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#### Reconstruction of thermodynamic cycles in a high resolution 1

### simulation of a hurricane.

OLIVIER M. PAULUIS \*

Courant Institute of Mathematical Sciences, New York University, New York, NY

Center for Prototype Climate Modeling, New York University in Abu Dhabi, Abu Dhabi, UAE.

# FUQING ZHANG

Department of Meteorology and Center for Advanced Data Assimilation and Predictability Techniques,

Pennsylvania State University, University Park, PA

-mart

<sup>\*</sup> Corresponding author address: Olivier Pauluis, CIMS, New York University, New York, NY, E-mail: pauluis@cims.nyu.edu

#### ABSTRACT

The relationship between energy transport and kinetic energy generation in a hurricane is analyzed. The hydrological cycle has a negative impact on the generation of kinetic energy. First, in a precipitating atmosphere, mechanical work must also be expended in order to lift water. Second, the injection of water vapor at low relative humidity and its removal through condensation and precipitation reduces the ability of a thermodynamic cycle to generate work. This reduction can be directly quantified in terms of the change in the Gibbs free energy between the water added and removed.

A newly developed approach, namely the Mean Air Flow As Lagrangian Dynamics Ap-12 proximation, is used to extract thermodynamic cycles from the standard output of a nu-13 merical simulation of a hurricane. While convection in the outer rainbands is inefficient 14 at producing kinetic energy, the deepest overturning circulation associated with the rising 15 air within the eyewall is an efficient heat engine that produces about 70% as much kinetic 16 energy as a comparable Carnot cycle. This confirms that thermodynamic processes play a 17 central role in hurricane formation and intensification, and that the thermodynamic cycles in 18 a hurricane are characterized by high generation of kinetic energy which differ significantly 19 from those found in atmospheric convection. 20

# <sup>21</sup> 1. Introduction

Intense winds in hurricanes and typhoons require a continuous generation of kinetic en-22 ergy within the storm to balance frictional dissipation. The hurricane circulation transports 23 energy received from the warm ocean to the colder atmosphere. In doing so, it acts as a 24 heat engine that produces the kinetic energy necessary to sustain the storm. The ability to 25 generate kinetic energy can be quantified by an efficiency defined as the fraction of the heat 26 input that is converted into kinetic energy. The efficiency depends on multiple environmental 27 factors, such as the temperature of the energy source and sink, or the relative humidity of 28 the air. In this paper, we will review these factors and show how to assess the efficiency for 29 storms simulated in high resolution atmospheric models. 30

The Carnot cycle is probably the best known theoretical model for a heat engine. Its 31 efficiency is the maximum efficiency of any closed thermodynamic cycle and is equal to 32 the ratio of the temperature difference between the heat source and sink to the absolute 33 temperature of the heat source. Hurricanes have at times been compared to a Carnot cycle 34 (Emanuel 1986, 2003; Willoughby 1999) in which the energy source is the warm ocean surface 35 and the energy sink corresponds to the radiative cooling of the troposphere. For a typical 36 ocean temperature of about 300K and tropopause temperature of 200K, hurricanes would 37 be able to convert up to one third of the energy input into kinetic energy. 38

However, not all heat engines act as Carnot cycle. There is a growing body of evidence 39 that the hydrological cycle leads to a substantial reduction of the generation of kinetic 40 energy by the Earth's atmosphere. This occurs for two reasons. First, a substantial fraction 41 of the work done by the atmosphere is used to lift water and is subsequently dissipated as 42 precipitation falls to the ground (Pauluis et al. 2000; Pauluis and Dias 2013). Second, the 43 atmosphere acts as a dehumidifier that gains water through evaporation in unsaturated air 44 but loses it as liquid water. This corresponds to a thermodynamic transformation in which 45 the reactant (water vapor) has a lower Gibbs free energy state than the product (liquid 46 water or ice). Such reaction cannot occur spontaneously in an isolated system and reduces 47

the ability of the system to generate mechanical work (Pauluis 2011). Several studies (Pauluis
and Held 2002a; Laliberte et al. 2015; Pauluis 2016) have confirmed the negative impacts of
the hydrological cycle on the atmospheric heat engine efficiency at both the convective and
global scales.

This raises the questions of whether hurricanes can generate kinetic energy at a rate 52 expected from a Carnot cycle, and, if so, of why hurricanes would be less affected by moist 53 processes than other atmospheric motions. To address this issue, we will analyze the thermo-54 dynamic behavior of an idealized hurricane simulation. Computing the mechanical output 55 of a thermodynamic cycle is straightforward for idealized cycles. This task is more difficult 56 for highly turbulent flows in which the trajectories of air parcels vary greatly and are not 57 periodic. To address this problem here, we use a new analytical framework, the "Mean Air 58 Flow As Lagrangian Dynamics Approximation" (MAFALDA hereafter, see Pauluis 2016). 59 Under MAFALDA, one first computes the overturning circulation in isentropic coordinates 60 by sorting rising and descending air parcels in terms of their equivalent potential tempera-61 ture. This mean circulation is then used to construct a set of thermodynamic cycles with the 62 same mass and heat transport as the total flow. The thermodynamic transformations along 63 these cycles are then analyzed to assess the impacts of moist processes on kinetic energy 64 generation in the hurricane. 65

Section 2 reviews the impacts of the hydrological cycle on the kinetic energy generation 66 in a generic thermodynamic cycle with condensation and precipitation. It shows that the 67 mechanical output of such a cycle is reduced by a Gibbs penalty term that accounts for 68 the addition and removal of water substance in different thermodynamic states. Section 69 3 describes the MAFALDA procedure and applies it to a hurricane simulation. Section 70 4 analyzes the thermodynamic cycles in our simulation to show that the thermodynamic 71 cycle associated with ascent within even even an efficiency comparable to that of 72 a Carnot cycle. Our results are summarized in Section 5. 73

# <sup>74</sup> 2. Impacts of the hydrological cycle on the atmospheric <sup>75</sup> heat engine.

We consider a schematic representation of the overturning circulation in a hurricane as 76 presented in Figure 1. As air rushes toward the center of the storm (point  $1 \rightarrow 2$ ), it gains 77 energy and entropy due to the energy flux from the surface.. It then ascends in the even even and the even and the even as the even of the 78 undergoing a near adiabatic expansion, and moves away from the storm center in the upper 79 troposphere (point  $2 \rightarrow 3$ ). The air is eventually brought back to the surface while losing 80 energy through the emission of infrared radiation (point  $3 \rightarrow 1$ ). These transformations 81 correspond to a heat engine which transports energy from the ocean surface to the upper 82 troposphere and is associated with a net conversion of internal energy into kinetic energy. 83

Quantitatively, we define the efficiency of a heat engine  $\eta$  as the ratio of the generation of kinetic energy  $W_{KE}$  to the external heating  $Q_{in}$ :

$$\eta = \frac{W_{KE}}{Q_{in}} \tag{1}$$

The potential intensity theory of Emanuel (1986) indicates that a hurricane acts in similar fashion to a Carnot cycle. In particular, the efficiency is equal to the well-known Carnot efficiency  $\eta_C$ :

$$\eta_C = \frac{T_{in} - T_{out}}{T_{in}} \tag{2}$$

where  $T_{in}$  and  $T_{out}$  are respectively the temperatures of the energy source and sink.

