

Transmission spectra of multi-dimensional atmospheric simulations: computation and applications

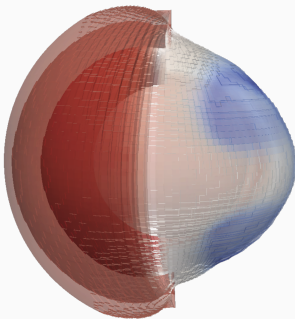
TauREx (1D/2D) & Pytmosph3R 2.0

Aurélien Falco (LAB Bordeaux - ECLIPSE team - Whiplash ERC)

Atmospheric model

Transmission spectrum

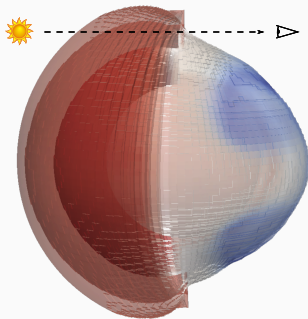
- Atmospheric grid



Atmospheric model

Transmission spectrum

- Atmospheric grid
 - Rays of light
- } Optical depth $\xrightarrow{\text{integral}}$ Transmittance \rightarrow Spectrum



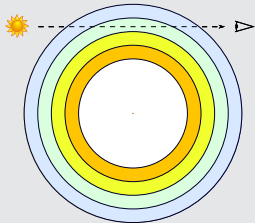
Atmospheric model

Transmission spectrum

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1D

- Very fast
- Retrievals
- Biases ([Pluriel et al., 2020](#))



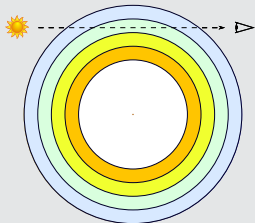
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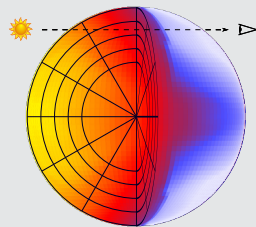
1D

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3D

- Realistic structure
- Too slow for retrievals (?)



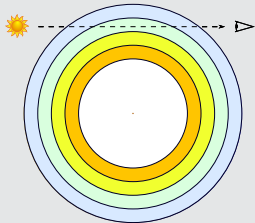
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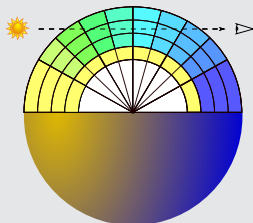
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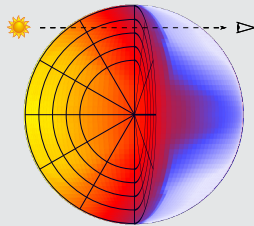
2D

- Fast enough (for retrievals)
- Day-night dichotomy of Ultra Hot Jupiters



3D

- Realistic structure
- Too slow for retrievals (?)



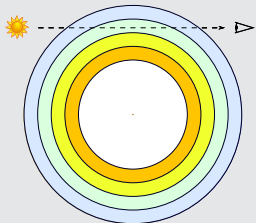
Atmospheric model

Transmission spectrum

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1D (TauREx)

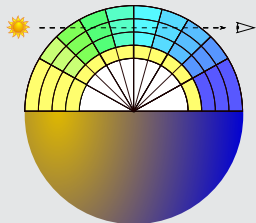
- $N_{z,\text{lay}}$ layers (ℓ)



(Al-Refaie et al., 2019)

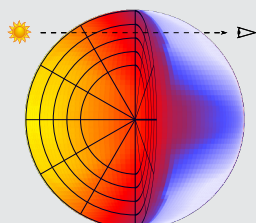
2D (TauREx)

- $N_{z,\text{lay}}$ layers (ℓ)
- N_α slices (solar zenith angle)



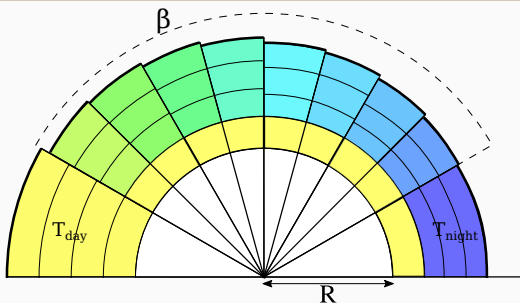
3D (Pytmosph3R)

