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# Molecular responses of chicken embryos to maternal heat stress through DNA methylation and gene expression

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# 24 Abstract

25 Climate change, with its repercussions on agriculture, is one of the most important adaptation 26 challenges for livestock production. Poultry production is a major source of proteins for human 27 consumption all over the world. With a growing human population, improving poultry's adaptation 28 to environmental constraints becomes critical. Extensive evidence highlights the influence of 29 environmental variations on epigenetic modifications. The aim of this paper is therefore to explore 30 chickens' molecular response to maternal heat stress. We employed Reduced Representation 31 Bisulfite Sequencing (RRBS) to generate genome-wide single-base resolution DNA methylation 32 profiling and RNA sequencing (RNA-seq) to profile the transcriptome of the brains of embryos 33 hatched from dams reared under either heat stress (32 °C) or thermoneutrality (22°C). We detected 289 significant differentially methylated CpG sites (DMCs) and one differentially methylated 34 35 region (DMR) between heat stressed and control groups. These DMCs were associated with 357 36 genes involved in processes such as cellular response to stimulus, developmental processes and 37 immune function. In addition, we identified 11 genes differentially expressed between the two 38 groups of embryos, and identified ATP9A as a target gene of maternal heat stress on offspring. 39 This study provides a body of fundamental knowledge on adaptive mechanisms concerning heat 40 tolerance in chickens.

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42 Keywords heat stress, epigenetics, DNA methylation, chicken, embryos
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# 46 Introduction

47 Climate change and its direct and indirect consequences represent one of the most important 48 adaptation challenges for livestock production, as unpredictable and rapid environmental changes 49 are a source of stress. Chicken meat and eggs are major sources of proteins for human food 50 worldwide, but their production is affected by global warming. Rising temperatures have adverse 51 effects on poultry growth, production and survival. It has been shown that heat stress causes a decrease in productivity in many species<sup>1-3</sup>. Heat stress in chickens, as in other species, leads to 52 53 reduced feed consumption, resulting in decreased energy and nutrient intake. This ultimately leads 54 to compromised growth and reduced quality of broiler products, as well as decreased egg quantity and quality in layers<sup>4–9</sup>. The increased demand for animal products worldwide combined with a 55 56 growing human population urges the need to improve the ability of animals to respond to heat stress<sup>10</sup>. Research has demonstrated that the environment exerts influence on gene expression in 57 58 both plants and animals, resulting in phenotypic plasticity; this phenomenon leads to the 59 emergence of different phenotypes from the same genotype in response to different environmental conditions, and can even affects the phenotype of future generations through transgenerational 60 plasticity<sup>11–13</sup>. Some of these effects are mediated by epigenetics phenomena: in response to the 61 environment, epigenetic mechanisms can induce changes in gene expression, linking 62 environmental changes to the physiology and health of animals<sup>14,15</sup>. These mechanisms may act as 63 64 catalysts and trigger the adaptation of organisms to their environment.

Epigenetics covers all mechanisms that modify gene expression in a reversible and transmissible way through mitosis or meiosis, without modifying the DNA sequence<sup>16</sup>. These phenomena include DNA methylation, histone modification, remodeling of chromatin, and regulation of gene

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expression by non-coding RNAs (ncRNAs). Numerous studies, particularly in humans and
mammals, showed that maternal stress can lead to epigenetic alterations in offspring, which
ultimately may affect their phenotype<sup>17,18</sup>.

71 In avian species, Tzschentke and Basta (2002) reported that, in ducks, prenatal temperature 72 experience has a clear influence on postnatal neural hypothalamic thermosensitivity and could be 73 the result of epigenetic temperature adaptation<sup>19</sup>. In chickens, research focused on the effect of 74 thermal manipulations during embryogenesis on post-hatch heat tolerance and showed an 75 increased heat tolerance in broilers within the first 5 weeks of life, when exposed to an acute heat stress<sup>20,21</sup>. In Japanese quails, a study by Vitorino Carvalho et al. (2020) reported that thermal 76 77 manipulation during embryogenesis significantly reduced the hatching rate and increased mortality during the first four weeks of life<sup>22</sup>. Subsequent research (Vitorino Carvalho et al., 2021) reported 78 79 that thermal manipulation during embryogenesis had little to no effect on gene expression regulation in the hypothalamus of 35-day-old quails<sup>23</sup>. On the contrary, exposure to a heat 80 81 challenge before this sampling resulted in an increase in the number of differentially expressed 82 genes, reinforcing the hypothesis that embryonic thermal conditioning has a beneficial effect and increases thermotolerance later in life<sup>10,21,24</sup>. 83