<sup>90</sup> While the total work and heat flux is proportional to the mass of air being circulated, <sup>91</sup> the efficiency is not. Here, we compute the energy flux and mechanical work per unit mass <sup>92</sup> of dry air circulated. The external heating  $\delta q$  can be directly assessed from the First Law of <sup>93</sup> Thermodynamics by:

$$\delta q = dh - \alpha_d \, dp. \tag{3}$$

Here, h is the enthalpy per unit mass of dry air,  $\alpha_d$  is the specific volume per unit mass of dry air, and p is the total pressure. The external heating here should be understood as external with respect to the parcel. It not only includes energy exchange with the surface and radiative cooling, but also diffusive energy transfer and frictional heating. The net energy source  $Q_{in}$  and net energy sink  $Q_{out}$  are defined as the integral of the positive and negative values of  $\delta_q$  along the cycle. Integrating 3 over a cycle, yields

$$Q_{in} + Q_{out} = W_{KE} + W_P. (4)$$

The left-hand side here is equal to the net heating, while the right-hand side is equal to the total amount of work produced. The later is separated into the generation of kinetic energy  $W_{KE}$ 

$$W_{KE} = -\oint \alpha_d dp - \oint \Gamma(r_v + r_i + r_l) \, dz.$$
(5)

<sup>103</sup> and the work done to lift water

$$W_P = \oint \Gamma(r_v + r_i + r_l) \, dz. \tag{6}$$

Here,  $\Gamma$  is the gravitational acceleration, and  $r_v$ ,  $r_l$  and  $r_i$  are respectively the mass of water vapor, liquid water and ice per unit mass of dry air.

To relate the generation of work to the energy transport, we can take advantage of the Gibbs relationship (see equation A.6) to rewrite the external heating (3) as

$$\delta q = Tds + \sum_{w=v,l,i} g_w \, dr_w. \tag{7}$$

Here, s is the moist entropy per unit mass of dry air, T is the temperature, and  $g_v$ ,  $g_l$  and  $g_i$  are the specific Gibbs free energy for water vapor, liquid water and ice. The Gibbs free energy terms are necessary here to fully account for the thermodynamic impacts associated with the addition and removal of water in different phases. These quantities are defined in the Appendix. Dividing equation (7) by the absolute temperature and integrating over a thermodynamic cycle yields

$$\frac{Q_{in}}{T_{in}} + \frac{Q_{out}}{T_{out}} + \frac{\Delta G}{T_{out}} = 0.$$
(8)

<sup>114</sup> We refer here to the term  $\Delta G$  as the Gibbs penalty and it is defined as

$$\Delta G = -T_{out} \oint \sum_{w=v,l,i} \frac{g_w}{T} \, dr_w. \tag{9}$$

Equations (4) and (8) can be combined to yield an expression for the generation of kinetic energy:

$$W_{KE} = \frac{T_{in} - T_{out}}{T_{in}} Q_{in} - W_P - \Delta G.$$

$$\tag{10}$$

The first term on the right-hand side is the work that would have been produced by a Carnot cycle. The generation of kinetic energy is less than this theoretical maximum due to the work necessary to lift the water  $W_P$  and due to the thermodynamic impact of the hydrological cycle quantified in terms of the Gibbs penalty  $\Delta G$ .

In the idealized cycle, water vapor is added as unsaturated water vapor and removed mostly as liquid water or ice. The Gibbs free energy of unsaturated water vapor is always less than that of liquid water at the same temperature with  $g_v - g_l = R_v T \ln \mathcal{H}$ , where  $R_v$ is the specific gas constant for water vapor and  $\mathcal{H}$  is the relative humidity. This implies that water is added to the cycle at a lower Gibbs free energy than it is removed, thus corresponding to a positive value of the Gibbs penalty and a reduction of the mechanical output.

A physical process, such as condensation of unsaturated water vapor, in which the Gibbs 128 free energy of the products is higher than that of the reactants cannot occur under isothermal 129 and isobaric condition, as it would imply a violation of the Second Law of Thermodynam-130 ics. Indeed, in such situation, the reverse reaction, e.g. the evaporation of liquid water 131 in unsaturated air, occurs spontaneously. As the transformations involved in the idealized 132 hurricane cycle described in Figure 1 are neither isothermal nor isobaric, they can result in a 133 net increase in the Gibbs free energy without violating the Second Law. However, equation 134 (10) indicates that, when this happens, the cycle must be associated with a heat transport 135 from warm to cold, and the mechanical output is reduced by an amount equal to the Gibbs 136 penalty. 137

The difference of Gibbs free energy between water vapor and liquid water,  $g_v - g_l = R_v T \ln \mathcal{H}$ , is equal to the amount of work that could be produced by the isothermal expansion of water vapor from its saturation partial pressure to its actual partial pressure. And indeed, this is equal to the amount of work that is produced if water vapor first evaporates in saturated condition then expands to reach the partial pressure in the environment. However, when evaporation occurs in unsaturated air, water molecules irreversibly diffuse into unsaturated air, without generating any mechanical work. Instead, there is an irreversible increase of entropy equal to the increase of Gibbs free energy divided by the absolute temperature. Thus, the Gibbs penalty can be thought of as the amount of work that the thermodynamic cycle fails to produce due to the thermodynamic irreversibility tied to the hydrological cycle.

# <sup>148</sup> 3. Reconstruction of thermodynamic cycles from nu <sup>149</sup> merical simulations

#### 150 a. Numerical model and set-up

We analyze here the thermodynamic behavior of a hurricane simulated with the Advanced 151 Research version of the Weather Research and Forecasting (WRF-ARW) model version 3.1.1 152 Skamarock et al. (2008). In this configuration, the model uses three two-way nested domains, 153 with respective sizes of 4320 km by 4320 km, 1440 km by 1440 km, and 720 km by 720 km, 154 and with horizontal grid spacings of 18, 6, and 2 km. The model has 41 vertical levels with 155 the model top at 50 hPa. The two smaller nested domains are moveable, with the domain 156 center following the 850-hPa center of the tropical cyclones. The physical parameterizations 157 are the same as in Zhang and Tao (2013) and Tao and Zhang (2014). It should be noted 158 that the turbulent parameterization used in WRF does not include a frictional heating, i.e. 159 the kinetic energy loss to dissipation is not put back as internal energy. Bister and Emanuel 160 (1998) have suggested that the inclusion of frictional heating can lead to more intense tropical 161 storms. The model is initialized with a modified Rankine vortex with a maximum surface 162 wind speed of  $15 \text{ ms}^{-1}$  at 135 km radius. The Dunion non-SAL mean hurricane season 163 sounding (Dunion 2011) is used for the environmental moisture and temperature profile 164

with a constant sea surface temperature of 29°C (SST29) and a constant Coriolis parameter equivalent to 20N. The initial condition and model setup are the same as the noflow-SST29 in Tao and Zhang (2014) but without moisture perturbation.

Figure 2 shows the evolution of the maximum wind and minimum pressure. The hurricane 168 reaches its maximum intensity by the end of day 5, with a central pressure of 885 mb and 169 a maximum wind speed of 97 ms<sup>-1</sup>. The storm maintains its intensity for the remaining 10 170 days of simulation, with a slight increase in surface pressure by day 15. As the experimental 171 set-up used here does not include radiative transfer, the atmosphere will slowly evolve toward 172 a state of a thermal equilibrium with the ocean, with no convection or wind. Over the 173 course of the simulation, we observe an increase in low level humidity away from the storm, 174 a warming of the upper-troposphere, and a reduction of the convective activity far away from 175 the storm center. All these are consistent with a slow evolution toward thermal equilibrium. 176 The storm however occupies only a small fraction of the domain and, as noted earlier, its 177 intensity remains steady for the last 10 days of the simulation. Our main focus here is 178 to analyze the thermodynamic cycles that underlie the storm, and we chose here to focus 179 primarily on the intensifying storm on day 5 of the simulation. 180

Figures 3A shows the mean azimuthal wind during the fifth day of the simulation. It exhibits a well defined maximum near the surface at a radius of about 40 km from the storm center. The strong vortex extends through the entire troposphere. Further away from the center, in the upper troposphere, the circulation is anticyclonic, as evidenced by the negative azimuthal wind.

