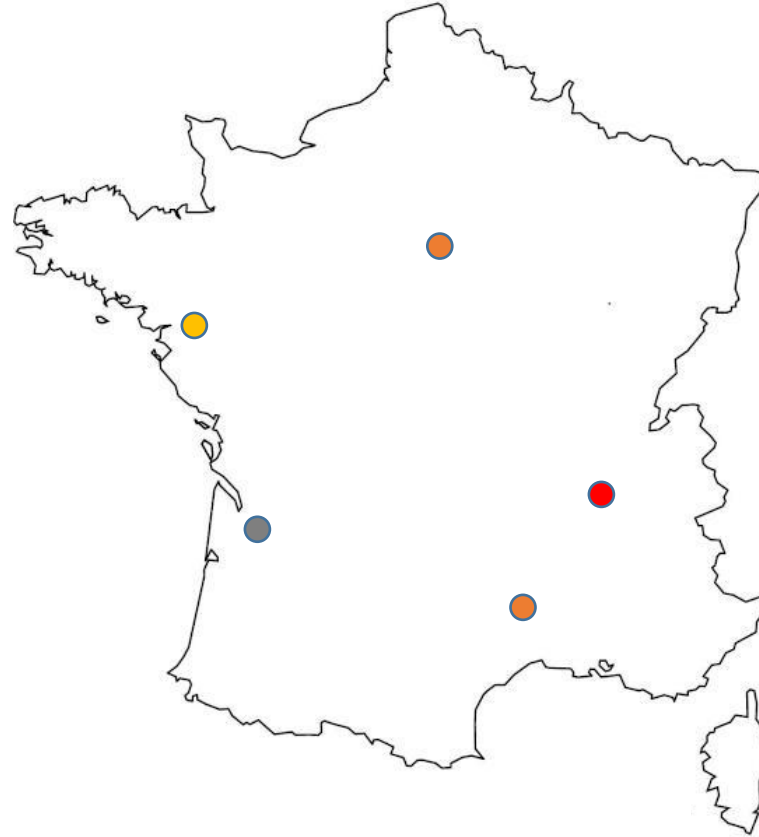
- Slight decrease of performance on  $\eta_{ageing}$

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

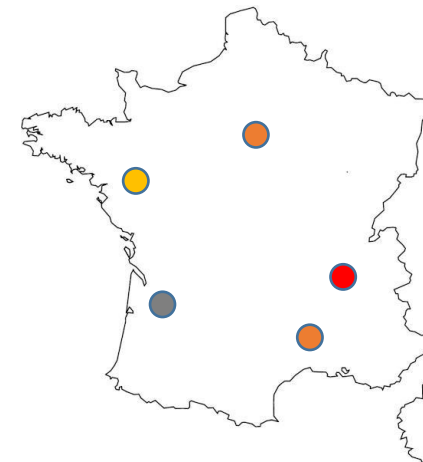
<b>2020-2050</b>	-0.4%
<b>2050-2080</b>	-0.6%