- $N_{z,\text{lay}}$ layers (ℓ)
- N_{lat} latitudes (ϕ)
- N_{lon} longitudes (λ)



(Caldas et al., 2019)

Coordinate system: from levels to altitude coordinates



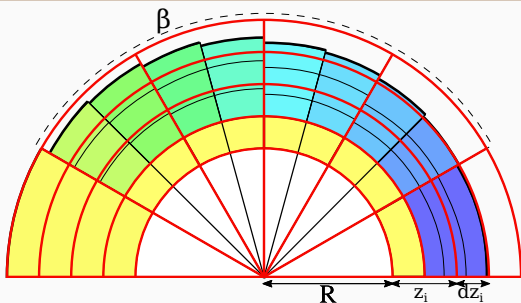
Coordinate system

- Radial coordinate: layers & levels (l)
- Horizontal grid: (α^*) in 2D or (ϕ, λ) in 3D

Input data for each cell (l) or (l, α^*) or (l, ϕ, λ)

- Pressure
- Temperature
- Gas Volume Mixing Ratios
- Aerosols Mass Mixing Ratios

Coordinate system: from levels to altitude coordinates



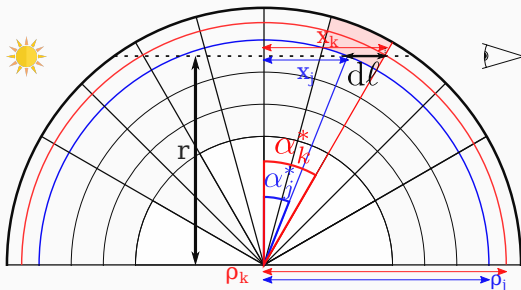
Coordinate system

- Radial coordinate: altitude (z)
- Horizontal grid: (α^*) in 2D or (ϕ, λ) in 3D

Interpolation of (z, ϕ, λ) using altitude

- Pressure
- Temperature
- Gas Volume Mixing Ratios
- Aerosols Mass Mixing Ratios

Rays subdivision through the altitude-based grid



Compute intersection points coordinates

1D

- Circles at each altitude (point j in blue)

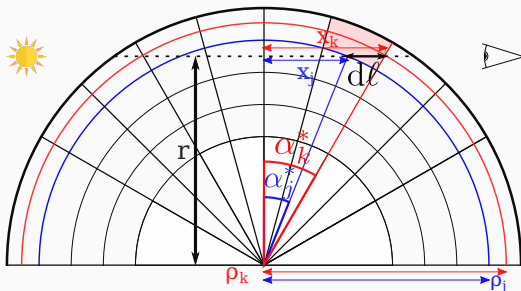
2D

- Circles at each altitude (point j in blue)
- Solar zenith angle lines (point k in red)

3D

- Spheres at each altitude (point j in blue)
- Latitudinal cones (point k in red)
- Longitudinal planes (point k in red)

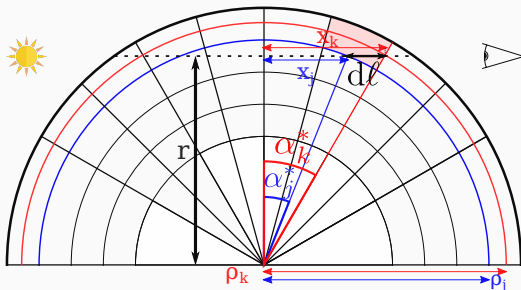
Rays subdivision through the altitude-based grid



Distance between points ($\Delta\ell$)

- Sort points according to their distance x to the terminator
- Cartesian distance $d\ell$ between two successive points
- Coordinates of each cell (2D/3D)
 - List for each ray (to get P, T, x)
 - Global dictionary for computing opacities (to avoid computing twice a cell)