Figure 3B shows the distribution of equivalent potential temperature  $\theta_e$ . The equivalent potential temperature here is defined with respect to ice, as in Pauluis (2016). The definition of  $\theta_e$  used here includes a contribution from the latent heat of freezing, and is slightly higher than the equivalent potential temperature over liquid water as defined in Emanuel (1994). Away from the center of the storm, the equivalent potential temperature shows a vertical structure typical of the tropical regions, with high value near the surface,  $\theta_e \approx 360$ K, a lower <sup>192</sup> tropospheric minimum with  $\theta_e \approx 335$ K at an altitude of 4-5km, then a slow increase in the <sup>193</sup> upper troposphere. The stratosphere is not shown in Figure 3B but it exhibits an enhanced <sup>194</sup> stratification. Toward the center of the storm, the equivalent potential temperature increases <sup>195</sup> and the midtropospheric minimum of  $\theta_e$  becomes less pronounced. The eyewall appears as <sup>196</sup> a region of almost constant value of  $\theta_e$ .

<sup>197</sup> The secondary circulation can be quantified in terms of an Eulerian streamfunction

$$\Psi_E(r,z) = \int_0^r \rho w r dr, \qquad (11)$$

which is shown in Figure 3C. The streamfunction shows a direct overturning circulation, with inflow at low level, rising motion in the eyewall and outflow in the upper troposphere. Figure 3C also indicates another inflow in the upper troposphere located between 10 and 12km, below the main outflow. Similar upper level inflows have been noted in other numerical simulations of hurricanes, such as Rotunno and Emanuel (1987).

#### 203 b. The Mean Air Flow As Lagrangian Dynamics Approximation

The analysis of the thermodynamic cycles in the previous section requires us to know the evolution of the thermodynamic properties of an air parcel. Most atmospheric flows are highly turbulent, and not only are all parcel trajectories different, but they almost never correspond to a closed thermodynamic cycle. To circumvent this problem, Pauluis (2016) introduced MAFALDA, a systematic approach designed to extract a set of representative cycles from numerical simulations of turbulent atmospheric flows. The method consists of 4 distinct steps:

i. Compute the isentropic streamfunction in  $z - \theta_e$  coordinates;

ii. Estimate the conditional average of thermodynamic state variables as function of zand  $\theta_e$ ;

iii. Construct a set of trajectories in  $z - \theta_e$  from the isentropic streamfunction;

9

iv. Interpolate the values of the various state variables along these trajectories;

#### 216 1) ISENTROPIC STREAMFUNCTION

<sup>217</sup> Under MAFALDA, one first computes a mean overturning circulation using height (z)<sup>218</sup> and equivalent potential temperature  $\theta_e$  as coordinates. It is quantified in terms of the <sup>219</sup> isentropic streamfunction  $\Psi(z, \theta_e)$  shown in Figure 4, defined as the net upward mass flux <sup>220</sup> at height z of all air parcels with an equivalent potential temperature less than  $\theta_{e0}$ :

$$\Psi(z,\theta_{e0}) = \frac{1}{P} \int_{t_0}^{t_0+P} \int_0^{2\pi} \int_0^{r_0} \rho(w-\overline{w}) H(\theta_{e0} - \theta_e(r,\phi,z,t)) \, r dr \, d\phi \, dt.$$
(12)

Here, P = 1 day is the time period for the averaging,  $r_0 = 800$  km is the radius of the domain 221 used for averaging,  $\rho$  is the mass of dry air per unit volume, w is the vertical velocity,  $\overline{w}(r, z)$  is 222 the mass weighted horizontally averaged velocity for  $r < r_0$  and H is the Heaviside function. 223 Note that the integral in (12) is computed only for a central part of the simulated domain. 224 Convection far away for the storm center dominates the isentropic streamfunction when it 225 is computed over the entire domain, making the thermodynamic structure of the hurricane 226 more difficult to distinguish. We choose here to limit the isentropic analysis to an area 227 relatively close to the storm instead. The isentropic streamfunction is introduced in Pauluis 228 and Mrowiec (2013) and its application to hurricanes is discussed in Mrowiec et al. (2016). 229

The isentropic streamfunction averaged over the 5th day of the simulation is shown in Figure 4. For a steady flow, the mean flow in  $z - \theta_e$  coordinates follows the isolines of the streamfunction. In Figure 4, this flow would be clockwise, with air rising at high value of  $\theta_e$ near the center of the storm and subsiding at lower  $\theta_e$  much further away. The ascent in the eyewall corresponds to rising motions at very high value of  $\theta_e$ , here for  $365K < \theta_e < 380K$ . The ascent of high  $\theta_e$  air in the eyewall accounts for only one third of the total the overturning, with the bulk of the ascent occurring at lower value of  $\theta_e$ , with  $355K < \theta_e < 365K$ .

There are substantial differences between the overturning identified by the Eulerian and isentropic streamfunctions depicted respectively in Figure 3C and Figure 4. Notably,

the mass transport is much larger in the isentropic analysis, with a maximum value of 239 about  $1.4 \, 10^{10} kg s^{-1}$ , than in the Eulerian frame, which has a maximum value of about 240  $0.6 \, 10^{10} kg s^{-1}$ . The maximum of the isentropic streamfunction is also located near the sur-241 face, while the Eulerian streamfunction peaks in the upper troposphere. In addition, the 242 isentropic analysis indicates that rising air parcels exhibit high value of  $\theta_e$ , with  $\theta_e > 355K$ , 243 which is substantially larger than the value of  $\theta_e$  found in the free troposphere away from the 244 boundary layer and eyewall. These differences can be attributed to the mass transport by 245 convective motions, which is not accounted for by the Eulerian averaging. We will refer the 246 interested readers to Mrowiec et al. (2016) for a more detailed discussion of the difference 247 between isentropic and Eulerian circulations in hurricanes. 248

#### 249 2) MAFALDA TRAJECTORIES:

In MAFALDA, the isolines of the isentropic streamfunction are treated as parcel trajectories. For a given value of the streamfunction  $\Psi_0$ , we construct a parametric representation  $(z(\lambda), \theta_e(\lambda))$  of the isoline such that

$$\Psi(z(\lambda), \theta_e(\lambda)) = \Psi_0. \tag{13}$$

We focus here on two distinct cycles corresponding to 2.5% and 42.5% of the absolute minimum of the streamfunction. Three locations are marked along each cycle: point 1 is the minimum entropy, point 2 corresponds to the maximum entropy at the surface, and point 3 is the highest point in the cycle.