The response to heat stress can also be triggered by heat exposure in the previous generation. For example, Ahmed et al., (2017) reported that maternal heat stress during late gestation increased acute thermal tolerance of the calf at maturity<sup>25</sup>. In birds several studies have also tried to elucidate the effect of the environmental experience of mothers on their offspring. In Japanese quails, it has been reported that maternal stress may affect and prepare future generations to cope with later environmental difficulties<sup>26,26</sup>. Santana et al. (2021) reported that maternal stress led to lower laying rate, egg mass and higher chick mortality rate at the 1–15 days of age. They observed that

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91 the performance and oxidative metabolism of offspring raised in thermoneutral conditions were 92 unaffected by maternal heat stress, while offspring subjected to heat stress during growth showed increased levels of protein oxidation<sup>18</sup>. In a recent study<sup>27</sup>, it was shown that thermal manipulation 93 94 repeated during 4 generations in Japanese quail had a transgenerational effect on body weight and 95 egg weight, suggesting non-genetic inheritance mechanisms. The hypothesis made to justify the 96 improved resistance was that heat stress-induced epigenetic modifications were occurring as a 97 consequence of the embryonic thermal manipulation, leading to increased thermal tolerance and 98 adaptability in adults. A recent study confirmed the epigenetic nature of the transmission of heat-99 induced effects between generations through epigenetic mechanisms in chicken<sup>28</sup>.

Unlike mammals, birds have not been extensively studied for the effect of maternal heat stress on offspring heat tolerance. In this study, we explored this aspect by analyzing the genome-wide methylation and transcriptomic profiling of embryos whose mothers were reared under high ambient temperatures or under thermoneutral conditions. The underlying hypothesis is that maternal heat stress induces changes in DNA methylation in chicken embryos leading to changes in gene expression.

#### 106 **Results**

In order to assess the epigenomic response to maternal heat stress on the DNA methylation levels in 13-day-old embryos, 22 embryos (10 controls and 12 stressed) were analysed. The results showed that heat stress of hens can mediate changes in the methylation patterns and also differential expression of some genes in offspring.

#### 111 DNA methylation changes

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112 Some general statistics of RRBS sequencing results are summarized in Table S2. An average of 113 20 million reads per sample were obtained.. The average mapping efficiency was 64.84%, in accordance with what is expected from this type of data<sup>29</sup>. We have assessed 1,075,291 CpG sites 114 115 (after preprocessing; Fig 2A) with an average depth of 18.34. The distribution of methylation level 116 around the transcription start site (TSS) showed a decreased value in this region (Fig 2B). Among 117 the analysed CpGs, we detected a total of 289 DMCs between HS and CT groups, of which 138 118 were hypermethylated and 151 were hypomethylated in the HS group (Fig 3). The DMCs were 119 present along most chromosomes (Fig 4 and Fig S2). Their distribution was not constant along the 120 genome and some regions had a high density of DMCs. Notably, one region on chromosome 4 121 (Chr4:2858109,2858165) was identified as a DMR. This region harbored two lncRNA genes 122 (LOC121110553, LOC121110554) with unknown functions. As shown in Fig 5 these two genes have contrasted expression patterns across 47 tissues1<sup>30</sup>, and only LOC121110553 was expressed 123 124 in embryo.

#### 125 Annotation of differentially methylated cytosine

DMCs were annotated according to gene features. From the detected DMCs, 28.85% were located in promoter regions, 40.28% in introns and 18.42% in exons (Fig 6). Chi2 test showed that these distributions among CpGs and DMCs (p-value < 2.2e-16) and among hyper and hypo DMCs (pvalue < 2.2e-16) were significantly different. The fraction of the DMCs located in the promoter region was more frequently hypermethylated (37.25%) than hypomethylated (19.98%), while hypomethylation was more frequent in exons and introns.