Optical depth



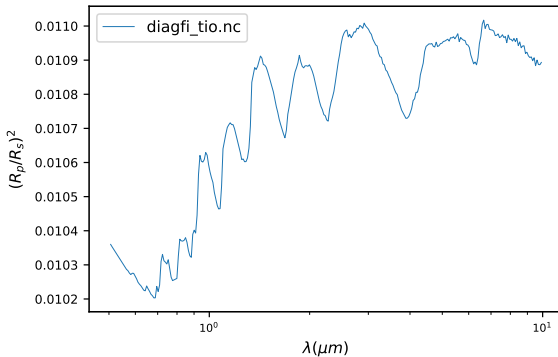
$$\tau_\lambda(\rho, \theta) = \sum_{c \in \text{Cells}[\rho, \theta], d\ell \in \Delta\ell[\rho, \theta]} \frac{P[c]}{k_B T[c]} \left(\sum_m \chi_m[c] \sigma_{m, \lambda} + \sum_{j < N_{\text{con}}} k_{mie, j} \right) d\ell \quad (1)$$

- $d\ell$ is the length of the segment of the ray at coordinates c
- Exo_k (Leconte, 2020) handles the opacities:
 - Correlated-k and cross-sections tables from multiple sources
 - Molecular, continuum absorptions, Rayleigh and Mie scatterings...

Integral → transmission spectrum

$$\Delta\lambda = \frac{R_p^2 + \sum_{\rho,\theta} (1 - e^{-\tau\lambda(\rho,\theta)}) S_\rho}{R_s^2}, \quad (2)$$

with $S_\rho = 2 \frac{(\rho+d\rho/2)d\rho}{N_\theta}$, where N_θ is the number of angular points in the grid of rays



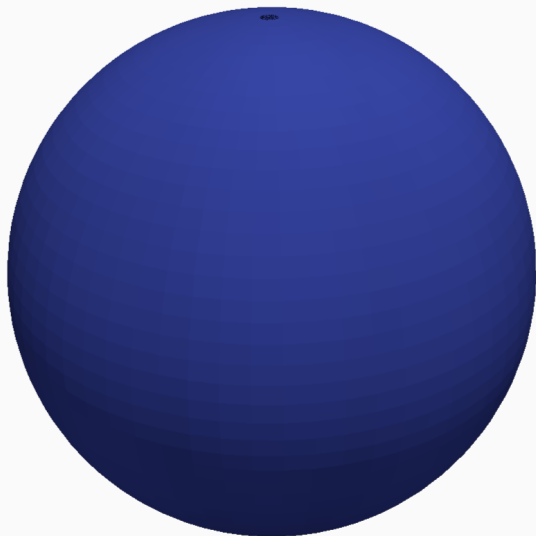
Three models

- 1D
- 2D
- 3D

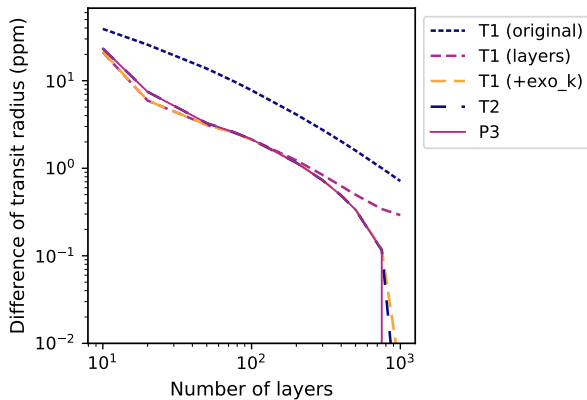
Test cases

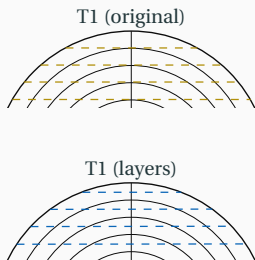
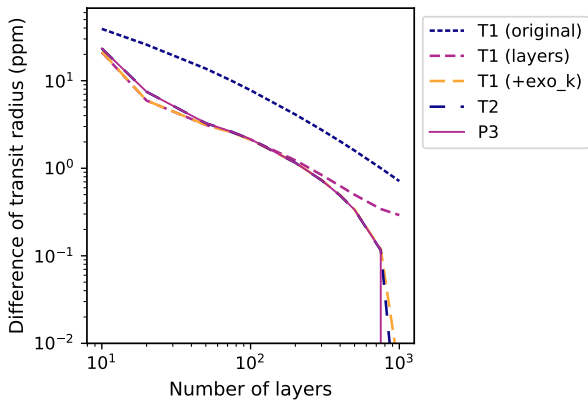
- Isothermal atmosphere
- 2D temperature map (day → night)
- 3D GCM (WASP-121b)