The first trajectory, indicated by the solid black line, is referred here to as the inner-core cycle, and is associated with air parcels rising at very high equivalent potential temperature, with  $\theta_e \approx 370K$ . The second trajectory, which we will refer to as the rainband cycle, is representative of air parcels that rise at lower value of the equivalent potential temperature, with  $\theta_e \approx 350K$  in the upper troposphere. These two trajectories are shown respectively as the solid black line and the blue dashed lines in Figures 3A-C. To convert a trajectory in isentropic coordinates  $\theta_e - z$ , to the Eulerian coordinates r - z, we compute the mean radius associated with air parcels at a given value of z and  $\theta_e$  as discussed in the next subsection. Figure 3A shows that the inner-core cycle indeed corresponds to an air parcel that penetrates to near the center of the storm, rises to the tropopause within the eyewall before moving outward and subsiding far away from the center. In contrast, the rainband cycle is associated with rising motion further away from the center, in the region associated with the outer rainbands of the storms.

#### 270 3) ISENTROPIC AVERAGE OF STATE VARIABLES

To evaluate the value of the various properties of the air parcels along the streamlines, we compute their mass-weighted conditionally averaged value in  $z - \theta_e$  coordinates. First, for any function f(x, y, z, t), we introduce its isentropic integral  $\langle f \rangle$  as

$$\langle f \rangle (z, \theta_{e0}) = \frac{1}{P} \int_{t_0}^{t_0+P} \int_0^{2\pi} \int_0^{r_0} f\delta(\theta_{e0} - \theta_e(r, \phi, z, t)) r \, dr \, d\phi \, dt,$$

where  $\delta$  is the Dirac delta function. The mass-weighted average of f is defined as

$$\tilde{f}(z,\theta_{e0}) = \frac{\langle \rho f \rangle}{\langle \rho \rangle}.$$

Figure 5 shows the isentropic average for the radius  $\tilde{r}$ , azimuthal wind, specific moist 275 entropy  $\tilde{s}$ , temperature  $\tilde{T}$ , mixing ratio  $\tilde{r}$  and Gibbs free energy  $\tilde{g}_v$ , respectively. The radius 276 distribution in Figure 5A shows that air with high  $\theta_e$  is preferentially located near the 277 storm center, while low energy air parcels, with  $\theta_e$  less than 345K, are located far away 278 from the center, with  $\tilde{r} \geq 500$  km. At low levels, the radius  $\tilde{r}$  decreases with increasing 279  $\theta_e$ , corresponding to the gradual moistening of the air toward the center of the storm. The 280 azimuthal wind  $\tilde{u}$  is shown in Figure 5B. The strongest wind corresponds to the air with high 281  $\theta_e$  near the surface. A benefit of the isentropic averaging here is to magnify the structure of 282 the eyewall. Indeed, while the eyewall occupies a small physical area near the storm center, 283 it is associated with a fairly broad range of high values of  $\theta_e$  between 355K and 375K. 284

Figures 5C and 5D show the distribution of moist entropy  $\tilde{s}$  and temperature  $\tilde{T}$ . There is 285 a close relationship between equivalent potential temperature and entropy, which translates 286 in that the isolines for  $\tilde{s}$  are almost vertical. Similarly, the isolines for temperature  $\tilde{T}$  are 287 almost horizontal, as the the temperature variations are closely tied to changes in height. 288 The water vapor distribution (Figure 5E) shows high value near the surface and at high 289 equivalent potential temperature. The decreases of water vapor with height is due to the 290 decrease in temperature through the Clausius Clapeyron relationship. At a given height, 291 fluctuations of water vapor are strongly linked to the horizontal variations of equivalent 292 potential temperature. Figure 5F shows the distribution of the Gibbs free energy of water 293 vapor  $g_v$ . The variations of  $g_v$  are foremost determined by relative humidity. At high value of 294  $\theta_e$ ,  $g_v$  is close to 0, indicating that these air parcels are saturated with respect to liquid water. 295 Lower values of  $\theta_e$  are associated with large negative value of  $g_v$  in the unsaturated storm 296 environment. In the upper troposphere, the Gibbs free energy is negative as condensation 297 over ice reduces the water vapor pressure well below its saturation value over liquid water. 298

#### 299 4) STATE VARIABLES ALONG THE MAFALDA TRAJECTORIES:

State variables along given MAFALDA trajectories are taken to be equal to the corresponding isentropic average at the same value of z and  $\theta_e$ , e.g.:

$$s(\lambda) = \tilde{s}(z(\lambda), \theta_e(\lambda)).$$

This procedure allows us to estimate the value of any state variable along any of the MAFALDA trajectories. The solid black line and the dashed blue line on Figure 5 show the MAFALDA trajectories associated with the cycles superimposed on the isentropic average for various state variables.

We apply the MAFALDA procedure to reconstruct the thermodynamic cycles during the 5th day of our simulation. Figure 6 shows the results for the inner-core cycle and the rainband cycles under six different coordinate pairs: moist entropy (s) and temperature (T)

(Figure 6A); buoyancy b and height z (Figure 6B); total water content  $r_T = r_v + r_l + r_i$ 309 and height z (Figure 6C); mixing ratio q and Gibbs free energy for water vapor  $g_v$  (Figure 310 6D); liquid water content  $r_l$  and Gibbs free energy for liquid water  $g_l$  (Figure 6E); and ice 311 water content  $q_i$  and Gibbs free energy for ice  $g_i$  (Figure 6F). The axes are chosen so that 312 the trajectories are going clockwise in all four panels, with x and y directions corresponding 313 qualitatively to increasing radius and increasing height. Three locations are marked along 314 each cycles: point 1 is the entropy minimum, point 2 corresponds to the maximum entropy 315 at the surface, and point 3 is the highest point in the cycle. 316

# <sup>317</sup> 4. Thermodynamic cycles in a simulated hurricane

The MAFALDA procedure has allowed us to extract thermodynamic cycles from the numerical model output. We now turn to the physical interpretation of the cycles in various thermodynamic coordinates as shown in Figure 6, and their implications for the generation of kinetic energy.

In the T-S diagram (Figure 6A), the two trajectories exhibit features of a heat engine. 322 For the inner-core cycle, the first transformation from 1 to 2 leads to an entropy increase 323 from  $200JK^{-1}kg^{-1}$  to  $300JK^{-1}kg^{-1}$  due to the energy fluxes from the ocean surface. The 324 second transformation from 2 to 3 corresponds to an expansion with approximately constant 325 moist entropy but decreasing temperature from 300K to about 200K. In the last leg from 326 3 to 1, the parcel is compressed back to the surface and its temperature increases from 327 200K to about 300K. As first, the parcel loses energy and its entropy decreases from about 328  $300JK^{-1}kg^{-1}$  to  $200JK^{-1}kg^{-1}$ . Closer to the surface, water vapor gained from mixing with 329 cloudy air leads to an entropy increase from  $200JK^{-1}kg^{-1}$  to  $240JK^{-1}kg^{-1}$ . 330

The rainband cycle differs from the inner-core cycle in three aspects. First, the entropy increase in the inflow portion of the cycle  $(1 \rightarrow 2)$  is substantially less for the rainband cycle indicative of weaker surface energy fluxes. Second, the entropy decreases from about 280 to <sup>334</sup>  $250JK^{-1}$  during the ascent  $(2 \rightarrow 3)$ . This loss of entropy occurs as the air parcel loses water <sup>335</sup> vapor through detrainment and mixing: a reduction of entropy of  $30JK^{-1}kg^{-1}$  corresponds <sup>336</sup> approximatively to a loss of 3g/kg of water vapor. Finally, the rainband cycle is shallower, <sup>337</sup> reaching a height of 12km and its minimum temperature (at about 220K) is substantially <sup>338</sup> warmer than for the inner-core cycle.