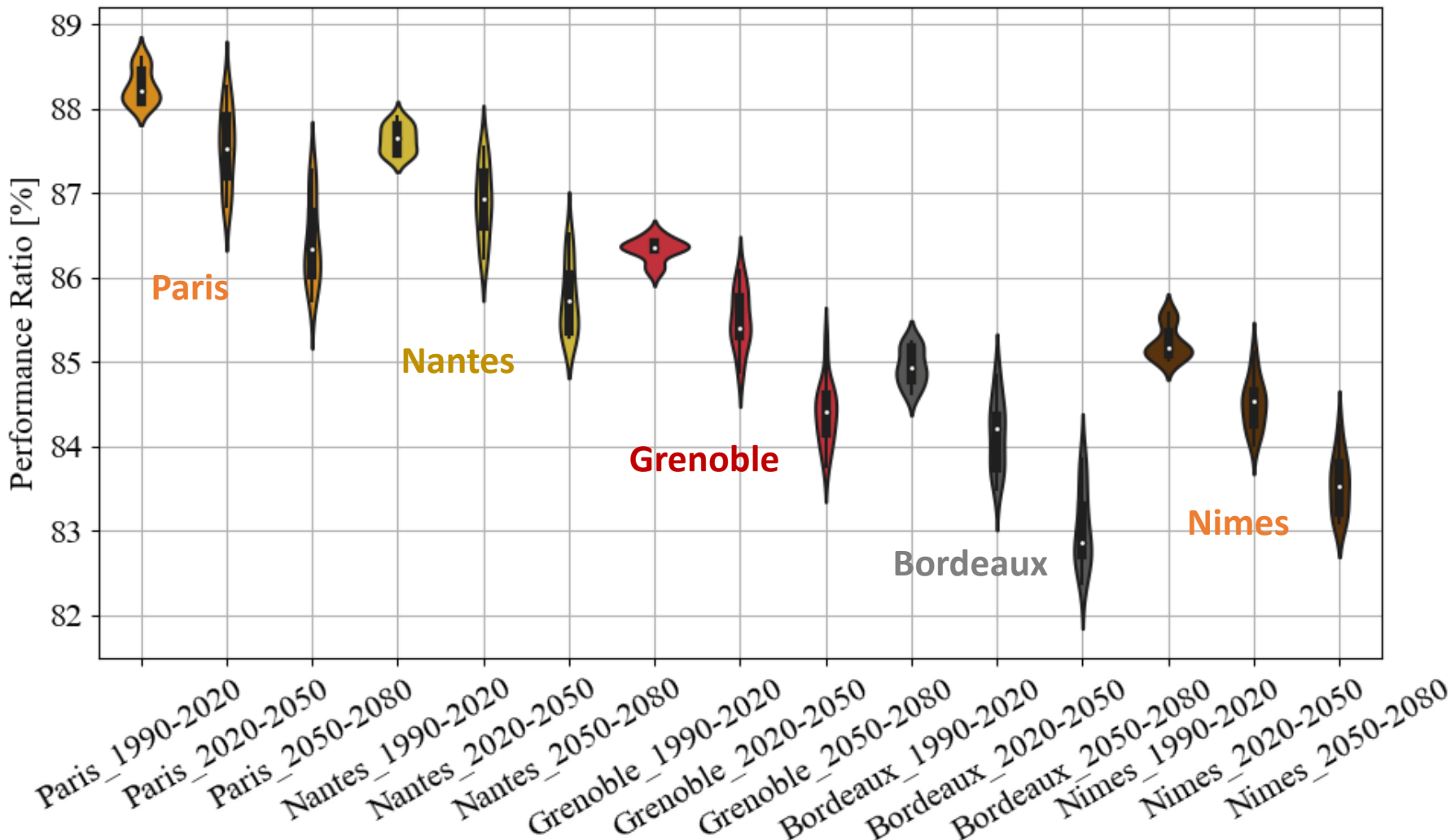
## Results, other French cities



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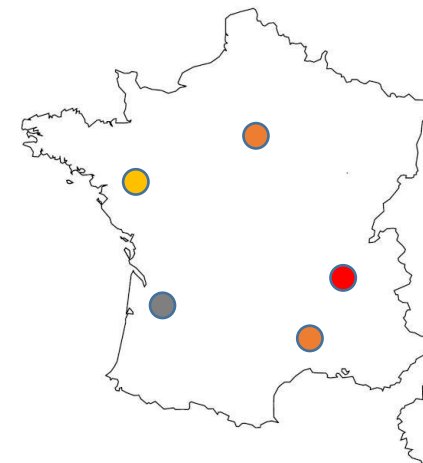