#### 132 Gene ontology functional analysis

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Based on the DMCs location, we identified 357 differentially methylated genes (DMGs) that harbored at least one DMC in one of the gene features considered (Table S3) out of 35,995 genes with at least one CpG. The functional analysis of these genes has enabled us to identify as enriched several biological processes (BP) linked to the development stage. The gene ontology ViSEAGO output showed also the significance of embryo development, metabolic process, cellular response to stimulus, immune function (Fig 7).

#### 139 Gene expression analysis

140 RNA sequencing analysis was performed to investigate the impact of heat stress on embryo gene 141 expression. Among the 17,939 genes identified as expressed in embryos, eleven DEGs were 142 detected between HS and CT groups as listed in Table 1, all being protein coding genes. Among 143 these, four genes were upregulated and seven genes were down regulated. ATP9A (ATPase 144 phospholipid transporting 9A), one of the upregulated genes in the HS embryos, was also in the 145 list of DMGs, with 4 DMCs in the introns and exon regions, all of them being hypermethylated 146 (Fig 8).

#### 147 **Pyromark validation**

Pyrosequencing validation of seven DMCs with PyroMark confirmed all the positions as DMCs.
Fig 9 shows the methylation level obtained with RRBS and PyroMark.

## 150 **Discussion**

151 The livestock industry faces a growing number of challenges due to climate change and global 152 warming, which have a direct impact on animal growth, reproduction, health, and welfare. The 153 exposure of animals to climate changes and other associated stressors has both short- and long-

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term effects over the course of the animal's life. There is growing evidence that epigenetics, in interaction with the environment, may also contribute to the phenotypic diversity of animals<sup>31</sup>. In addition, these effects can be passed across generations with multigenerational inheritance and perhaps provide the ability to adapt to climate change for the subsequent generations<sup>32,33</sup>.

Our study aimed to elucidate the effect of maternal heat exposure on DNA methylation and gene expression in chicken embryos. The results revealed a slight influence of maternal heat stress on embryo transcriptomic levels, with eleven differentially expressed genes. We detected a total of 289 DMCs between HS and CT groups, consistent with findings from previous studies in chicken<sup>28</sup>, cow<sup>34</sup> or guinea pig<sup>35</sup>, which have demonstrated changes in DNA methylation linked to parental heat exposure.

We observed that promoter DMCs were more frequently hypermethylated than hypomethylated in contrast with what was observed in exon and intron regions. This suggests that the promoter region may be more prone to hypermethylation in response to the mother heat stress than the other parts of the genes. A slight similar trend was observed in rainbow trout sperm after heat exposure of males during spermatogenesis<sup>36</sup>.

We identified 357 DMGs containing at least one DMC in various gene features, with a number of 6 DMCs per gene on average. In contrast, only 11 genes exhibited significant differential expression. This highlighted the observation that the majority of differential methylation sites are not simultaneously associated with changes in gene expression. Such finding is consistent with the well-established knowledge that gene expression is highly context dependent, presenting a very fine tissue and stage specificity<sup>37</sup>. The lack of association at this developmental stage does not exclude a potential functional impact of methylation marks on gene expression later in life, which

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176 could facilitate responses to heat stress exposures. It is indeed expected that during embryogenesis,
177 some epigenetic marks are programmed and largely maintained throughout development,
178 contributing to better cope with environmental stressors later in life<sup>38</sup> (Skinner, 2011).

Among the identified DMGs, ERBB4 (Erb-B2 Receptor Tyrosine Kinase 4), NFATC2 (Nuclear
Factor Of Activated T-Cells 2) and ATP9A (ATPase Phospholipid Transporting 9A) have been
linked to GWAS signals associated with thermotolerance in pigs, as reported by Kim et al.,
(2018)<sup>39</sup>. Another study by Ramírez-Ayala et al., (2021) linked the ATP9A gene to thermogenesis
in cattle<sup>40</sup>. Interestingly, in our study, ATP9A emerged as both DMG and DEG, and harbored

184 numerous DMCs in both its intronic and exonic regions. This observation suggests the existence

185 of temperature regulation pathways potentially shared between mammals and birds.