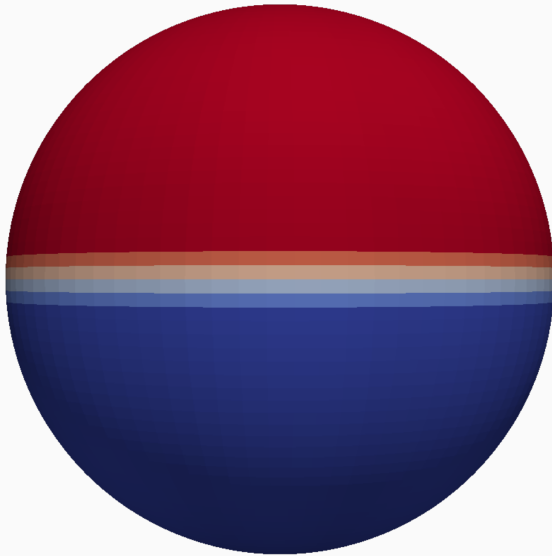
Isothermal atmosphere



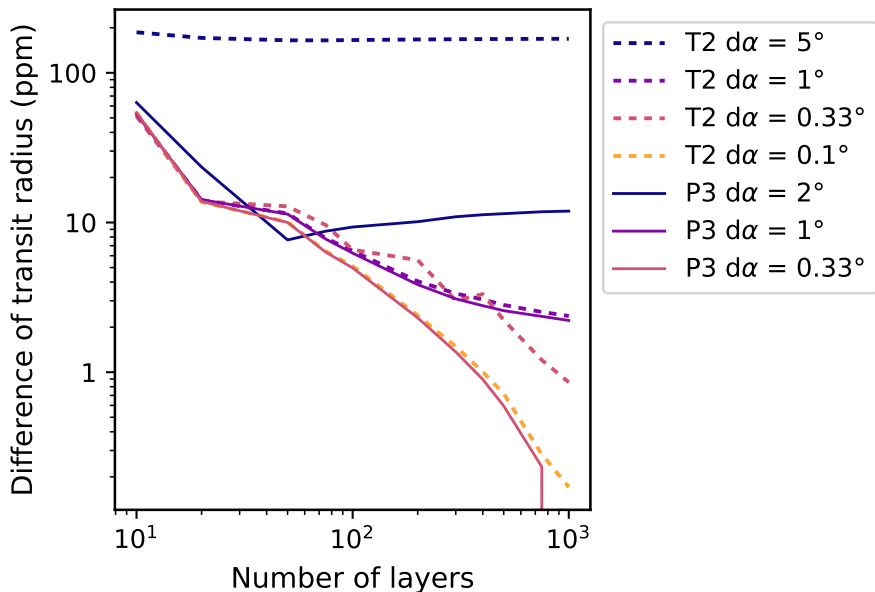
$T = 2500\text{K}$







T_{day}	T_{night}	T_{deep}
3300	500	2500



2D retrievals: performance of TauREx models

Retrievals → run many times one model

Optical depth

$$\mathcal{O}\left(\left(\frac{N_{z,\text{lay}}^2}{2} + N_{z,\text{lay}} \cdot N_\alpha\right) \cdot N_\lambda\right)$$

Interpolation of the opacities

$$\mathcal{O}\left(C \cdot N_{z,\text{lay}} \cdot N_\alpha \cdot N_\lambda \cdot N_{\text{mol}}\right)$$

$N_{z,\text{lay}}$: number of layers ; N_α : number of angles ; N_λ : number of wavelengths ; N_{mol} : number of molecules

$N_{z,\text{lay}}$	1D	N_α (2D)			
		2	10	20	30
100	0.26	0.52	1.20	1.99	2.80
200	0.78	1.73	3.05	4.72	6.32

Table 1: Average time (s) to run one TauREx model. Molecular absorption only (no Rayleigh scattering nor CIA), with four molecules on 39124 wavelengths from 0.3 to 15 μm .