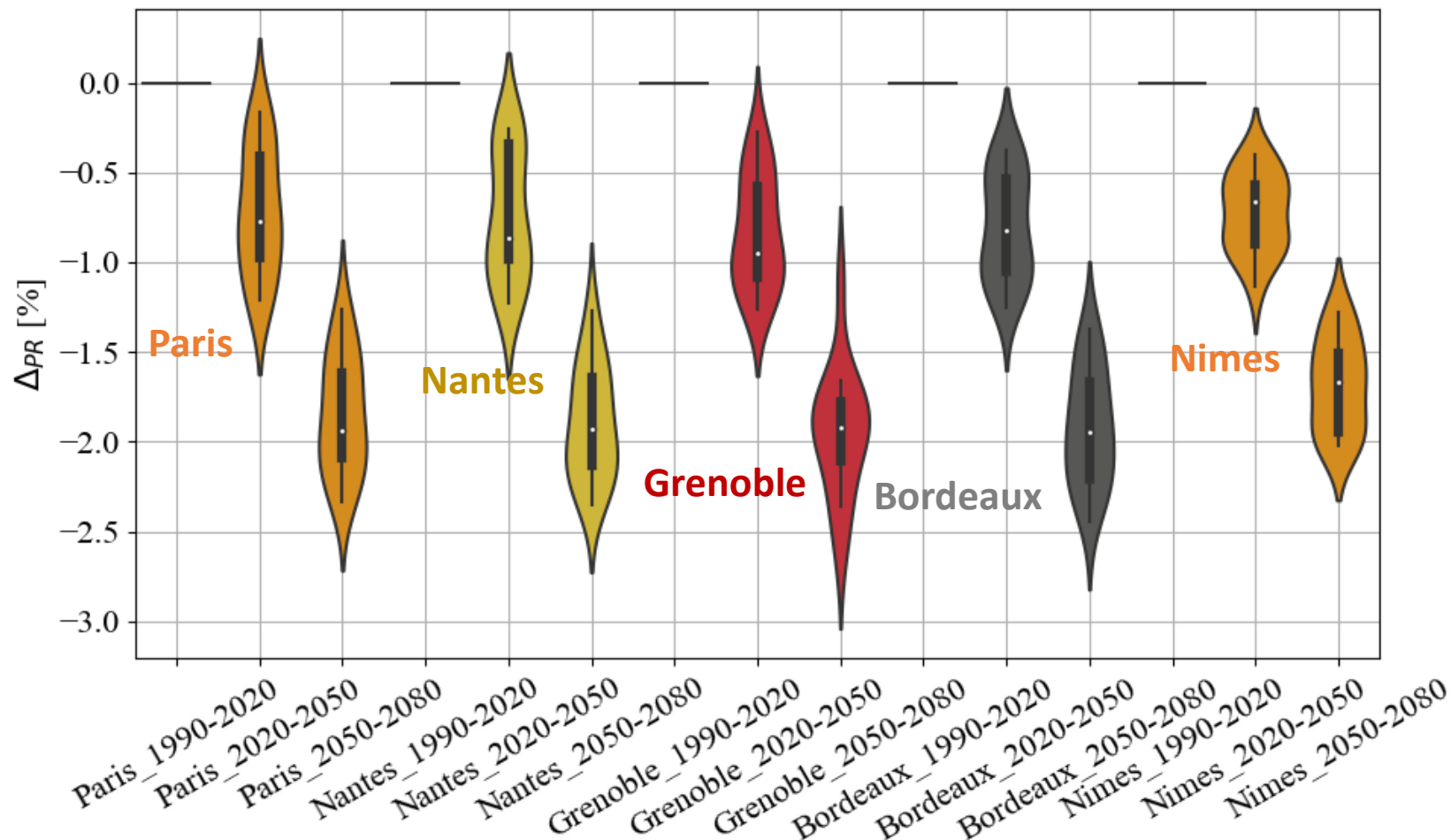


PR on 15 climate projections for different cities for a 30-year lifetime installation