The DMR on chromosome 4 is associated with two long non-coding RNAs whose function has
yet to be characterized: LOC121110553 is weakly expressed but not differentially expressed
between the two groups, while LOC121110554 does not appear to be expressed.

189 The gene ontology analysis of DMGs identified important biological processes including cellular 190 response to stimulus, embryo development, and telencephalon development. Cellular response to 191 stimulus encompasses any process that alters the state or activity of a cell, such as movement, 192 secretion, enzyme production, or gene expression. Indeed, cellular reaction to stress is diverse, 193 ranging from activation of pathways involved in survival strategies to programmed cell death, 194 which eliminate damaged cells<sup>41</sup>. Cellular apoptosis was reported as upregulated after a longer 195 period of heat stress in highland and lowland chicken<sup>10</sup>. The cell's initial reaction to a stressful 196 stimulus tends to support its defense and recover from injury. However, if distressing stimuli 197 persist without resolution, cells activate signaling pathways leading to programmed cell death<sup>41</sup>.

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198 Adaptive immune response is another pathway that was associated with DMGs. Heat stress in 199 commercial laying hens has been shown to reduce production performance and inhibit immune function leading to an increase in mortality<sup>42</sup>. Similarly, a study showed that HS causes immune 200 201 abnormalities in broiler chickens by impairing T and B cell development and maturation in primary 202 and secondary lymphoid tissues<sup>43</sup>. In another study, transcriptome analysis revealed the genes and 203 pathways involved in bursal responses to heat stress and lipopolysaccharide, showing that the 204 combined treatments had the greatest effect<sup>44</sup>. The negative link between heat stress and immune 205 function was also observed in cattle. For example, Dahl et al., (2020) reported that lactating cows 206 often exhibit higher disease incidence in summer (metritis, mastitis, respiratory disease), possibly linked to compromised immune cell activity due to heat stress<sup>45</sup>. Additionally, calves born to 207 208 mothers experiencing heat stress and dry period during the late gestation had lower weight at birth and through puberty $^{46-48}$ . 209

210 Epigenetics has the capability of conveying information to next generations without DNA 211 sequence alteration. Epigenetic marks may represent the signature of environment stresses and 212 specific physiological states acquired by the parental generation that could enhance adaptability of 213 next generations to new situations. The outcome of the current study illustrates that maternal 214 exposure to heat stress has an effect on the DNA methylation pattern of offspring. However, even 215 with the exclusion of observed SNPs at CpG sites, we cannot rule out the hypothesis that some of 216 the identified DMCs may be caused by genetic polymorphisms. Although these methylome 217 changes were not associated with extensive transcriptional changes at the embryonic level, the 218 affected genes and pathways identified from differentially methylated genes suggest a potential 219 foundation for adaptive responses in progeny. This aligns with the studies of McGuigan et al. 220 (2021) and Weyrich et al. (2016), indicating that under conditions of climate change and stressful

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environments, epigenetic factors, through intergenerational and transgenerational effects, play a
role in promoting adaptability of exposed populations<sup>33,35</sup>. This has been observed in chicken, with
an intergenerational inheritance of heat resilience after fathers' embryonic heat conditioning,
associated with DNA methylation changes in anterior preoptic hypothalamus<sup>28</sup>.

This study shows that maternal exposure to heat stress can induce hundreds of changes in methylation level and minor changes in transcriptome level in offspring. These DNA methylation modifications during the embryonic development as a consequence of their mother's heat stress may provide the capability of an adaptive response to subsequent heat stress exposure.

### 229 Materials and Methods

#### 230 Sample preparation and experimental design

A total of 4 hens (2 controls and 2 heat-stressed) from an experimental layer population (R-) issued from selection for feed efficiency<sup>49</sup> were used. All birds were reared under standard conditions (22°C, *ad libitum* feeding) at the INRAE UE 1295 PEAT Poultry Experimental Unit (Nouzilly). In the heat stress group (Fig 1), hens were reared at 22°C until 28 weeks of age. Between 28 and 32 weeks of age, the hens were kept at 32°C (increasing by 2°C per hour for 5 hours). The four hens were inseminated by the same male at week 30. Their eggs were collected between 31 and 32 weeks and incubated for 13 days.