2D retrieval of WASP-121b

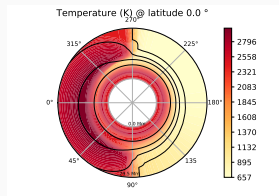
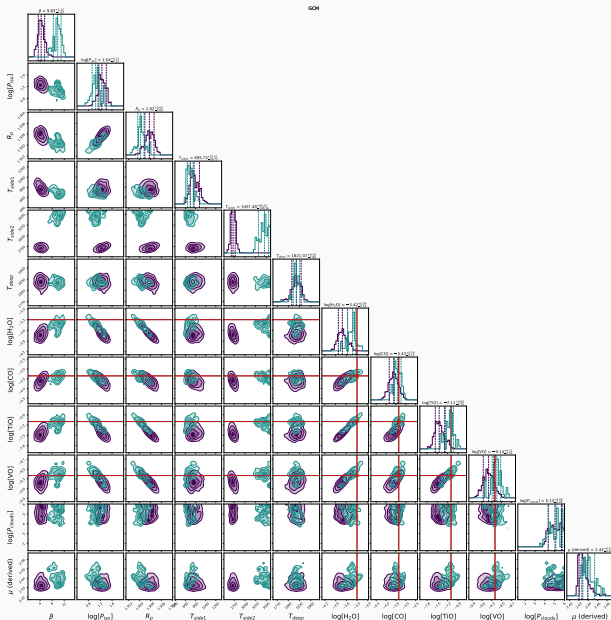
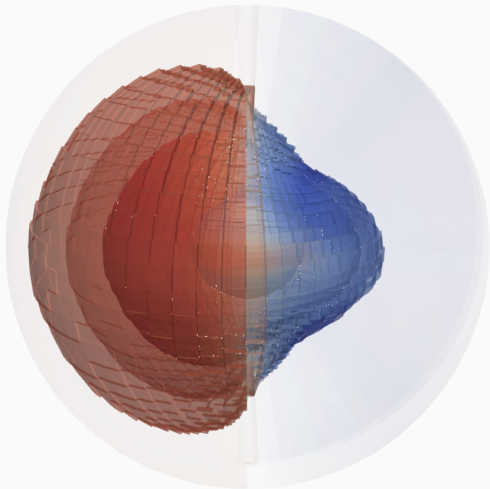


Figure 1: Input simulation

T_{day}	T_{night}	T_{deep}
3453	695	1821
2721	769	1821

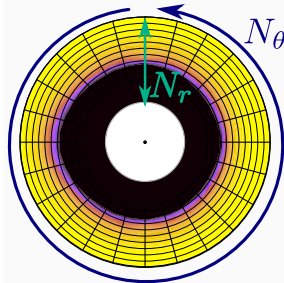
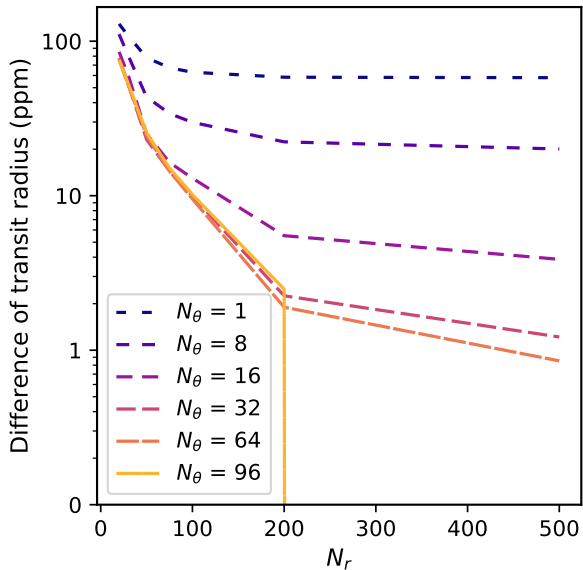
Table 2: Retrieved temperatures

3D ($T_{eq} = 2100\text{ K}$)