## 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

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

- **Decrease in instantaneous power**
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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



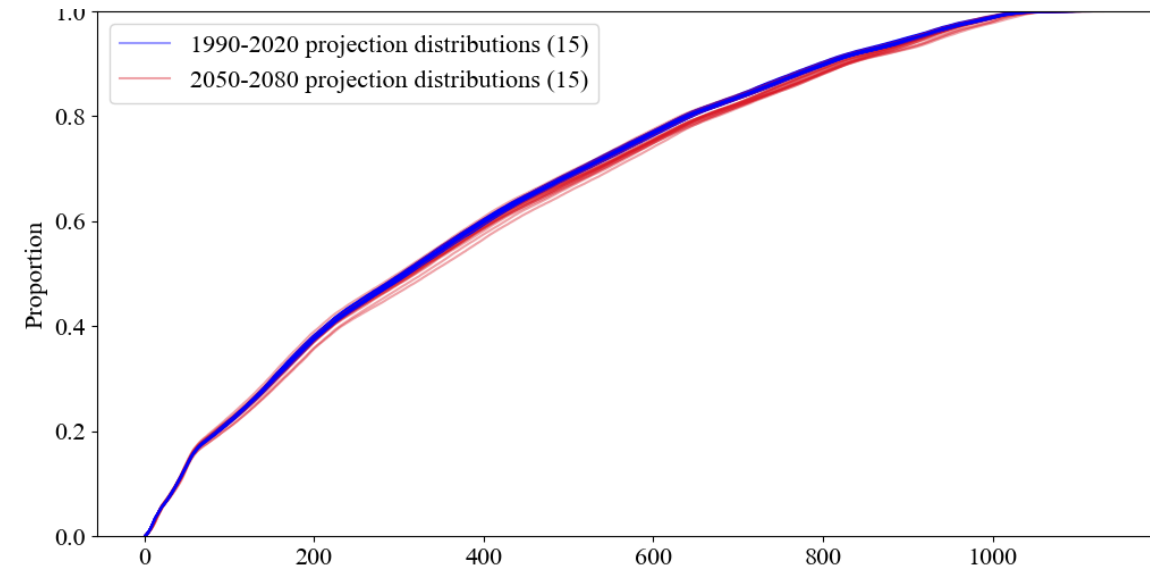
# Results, Bordeaux study case

## Environmental variables

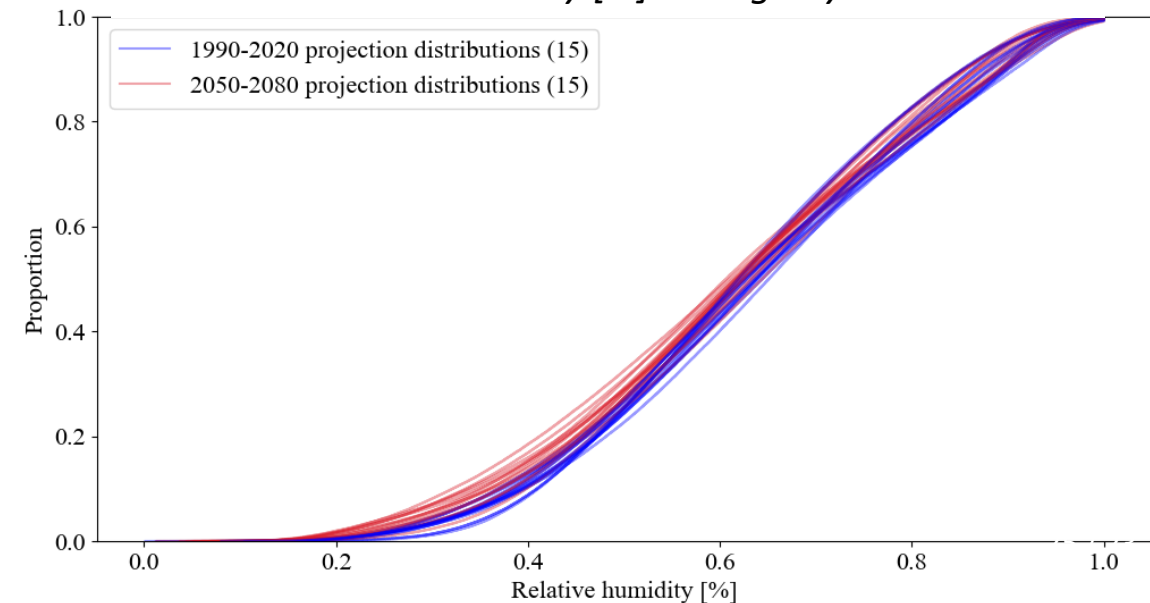
### 2050-2080 vs 1990-2020 (during daytime)