Figure 6B shows the two cycles in buoyancy and height coordinates. The buoyancy here is given by

$$b = \Gamma \left( \frac{T - \overline{T}}{\overline{T}} + \frac{R_v}{R_d} (r_v - \overline{r}_v) - (r_T - \overline{r}_T) \right),$$

where the overbar denotes the horizontal average. In an anelastic model, the generation of 341 kinetic energy would be proportional to the integral of  $\oint bdz$ , i.e. the area within the curve 342 shown in Figure 6B. As the Mach number in a hurricane is high, the anelastic approximation 343 is inaccurate, and the generation of kinetic energy should be computed by the integral (10). 344 Nevertheless, we use here the buoyancy-height coordinates as it makes it easier to visualize 345 the cycles. In both cycles, rising air is lighter than descending air, so that the cycles are 346 associated with a net generation of kinetic energy. The variations of buoyancy in the inner-347 core cycle are particularly large - reaching up to  $0.4ms^{-2}$ . The kinetic energy generation 348 is approximately equal to the area within the curve, and Figure 6B thus indicates that the 349 inner-core cycle generates much more kinetic energy than the rainband cycle. 350

Figure 6C shows the two cycles in total water mixing ratio and height coordinates. Both 351 cycles corresponds to a net upward transport of water in all phases. The geopotential energy 352 gained by the water as it is lifted by atmospheric motions, is proportional to the area within 353 the cycle. The inner-core cycle does more work in order to lift more water to a higher level 354 than the rainband cycle. The maximum mixing ratio in the inner-core cycle is about 22 355 g/kg, which is about 2g/kg larger than for the outer rainband cycle. This is consistent 356 with the difference of about  $20JK^{-1}kg^{-1}$  in the maximum entropy between the two cycles, 357 and confirms that the entropy increase near the center of the storm is due to the enhanced 358 evaporation from the ocean. 359

These cycles differ from a Carnot cycle in a more fundamental way: most of the entropy 360 increase arises from the evaporation of water at the ocean surface. The air parcel must 361 be treated as an open system that exchanges water in various phases. Figure 6D shows 362 the two cycles in  $r_v$  -  $g_v$  coordinates with clockwise trajectories. The Gibbs free energy of 363 water vapor can be approximated as  $g_v \approx R_v T \ln \mathcal{H}$  and its variations depends primarily on 364 relative humidity. Surface evaporation  $1 \rightarrow 2$  also corresponds to a gain of water vapor at 365 low value of the Gibbs free energy. Expansion  $2 \rightarrow 3$  corresponds to a loss of water vapor 366 through condensation and precipitation. As the air is saturated through the expansions, 367 the Gibbs energy of the water vapor closely matches that of liquid water below the freezing 368 level, and that of ice above it. During compression  $3 \rightarrow 1$ , the air parcel gradually gains 369 water vapor from mixing with surrounding clouds. Water is injected into unsaturated air at 370 a low value of the Gibbs free energy  $(1 \rightarrow 2 \text{ and } 3 \rightarrow 1)$  but removed during the expansion 371 as condensed water with higher Gibbs free energy  $(2 \rightarrow 3)$ . From a thermodynamic point 372 of view, a chemical reaction where the reactant, water vapor, has a lower Gibbs free energy 373 than the product, liquid water, does not occur spontaneously under isothermal conditions. 374 The hydrological cycle is possible here because evaporation occurs systematically at higher 375 temperature than condensation. The difference in Gibbs free energy between evaporation 376 and condensation also leads to a reduction of the kinetic energy generated by the atmospheric 377 heat engine. 378

Figures 6E and 6F show the two cycles in the mixing ratio and Gibbs free energy for 379 liquid water ( $g_l - r_l$  in Figure 6E) and ice ( $g_i - r_i$  in Figure 6F). These are necessary for the 380 computation of the Gibbs penalty  $\Delta G$ , but the contribution of the water and ice phase is 381 quite smaller than the contribution from water vapor, due to the facts that there is much less 382 liquid water and ice present, and that the variations of Gibbs free energy for water are small 383 when compared to that of water vapor. The decision here to use liquid water at 273.15K as 384 the reference state ensures that the Gibbs free energy of water is small and slightly negative. 385 We apply the thermodynamic framework of section 2 to analyze the kinetic energy gen-386

eration in each thermodynamic cycle computed from MAFALDA. The energy source  $Q_{in}$ and sink  $Q_{out}$  are computed by integrating the positive and negative values of the heating increment  $\delta q = dh - \alpha_d dp$ :

$$Q_{in} = \oint \max(\delta q, 0) \tag{14}$$

$$Q_{out} = \oint \min(\delta q, 0) \tag{15}$$

<sup>390</sup> The temperature of the energy source  $T_{in}$  and sink  $T_{out}$  are obtained by

$$\frac{Q_{in}}{T_{in}} = \oint \max(\frac{\delta q}{T}, 0) \tag{16}$$

$$\frac{Q_{out}}{T_{out}} = \oint \min(\frac{\delta q}{T}, 0).$$
(17)

The Carnot efficiency  $\eta_C$  is equal to the temperature difference between the energy source and energy sink, divided by the temperature of the energy source

$$\eta_C = \frac{T_{in} - T_{out}}{T_{in}},\tag{18}$$

<sup>393</sup> so that the maximum work that could be achieved by an equivalent Carnot cycle  $W_{max}$  is <sup>394</sup> equal to the product of the net heating multiplied by the Carnot efficiency  $W_{max} = \eta_C Q_{in}$ . <sup>395</sup> The generation of kinetic energy  $W_{KE}$  is given by equation (5), the work done to lift water <sup>396</sup>  $W_P$  by equation (6) and the Gibbs penalty by equation (9). These quantities are related to <sup>397</sup> each other in terms of the thermodynamic budget (10):

$$W_{KE} = W_{max} - W_P - \Delta G.$$

Note that all the values for the energy flux and work -  $Q_{in}, Q_{out}, W_{max}, W_P, \Delta G$  and  $W_{KE}$ - are expressed in Joules per unit mass of dry air.

For the rainband cycle, our analysis yields an external heating  $Q_{in} = 19.9 \text{ kJkg}^{-1}$  occurring at an average temperature  $T_{in} = 294K$ , while the cooling temperature is  $T_{out} = 269K$ . The Carnot efficiency for this cycle is  $\eta_C = 0.08$ , which corresponds to a maximum work  $W_{max} = \eta_C Q_{in} = 1.68 \text{ kJkg}^{-1}$ . The generation of kinetic energy  $W_{KE} = 0.73 \text{ kJkg}^{-1}$  which corresponds to a heat engine efficiency  $\eta = W_{KE}/Q_{in} = 0.04$ . This small efficiency is due both to the fact that a substantial portion of the work is used to lift water, with  $W_P = 0.42 \text{ kJkg}^{-1}$ , and to counter the Gibbs penalty  $\Delta G = 0.48 \text{ kJkg}^{-1}$  resulting from the hydrological cycle. These numbers are similar to the ones obtained for the deepest MAFALDA cycle in moist convection (Pauluis 2016), which confirms that the rainband cycle is in a similar thermodynamic regime as deep convection in the tropics.