The experiments were carried out at the PEAT experimental unit under license number C37-175-1 for animal experimentation, in compliance with European Union legislation, and were approved by the local ethics committee for animal experimentation (Val de Loire) and by the French

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241 Ministries of Higher Education and Scientific Research, and Agriculture and Fisheries (n°2873242 2015112512076871), complying with the ARRIVE guidelines.

#### 243 DNA and RNA extraction

DNA and RNA from brain of 13-day-old embryos were extracted, according to the manufacturer's
instructions, with AllPrep DNA/RNA Mini Kit (Qiagen catalog No. / ID: 80204). Total RNA and
DNA were quantified with a NanoDrop ND-1000 spectrophotometer (Thermo Scientific). The
dsDNA concentration was measured using the Quant-iT PicoGreen dsDNA (Invitrogen) assay
according to the manufacturer instructions. The fluorometric measurements were performed using
ABI7900HT (Applied Biosystem).

250 The RNA quality was controlled using an Agilent 2100 bioanalyzer (Agilent Technologies France)

with the Eukaryote Total RNA Nano Assay. Results were analysed with the 2100 Expert Software.

252 RNA integrity (RIN) was 9.9 on average.

#### 253 Reduced representation bisulfite sequencing

254 We obtained Reduced Representation Bisulfite Sequencing (RRBS) data from whole brains of 22 255 embryos of unknown sex (10 controls and 12 stressed) at 13 days of age, derived from R- hens 256 with or without heat stress. RRBS libraries were prepared using the Premium RRBS Kit 257 (Diagenode, #C02030033), according to the manufacturer's instructions. Briefly, the protocol 258 consisted in the digestion of 100 ng of genomic DNA by the *MspI* enzyme followed by fragment 259 end repair, and addition of adaptors. A size selection step was performed with AMPure XP Beads 260 (Beckman Coulter). Next, samples were quantified by qPCR and the Ct values were used to pool 261 samples by equimolarity. Then the bisulfite conversion was realized on the pool and the final

262	libraries were amplified using MethylTaq Plus Master Mix (Diagenode kit). After a clean-up with										
263	AMPure XP Beads, the RRBS library pools were analysed with the Qubit dsDNA HS Assay Kit										
264	(Thermo Fisher Scientific), and the profile of the pools was verified using the High Sensitivity										
265	DNA chip for 2100 Bioanalyzer (Agilent) or DNF-474 NGS fragment kit on a Fragment Analyzer										
266	(Agilent). Libraries were sequenced in single-end mode of 50 bp on an Illumina HiSeq 4000 or										
267	the GenomEast platform ( <u>https://www.igbmc.fr/en/plateforms-and-</u>										
268	services/platforms/genomeast).										
269	Bioinformatics analyses										
270	The nf-core/methylseq pipeline <sup>50</sup> version 2.1.0 was used for analysing methylation bisulfite										
271	sequencing data. Bismark version 0.24.2 with Bowtie2 as an alignment tool was used for mapping										
272	on the Gallus gallus genome GRCg7b obtained from Ensembl (bGalGal1.mat.broiler.GRCg7b,										
273	https://ftp.ensembl.org/pub/release-										
274	109/fasta/gallus_gallus/dna/Gallus_gallus.bGalGal1.mat.broiler.GRCg7b.dna.toplevel.fa.gz).										
275	Pipeline's default parameters were used, with the optionclip_r1 3 for adapter trimming										
276	(trimming 3 bases from the 5' end of each read).										
277	Differential methylation analyses										
278	The Bioconductor package edgeR v3.28.1 <sup>51</sup> was used to detect differentially methylated CpGs										
279	sites (DMCs), The callDMR function from the DSS package v2.38.0 <sup>52</sup> was used to call DMRs										
280	(differentially methylated regions) from the edgeR outputs. A DMR was defined as a region with										
281	a minimum number of 3 CpGs and a percentage of CpG sites with significant p-values (less than										
282	0.05) greater than 50% between Heat Stress (HS) and Control (CT) groups. Here a two-step										