- Irradiation: Slight increase with +28 kWh/m<sup>2</sup>/year on average at most for all projections
- Relative humidity: Slight decrease with -1.1% 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*



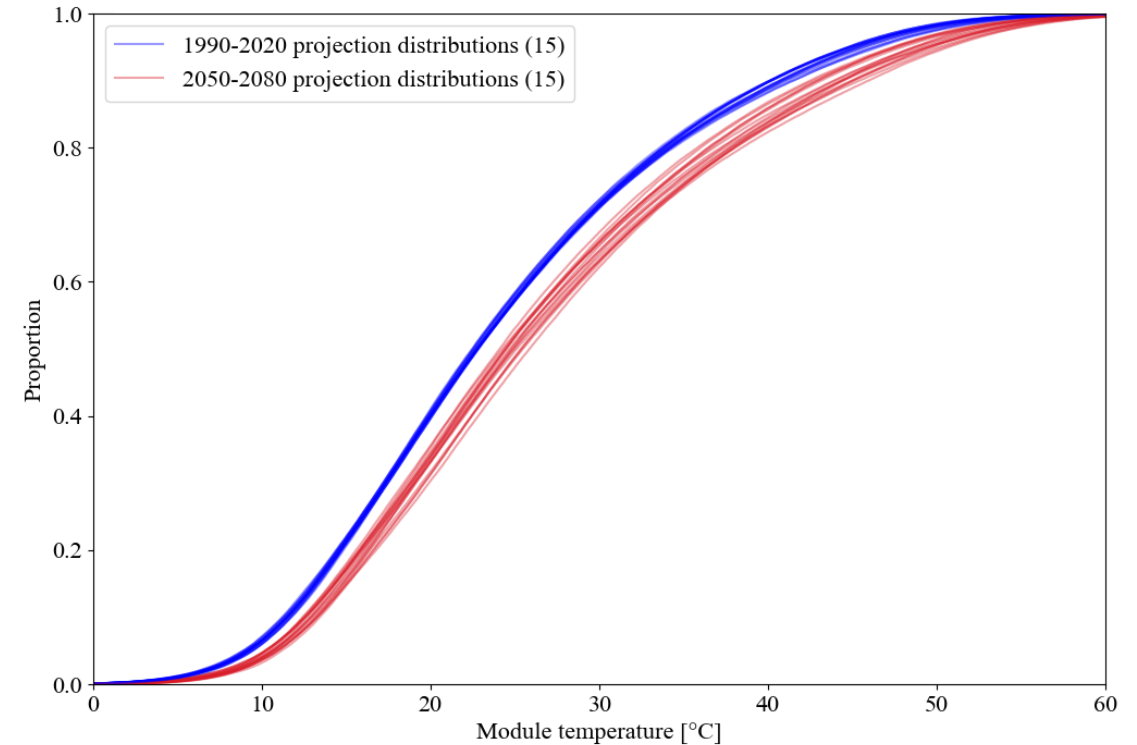
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## Environmental variables