In contrast, the inner-core cycle is associated with a larger energy transport, with a net 410 heating of  $Q_{in} = 33.6 \text{ kJkg}^{-1}$ . The temperature of the heat source is marginally lower than 411 for the rainband cycle, with  $T_{in} = 283K$ . However, the temperature of the energy sink 412 drops significantly to  $T_{out} = 233K$ . As the cycle acts on a larger temperature difference, its 413 Carnot efficiency increases to  $\eta_C = 0.18$ . This larger Carnot efficiency combined with a larger 414 energy transport leads to a large increase of the maximum work to  $W_{max} = 5.91 \text{ kJkg}^{-1}$ . 415 The negative contributions from water lifting  $W_P = 0.87 \text{ kJkg}^{-1}$  and Gibbs penalty  $\Delta G =$ 416  $0.76 \text{ kJkg}^{-1}$  increase as well, but not at the same rate as the maximum work. The kinetic 417 energy generation  $W_{KE} = 4.18 \text{ kJkg}^{-1}$  is less than the theoretical maximum and corresponds 418 to a heat engine efficiency  $\eta = 0.13$  for the inner-core cycle. 419

Our analysis indicates that a striking six-fold increase in kinetic energy generation be-420 tween the rainband cycle and the inner-core cycle is due to a combination of three changes: 421 (1) a 60% increase in the external heating associated with the intense evaporation at the 422 center of the storm, (2) a substantial decrease in the cooling temperature (from 269K to 423 233K) which results in a doubling of the the Carnot efficiency, and (3) the actual efficiency 424 of the cycle becomes close to its Carnot efficiency. This later point can be attributed to the 425 fact that relative increases in water lifting  $W_P$  and in Gibbs penalty  $\Delta G$  are much weaker 426 than the relative increase in  $W_{max}$ . As a result, while the heat engine efficiency of the rain-427 band cycle was only about 40% of the corresponding Carnot efficiency  $\eta_C$ , the inner- core 428 cycle achieves about 70% of its Carnot efficiency. 429

430 The increase in surface heating between the rainband and inner-core cycles is a con-

sequence of the enhanced surface evaporation near the storm center, which has long been 431 recognized as one of the key requirements for the maintenance of hurricane. Enhanced evap-432 oration by itself may not be sufficient however. Indeed, the maximum intensity theory of 433 Emanuel (1986) shows that the maximum wind depends not on entropy itself, but on the 434 entropy gradient near the storm center. To be effective, surface evaporation must lead to a 435 local increase in the moist entropy. The ratio  $Q_{in}/T_{in}$  is the amount of entropy that a parcel 436 gains from the energy source. In our simulation, the high value of  $Q_{in}$  for the inner-core cycle 437 is tied to the fact that the air parcels rising within the eyewall have an equivalent potential 438 temperature - about 370K - that is substantially larger than that of the environment. 439

The reduction of cooling temperature  $T_{out}$  from 269K to 233K between the rainband and 440 inner-core cycles leads to a substantial increase in the Carnot efficiency. The reduction in 441 cooling temperature can be partially attributed to the deepening of the cycle, as the inner-442 core cycle reaches a height of 15km instead of 13km for the rainband cycle. However, this 443 fact does not by itself explain the large drop in  $T_{out}$ . Indeed, a closer look at the s - T444 diagram for both cycles in Figure 6A reveals that the lowest temperature in rainband cycle 445 is about 220K which is not much different than the minimum temperature in the inner-core 446 cycle - about 200K. The cooling temperature  $T_{out}$  corresponds to the (harmonic) average 447 temperature at which the parcel loses energy. In the rainband cycle, there is a very clear loss 448 of entropy - and energy - during the ascent  $2 \rightarrow 3$  due to the entrainment of dry air in the 449 convective updrafts. This energy loss occurs at warm temperature, between 275K and 300K 450 and shift the cooling temperature toward higher values. In contrast, the ascent in the inner-451 core cycle is almost adiabatic, and most of the entropy loss occurs during the subsidence at 452 low temperature. Thus, the low cooling temperature and high Carnot efficiency in the inner-453 core cycle require not only a deep overturning - so that cooling can occur at low temperature 454 - but also a lack of entrainment during the ascent - which would otherwise correspond to an 455 energy loss at relatively warm temperature. 456

<sup>457</sup> Finally, the high generation rate of kinetic energy in the inner-core cycle is due in part to

the fact that this cycle is able to achieve an efficiency that is close to the Carnot efficiency. While both the Gibbs penalty  $\Delta G$  and the water loading  $W_P$  nearly double between the raindband and the inner-core cycles, the maximum work  $W_{max}$  more than triples. Pauluis (2016) argue that the Gibbs penalty and water loading depends primarily on how much water is added and removed through a thermodynamic cycle, and are only weakly sensitive to the depth of the cycle. As such, deep thermodynamic cycles are less hindered by moist processes and their efficiency is closer to their Carnot efficiency.

We further analyze 20 cycles from MAFALDA, ordered from the deepest inner-core cycle 465 1 to the shallowest cycle 20, with the rainband cycle described above corresponding to cycle 466 8. The cycles are constructed from different values of the stream function and are ordered 467 from the deepest to the shallowest. Figure 7A shows the four terms from equation (10). 468 Deep cycles transport more energy across a larger temperature difference and are associated 469 with large value of the maximum work  $W_{max}$ . Kinetic energy generation exhibits even a 470 higher sensitivity to cycle depth: it is but a small fraction of the maximum work for shallow 471 cycles, but accounts for most of it for the deepest cycle. Both the Gibbs penalty and water 472 lifting also increase with the depth of the cycle, but the sensitivity to the cycle depth is 473 relatively small when compared to either  $W_{max}$  or  $W_{KE}$ . 474

Figure 7B compares the actual efficiency to the Carnot efficiency for each cycle. Deep 475 cycles not only exhibit a higher Carnot efficiency, but they achieve an actual efficiency close 476 to its theoretical maximum. This indicates that, while the hydrological cycle acts to 477 greatly reduce the kinetic energy output of shallow convection, it only marginally reduces 478 the output of deep overturning flows such as the inner-core cycle. Finally, Figure 7C shows 479 the temperature of the heat source  $T_{in}$  and heat sink  $T_{out}$ . This confirms that the increase 480 in efficiency is directly related to the deepening of convection and the decrease in the cooling 481 temperature. 482

Figure 8 shows the evolution of the thermodynamic properties of the deepest MAFALDA cycle through the 15 days of our simulation. This cycle is associated with the value of the

isentropic streamfunction equal to 2.5% of its absolute minimum, which corresponds to the 485 inner-core cycle discussed earlier. The four terms of the kinetic energy budget (10) are shown 486 in Figure 8A. Both the Gibbs penalty  $\Delta G$  and water loading terms  $W_P$  remain steady. The 487 intensification on day 5 is however marked by a sharp increase in both the maximum work 488  $W_{max}$  and kinetic energy generation  $W_{KE}$ . This intensification is also evident in the Carnot 489 efficiency  $\eta_C$  and the actual efficiency of the cycle shown in Figure 8B. The increase in 490 Carnot efficiency is itself due to the reduction in the cooling temperature (Figure 8C). At 491 the beginning of the simulation, the cooling temperature is about 260K. It drops sharply 492 to 240K at day 4, and settles to a value between 230K and 235K for the remainder of the 493 simulation. 494

# 495 5. Conclusion

In this paper, we have applied MAFALDA to analyze the thermodynamic transformations in a high resolution simulation of a hurricane. This technique relies on identifying the atmospheric overturning by computing a mean circulation in  $z - \theta_e$  coordinates, and extracting a set of thermodynamic cycles that represent the mean overturning flow. This then allows us to diagnose various thermodynamic transformations that occur through each cycle.