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283 process has been implemented: preprocessing and differential methylation analysis. During the 284 preprocessing step, CpGs that overlapped with C-T single nucleotide polymorphisms (SNPs) were 285 filtered out to avoid erroneous identification of C-T polymorphisms as methylation changes. SNPs 286 were detected by gemBS v4.053 with option "bs call", CpGs were further filtered using other 287 criteria (maximum Coverage: 200, minimum coverage: 5 and minimum fraction of samples present 288 per position: 0.8). Differential methylation analysis was performed with edgeR using a multifactor 289 model (HS/CT and Sex) with False Discovery Rate (FDR)  $\leq 0.05$ . Identification of the sex of embryos was performed through the average of read mapped on sex chromosomes (Fig S1). 290

Genomic features annotation was done with the GenomeFeatures package version 1.3
(https://forgemia.inra.fr/aurelien.brionne/GenomeFeatures) with default defined promoter region
upstream:3000 bp and downstream:500 bp. An in-house enriched annotation file was used in this
study<sup>54</sup>.

### 295 Functional enrichment analysis

We analyzed all the genes that had at least one DMC in their genomic features (promoter, UTR5,
introns, UTR3, downstream). Functional enrichment analysis was done with the R package
ViSEAGO v1.14.0<sup>55</sup>, and the full list of genes having at least one CpG in genomic features was
used as background.

### 300 RNA-seq data acquisition

Paired-end sequencing was performed using an Illumina HiSeq3000 (Illumina, California, USA) system, with  $2 \times 150$  bp, as in Jehl et al,  $2019^{56}$ . FASTQ files were mapped on the GRCg7b reference genome (GCF\_016699485.2) and the nf-co.re/rnaseq<sup>50</sup> pipeline version 3.8.1 was used

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for providing raw count and transcript per kilobase million (TPM) normalized expression per geneand sample.

#### 306 RNA-seq analysis

307 The normalized expression level was obtained using the trimmed mean of M-values (TMM) 308 scaling factor method, implemented in Bioconductor package edgeR version 3.32.1, with the 309 functions of "calcNormFactors" and "rpkm" used to scale the raw library sizes and scale of gene 310 model size respectively. In situations where TPM and TMM normalized expressions were  $\geq 0.1$ 311 and read counts  $\geq 6$  in at least 80% of the samples, the gene was considered as expressed. For 312 differential expression analysis we used the raw counts from the expressed genes previously 313 selected and normalized by the TMM method. The Bioconductor package edgeR was used to 314 perform the differential expression analysis, which is based on a generalized negative binomial 315 model for model fitting. The method of "edgeR-Robust" was used to account for potential outliers 316 when estimating per gene dispersion parameters. P-values were corrected for multiple testing using 317 the Benjamini-Hochberg approach to control the false discovery rate (FDR), and FDR < 0.05 was 318 used to identify significant DEG (Differentially Expressed Gene).

#### 319 **Pyromark validation**

For the DMC validation, the Pyrosequencing method was used to perform a quantitative methylation analysis of bisulfite-converted DNA for each individual. The pyrosequencing was performed using PyroMark Q24 (QIAGEN). All the primers (forward, reverse and sequencing primers) were designed with the PyroMark Assay Design software (Version 2.0.1.15, Qiagen) using the assay type "Methylation Analysis" (CpG) (Table S1).

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The PCR reaction contained 2 µl of bisulfite treated DNA sample (EZ DNA Methylation-Gold kit,
Zymo Research), 2.5 µl of buffer + 0.05 µl of Taq Polymerase (PCRBIO Classic Taq, Eurobio),
2.5 µl of dNTP (2mM, Promega), 1 µl of each primer (10 µM), and 5.95 µl of water. The program
on the thermal cycler (Thermocycleur ABI2720, Applied Bisystem) was: 95 °C for 5 min; followed
by 35 cycles of: 95 °C for 30 sec, hybridization temperature for 30 sec, and 72 °C for 30 sec; and
a final extension at 72 °C for 5 min.

Ten µl of PCR product were then mixed with 1 µl of Streptavidin sepharose<sup>TM</sup> high performance 331 332 (GE Healthcare) and 40 µl of PyroMark binding buffer (Qiagen). The mix was shaken at 1400 rpm 333 on a microplate mixer for at least 10 min. The immobilized PCR products were purified using 334 PyroMark Q24 vacuum workstation (manufacturer instructions, QIAGEN), mixed with 1 µl of a 335 sequencing primer (5µM) and 24 µl of Pyromark annealing buffer, and heated at 80 °C for 5 min 336 to anneal the sequencing primer before analysis on the PyroMark Q24. Results were analysed with 337 the PyroMark Q24 software (version 2.0.8, build 3, Qiagen). DNA methylation values obtained 338 via pyrosequencing were compared between the HS and Control groups using a Wilcoxon test.