Pytmosph3R 2.0 - Pytmosph3R 1.3

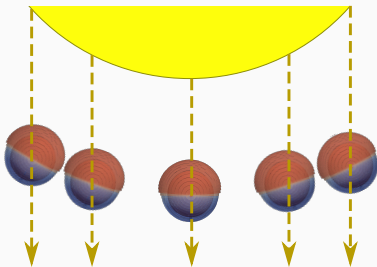
~10-50 ppm



GCM resolution

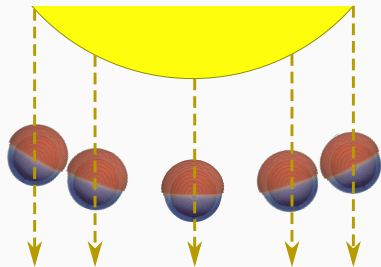
100x32x64

Rotation of the planet during transit: WASP-121b



	Ingress	Early	Mid	Late	Egress
Orbital phase ϕ	-15°	-13°	0°	$+13^\circ$	15°

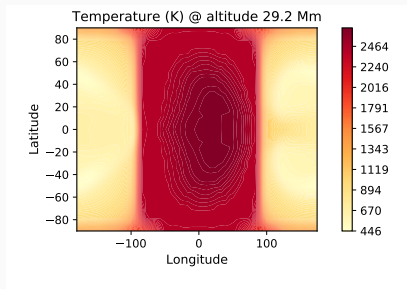
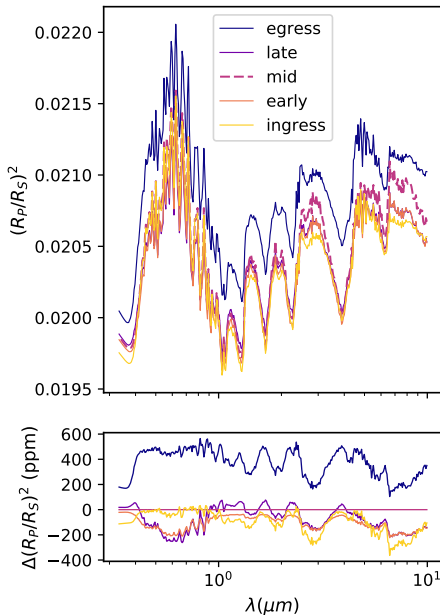
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Rotation of the planet during transit



Conclusion

Three models

- 1D & 2D with TauREx
- 3D with Pytmosph3R

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- Fast enough for retrievals ([Zingales et al. \(2021\)](#) in prep)

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3D (Pytmosph3R)

- Rotation: infer asymmetric east-west characteristics of the atmosphere

<http://perso.astrophy.u-bordeaux.fr/~jleconte/pytmosph3r-doc/index.html>

New release very soon!

- Papers under reviews ([Falco et al., 2021](#); [Pluriel et al., 2021](#))
- Parallel
- Emission
- Lightcurve

- Al-Refaie, A. F., Changeat, Q., Waldmann, I. P., and Tinetti, G. (2019). TauREx III: A fast, dynamic and extendable framework for retrievals.
- Caldas, A., Leconte, J., Selsis, F., Waldmann, I., Bordé, P., Rocchetto, M., and Charnay, B. (2019). Effects of a fully 3D atmospheric structure on exoplanet transmission spectra: retrieval biases due to day–night temperature gradients. *Astronomy & Astrophysics*, 623:A161.
- Falco, A., Zingales, T., Pluriel, W., and Leconte, J. (2021). Computation of transmission spectra using a 1D, 2D or 3D atmospheric structure. *Unpublished manuscript*.
- Leconte, J. (2020). Spectral binning of precomputed correlated-k coefficients. *arXiv preprint arXiv:2012.01428*.
- Pluriel, W., Leconte, J., Parmentier, V., Zingales, T., and Falco, A. (2021). Evolution of the biases in retrieved atmospheric composition of hot Jupiters. *Unpublished manuscript*.
- Pluriel, W., Zingales, T., Leconte, J., and Parmentier, V. (2020). Strong biases in retrieved atmospheric composition caused by day-night chemical heterogeneities. *A&A*, 636:A66.
- Zingales, T., Falco, A., Pluriel, W., and Leconte, J. (2021). TauREx 2D: Modelling 2D effects in retrieval. *Unpublished manuscript*.