We use MAFALDA here to assess the ability of the hurricane to act as a heat engine. 502 Previous studies (Pauluis and Held 2002a,b; Pauluis 2016; Laliberte et al. 2015) have demon-503 strated that the hydrological cycle has a negative impact on the ability of the atmosphere 504 to generate kinetic energy. This arises from two key aspects of the hydrological cycle. First, 505 mechanical work must be performed in order to lift water and is then loss through frictional 506 dissipation as condensed precipitates (Pauluis et al. 2000). Second, the atmosphere acts 507 partially as a dehumidifier, in which water is introduced as unsaturated water vapor and re-508 moved as a condensate. From a thermodynamic point of view, the water has a lower Gibbs 509

free energy when it enters the atmosphere than when it is removed. This results in a reduction of the amount of work that can be produced by the atmospheric circulation (Pauluis 2011). For moist convection, previous studies (Pauluis and Held 2002a; Pauluis 2016) have found that the generation of kinetic energy of moist convection in radiative convective equilibrium is about 10 to 20 percent of the work that could be done by a Carnot cycle acting between the same energy sources and sinks.

Here, we contrast two thermodynamic cycles associated with different trajectories in our 516 simulation: a rainband cycle associated with air ascending in the outer rainband located 517 about 200km away from the storm, and a inner-core cycle corresponding to air rising within 518 the eyewall. These two cycles exhibit very different thermodynamic behavior, and, in par-519 ticular, the generation of kinetic energy for the inner-core cycle is approximately six times 520 larger than for the rainband cycle. We identify three different factors contributing to the 521 high generation rate of the inner-core cycle: (1) an enhancement of the energy transport by 522 the cycle, (2) a very low cooling temperature, characteristic of the upper troposphere, which 523 results in a very high Carnot efficiency, and (3) a relatively small negative contribution from 524 the hydrological cycle, so that the actual efficiency of the inner-core cycle is about two thirds 525 of its Carnot efficiency. 526

The high rate of generation of kinetic energy in the inner-core cycle is strongly tied to 527 the nature of the rising motions within the eyewall. The ascent in the rainband cycle shows 528 a clear indication of entrainment as a gradual decrease of entropy and equivalent potential 529 temperature as the air rises. In contrast, the ascent in the inner-core cycle shows little 530 indication of entrainment of dry air and is almost isentropic. The ascent in the inner-core 531 cycle reaches very high and is associated with very low cooling temperature, which greatly 532 increases the Carnot efficiency. In our simulation, a drop in cooling temperature and a 533 corresponding increase in efficiency precede intensification by about one day. While our 534 work here is limited to a single storm, it strongly suggests that entrainment of dry air into 535 the eyewall, or rather the lack thereof, plays an important role in the intensification and 536

<sup>537</sup> energetics of tropical cyclones.

The methodology of MAFALDA is designed to analyze the thermodynamic processes in 538 a numerical simulation. The physical insights it provides should be tempered by the fact 539 that a numerical simulation is at best a good faith effort at reproducing a physical flow. In 540 particular, the horizontal resolution of 2km here is too coarse to fully capture the turbulent 541 nature of entrainment. While we strongly believe that the results presented here are both 542 physically consistent and robust, understanding how numerical resolution and the various 543 physical parameterizations affect the behavior of simulated atmospheric flows remains an 544 important challenge in atmospheric science. Assessing thermodynamic processes represented 545 in such numerical simulations should be an essential component of such endeavor. 546

The novel approach introduced in this study offers a unique perspective on the role played 547 by thermodynamic processes in hurricane formation and intensity. Our study indicates that 548 the atmospheric circulation in a hurricane, characterized by very high generation of kinetic 549 energy, is in a different thermodynamic regime than tropical deep convection. The genesis 550 and intensification of tropical cyclones correspond to the emergence of deep and highly 551 efficient thermodynamic cycles. Systematic applications of MAFALDA should shed further 552 light on how such cycles emerge, and how energy exchanges with both the ocean surface 553 and the surrounding environment can impact the storm intensity and structure, and on how 554 hurricanes and tropical storms behave under different climates. 555

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# <sub>562</sub> A. Appendix: Gibbs relationship for moist air

The specific Gibbs free energy is defined as the difference between the specific enthalpy and the specific entropy multiplied by the absolute temperature:

$$g = h - Ts$$

The specific entropy and specific enthalpy depend on the reference state, and so does the Gibbs free energy. In this study, we use liquid water at the freezing temperature  $T_f$  as the reference state. The specific enthalpies of water vapor  $h_v$ , liquid water,  $h_l$  and  $h_i$  are

$$h_v = C_l(T - T_f) + L_v \tag{A.1a}$$

$$h_l = C_l(T - T_f) \tag{A.1b}$$

$$h_i = C_i(T - T_f) + L_{f0}.$$
 (A.1c)

Here,  $C_l$  and  $C_i$  are the specific heat of liquid water and ice,  $L_v$  is the latent heat of vaporization at temperature T, and  $L_{f0}$  is the latent heat of fusion taken at the reference temperature  $T_f$ . The corresponding specific entropies  $s_v$ ,  $s_l$  and  $s_i$  are

$$s_v = C_l \ln \frac{T}{T_f} + \frac{L_v}{T} - R_v \ln \mathcal{H}$$
(A.2a)

$$s_l = C_l \ln \frac{T}{T_f} \tag{A.2b}$$

$$s_i = C_i \ln \frac{T}{T_f} - \frac{L_{f0}}{T_f},\tag{A.2c}$$

with  $R_v$  is the specific gas constant for water vapor. For this choice of the reference state, the specific Gibbs free energy is therefore:

$$g_v = C_l (T - T_f - T \ln \frac{T}{T_f}) + R_v T \ln \mathcal{H}$$
(A.3a)

$$g_l = C_l (T - T_f - T \ln \frac{T}{T_f})$$
(A.3b)

$$g_i = C_i (T - T_f - T \ln \frac{T}{T_f}) - L_{f0} (1 - \frac{T}{T_f}).$$
 (A.3c)

<sup>573</sup> We treat here moist air as an ideal mixture of 1kg of dry air,  $r_v$  kg of water vapor,  $r_l$  kg <sup>574</sup> of liquid water and  $r_i$  kg of ice. The corresponding entropy and enthalpy *per unit mass of* <sup>575</sup> *dry air* are

$$s = s_d + r_v s_v + r_l s_l + r_i s_i \tag{A.4}$$

$$h = s_d + r_v h_v + r_l h_l + r_i h_i. \tag{A.5}$$

The Gibbs relationship relates the change in entropy to changes in enthalpy, pressure and composition:

$$Tds = dh - \alpha_d dp - \sum_{w=v,l,i} g_w dr_w.$$
(A.6)

<sup>578</sup> Here, the specific volume  $\alpha_d$  is the specific volume *per unit mass of dry air*:

$$\alpha_d = \frac{R_d T + R_v r_v T}{p}.\tag{A.7}$$

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### <sup>622</sup> List of Figures