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- Irradiation: Slight increase with +28 kWh/m<sup>2</sup>/year on average at most for all projections
- Relative humidity: Slight decrease with -1.1% on average at most for all projections
- Module Temperature:
  - Quantile 5%: 1.5°C
  - Average: +2°C
  - Quantile 95%: +3.5°C

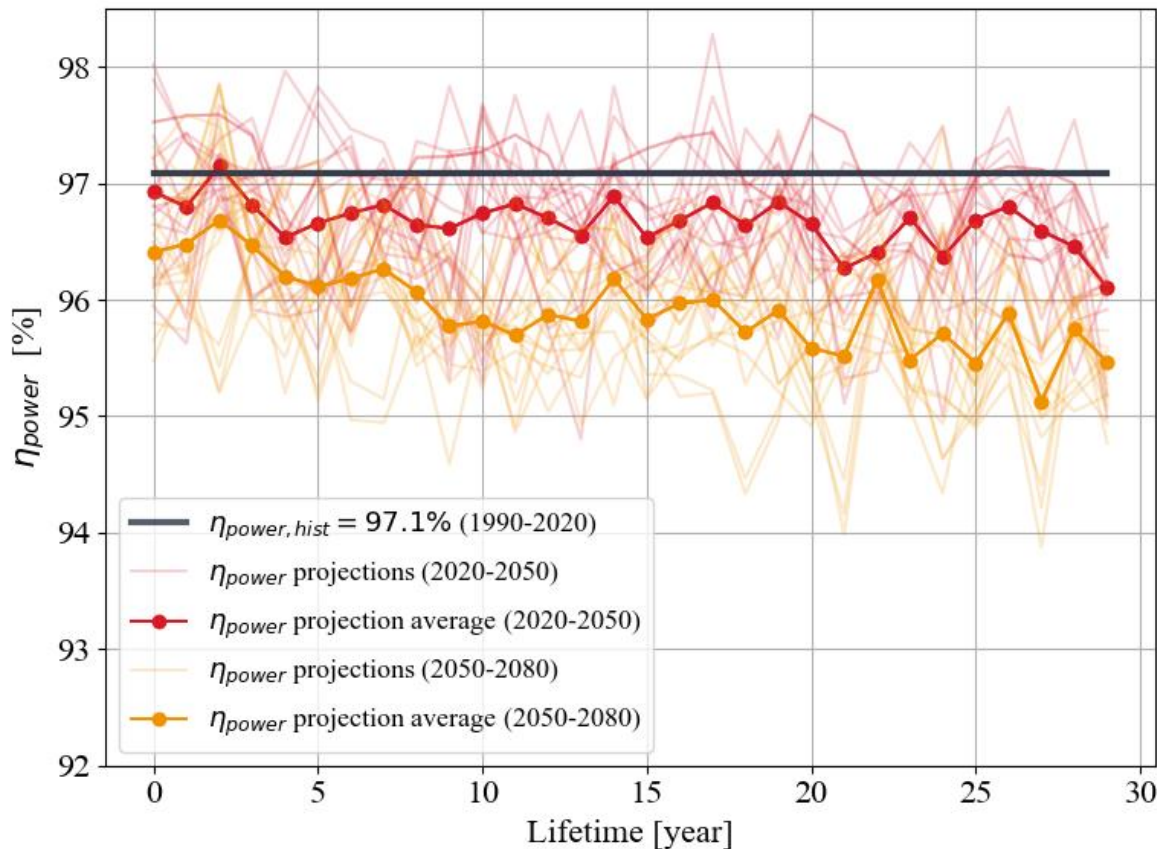
*The cumulative distribution function of the hourly module temperature [°C] during daytime*



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$\eta_{power}$  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
<b>1990-2020</b> (ERA5 dataset)	0.43 %
<b>2020-2050</b>	0.49% (median) [0.37%, 60%]
<b>2050-2080</b>	0.59% (median) [0.41%, 0.67%]