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488

#### 489 Author contribution

FP, TZ and SLa conceived the experimental design and secured the funding. KK, JS and SLa
performed the analyses. KK, CC, GD, SF, AH and JNH participated in the bioinformatic and
statistical analyses. DG performed animal breeding. SLe performed molecular experiments. KK
drafted the manuscript, FP, SLa and TZ revised the manuscript draft. All authors read and
approved the final version.

#### 495 Data availability

496 The DNA methylation and RNA-seq datasets analyzed in the current study are available at ENA

497 (https://www.ebi.ac.uk/ena/browser/home) with accession numbers PRJEB70935 and

498 PRJEB28745, respectively.

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#### 499

#### 500 Competing interests

501 The authors declare no competing interests.

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#### 503 Figure legend

- 504 Fig 1: Experimental design
- 505 Fig 2: Preprocessed data A) Number of CpGs kept after each step of the pre-processing
- 506 workflow. B) Average methylation level around TSS regions.
- 507 Fig 3: Volcano plot of CpG methylation and DMCs between HS and CT.
- 508 *Hyper=hypermethylated; Hypo=hypomethylated, FDR=False Discovery Rate,*
- 509 *DMC=differentially methylated CpG site*
- 510 Fig 4: Manhattan plot of differential methylation analysis between HS and CT groups. The above
- 511 dashed line represents FDR  $\leq 0.05$  and solid line represents FDR  $\leq 0.01$ .
- 512 FDR=False Discovery Rate
- 513 Fig 5: Expression pattern of two lncRNA genes (LOC121110553, LOC121110554) across 47
- 514 tissues (https://gega.sigenae.org/)
- Fig 6: Distribution of total CpGs and DMCs (hypermethylated and hypomethylated) across thedifferent genomic regions.
- 517 Fig 7 : Gene Ontology functional analysis of the genes related to DMCs. The clustering heat map
- 518 plot of the functional sets of gene ontology (GO) terms was obtained using ViSEAGO. Gene
- 519 Ontology functional analysis with count showing information content and a dendrogram on
- 520 enriched GO terms based on BMA semantic similarity distance and Ward's clustering criterion.
- 521 Fig 8: Expression and methylation level of the 4 DMCs per group (CT and HS) for ATP9A.

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#### 527 Table 1. Differentially expressed genes between Heat Stress and Control groups.

Gene id	Gene Name	Chr	start	end	strand	Expression*	padj	fc	lfc
LOC100858942	LOC100858942	34	2198709	2201885	+	UP	0.01	242.44	7.92
LOC112531412	LOC112531412	JAENSK010000420.1	8859	18598	-	UP	0.03	98.82	6.63
LOC396217	MBP	2	90091375	90199666	+	UP	0.02	12.92	3.69
LOC419345	ATP9A	20	13450938	13503307	+	UP	0.01	2.57	1.36
LOC107054346	LOC107054346	12	1193659	1196336	+	DOWN	0.04	0.04	-4.48
LOC121108245	LOC121108245	Z	169136	201956	-	DOWN	0.01	0.08	-3.69
LOC100857335	LOC100857335	34	1513723	1516547	-	DOWN	0.01	0.1	-3.34
LOC107057116	ZNFY4	16	1583937	1595533	+	DOWN	0.01	0	-12.35
LOC121108653	LOC121108653	MU179258.1	33562	38085	+	DOWN	0.01	0.33	-1.62
LOC100502566	TMSB15B	4	1940045	1942512	+	DOWN	0.00	0.34	-1.57
LOC417488	CLIP2	19	3258667	3318184	-	DOWN	0.00	0.41	-1.28

528 \*Up: more expressed in HS than in CT, Down: less expressed in HS than in CT. fc: fold change, lfc: log2(fold change)













Distribution of total CpGs and DMCs across the different genomic regions

# BMA GOclusters distance heatmap