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1 Schematic representation of a hurricane as a heat engine. Step  $1 \rightarrow 2$ : the low level inflow gains energy from the ocean surface  $(Q_{in})$ . Step  $2 \rightarrow 3$ : Air rises from the surface to the upper troposphere, and water condenses and precipitates. Step  $3 \rightarrow 1$ : air is gradually compressed back to the surface and loses energy  $(Q_{out})$  through the emission of infrared radiation. This circulation acts as a heat engine that transports heat from a warm source at temperature  $T_{in}$  to a colder sink at temperature  $T_{out}$ . This produces mechanical work to generate wind  $(W_{KE})$  and lift condensed water  $(W_P)$ . The injection of water at the surface and its removal through precipitation are associated with a Gibbs penalty ( $\Delta G$ ) that reduces the kinetic energy output. 30 2Minimum pressure (upper panel) and maximum tangential wind (lower panel). 313 Time and azimuthal average of the tangential wind (panel A), equivalent potential temperature (panel B) and stream function (panel C). The solid black line and the dashed blue line correspond to trajectories associated with the inner-core cycle and rainband cycle (see Section 4). On Panel A, three locations have been marked along each trajectory: point 1 is the lowest entropy value, point 2 indicates the highest entropy near the surface, and point 3 is 32 the highest point along the cycle. 4 Isentropic streamfunction in  $z - \theta_e$  coordinate. The inner-core cycle (solid black line) and the outer cycle (dashed blue line) correspond to two isolines of the streamfunction. Three locations have been marked along each trajectory: point 1 is the lowest entropy value, point 2 indicates the highest entropy near

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the surface, and point 3 is the highest point along the cycle.

Isentropic averaged value for radius (panel A), tangential wind (panel B),
specific moist entropy (panel C), temperature (panel D), mixing ratio (panel
E) and Gibbs free energy of water vapor (panel F). The solid black line and
the dashed blue line correspond to Eulerian trajectories associated with the
inner-core cycle and rainband cycle (see Section 4).

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- <sup>651</sup> 6 The inner-core cycle and rainband cycle are shown in different coordinate
  <sup>652</sup> pairs: specific moist entropy and temperature (panel A), buoyancy and height
  <sup>653</sup> (Panel B), total water content and height (panel C), Gibbs free energy of water
  <sup>654</sup> vapor and mixing ratio (panel D), liquid water content and Gibbs free energy
  <sup>655</sup> for liquid water (panel E), and ice content and Gibbs free energy for ice (panel
  <sup>656</sup> F). The inner-core cycle is shown by the solid black line, and the outer cycle
  <sup>657</sup> by dashed blue line. The trajectories are clockwise in all panels.
- <sup>658</sup> 7 Thermodynamic analysis for 20 MAFALDA cycles. Panel A: decomposition <sup>659</sup> of the maximum work  $W_{max}$ (black) into the generation of kinetic energy <sup>660</sup>  $W_{KE}$ (red), water lifting  $W_P$ (magenta) and Gibbs penalty  $\Delta G$ (blue). The <sup>661</sup> inner-core cycle corresponds to cycle 1 and the outer cycle to cycle 8. Panel <sup>662</sup> B: Comparison between the Carnot efficiency  $\eta_C$  (blue) and the effective effi-<sup>663</sup> ciency  $\eta$  (red)for each cycle. Panel C: Temperature of the energy source  $T_{in}$ <sup>664</sup> (blue) and energy sink  $T_{out}$  (red) for each cycle.
- <sup>665</sup> 8 Time evolution of the MAFALDA cycle associated 2.5th percentile of the <sup>666</sup> isentropic streamfunction, which corresponds to the inner-core cycle discussed <sup>667</sup> in section 4. Panel A: decomposition of the maximum work  $W_{max}$ (black) into <sup>668</sup> the generation of kinetic energy  $W_{KE}$ (red), water lifting  $W_P$ (magenta) and <sup>669</sup> Gibbs penalty  $\Delta G$ (blue). Panel B: Comparison between the Carnot efficiency <sup>670</sup>  $\eta_C$  (blue) and effective efficiency  $\eta$  (red). Panel C: Temperatures of the energy <sup>671</sup> sources  $T_{in}$  (blue) and of the energy sink  $T_{out}$  (red).
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FIG. 1. Schematic representation of a hurricane as a heat engine. Step  $1 \rightarrow 2$ : the low level inflow gains energy from the ocean surface  $(Q_{in})$ . Step  $2 \rightarrow 3$ : Air rises from the surface to the upper troposphere, and water condenses and precipitates. Step  $3 \rightarrow 1$ : air is gradually compressed back to the surface and loses energy  $(Q_{out})$  through the emission of infrared radiation. This circulation acts as a heat engine that transports heat from a warm source at temperature  $T_{in}$  to a colder sink at temperature  $T_{out}$ . This produces mechanical work to generate wind  $(W_{KE})$  and lift condensed water  $(W_P)$ . The injection of water at the surface and its removal through precipitation are associated with a Gibbs penalty  $(\Delta G)$  that reduces the kinetic energy output.



FIG. 2. Minimum pressure (upper panel) and maximum tangential wind (lower panel).



FIG. 3. Time and azimuthal average of the tangential wind (panel A), equivalent potential temperature (panel B) and stream function (panel C). The solid black line and the dashed blue line correspond to trajectories associated with the inner-core cycle and rainband cycle (see Section 4). On Panel A, three locations have been marked along each trajectory: point 1 is the lowest entropy value, point 2 indicates the highest entropy near the surface, and point 3 is the highest point along the cycle.



FIG. 4. Isentropic streamfunction in  $z - \theta_e$  coordinate. The inner-core cycle (solid black line) and the outer cycle (dashed blue line) correspond to two isolines of the streamfunction. Three locations have been marked along each trajectory: point 1 is the lowest entropy value, point 2 indicates the highest entropy near the surface, and point 3 is the highest point along the cycle.



FIG. 5. Isentropic averaged value for radius (panel A), tangential wind (panel B), specific moist entropy (panel C), temperature (panel D), mixing ratio (panel E) and Gibbs free energy of water vapor (panel F). The solid black line and the dashed blue line correspond to Eulerian trajectories associated with the inner-core cycle and rainband cycle (see Section 4).



FIG. 6. The inner-core cycle and rainband cycle are shown in different coordinate pairs: specific moist entropy and temperature (panel A), buoyancy and height (Panel B), total water content and height (panel C), Gibbs free energy of water vapor and mixing ratio (panel D), liquid water content and Gibbs free energy for liquid water (panel E), and ice content and Gibbs free energy for ice (panel F). The inner-core cycle is shown by the solid black line, and the outer cycle by dashed blue line. The trajectories are clockwise in all panels.





FIG. 7. Thermodynamic analysis for 20 MAFALDA cycles. Panel A: decomposition of the maximum work  $W_{max}$ (black) into the generation of kinetic energy  $W_{KE}$ (red), water lifting  $W_P$ (magenta) and Gibbs penalty  $\Delta G$ (blue). The inner-core cycle corresponds to cycle 1 and the outer cycle to cycle 8. Panel B: Comparison between the Carnot efficiency  $\eta_C$  (blue) and the effective efficiency  $\eta$  (red)for each cycle. Panel C: Temperature of the energy source  $T_{in}$  (blue) and energy sink  $T_{out}$  (red) for each cycle.



FIG. 8. Time evolution of the MAFALDA cycle associated 2.5th percentile of the isentropic streamfunction, which corresponds to the inner-core cycle discussed in section 4. Panel A: decomposition of the maximum work  $W_{max}$ (black) into the generation of kinetic energy  $W_{KE}$ (red), water lifting  $W_P$ (magenta) and Gibbs penalty  $\Delta G$ (blue). Panel B: Comparison between the Carnot efficiency  $\eta_C$  (blue) and effective efficiency  $\eta$  (red). Panel C: Temperatures of the energy sources  $T_{in}$  (blue) and of the energy sink  $T_{out}$  (red).