Blood cell transcriptomic-based early biomarkers of adverse programming effects of gestational calorie restriction and their reversibility by leptin supplementation

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The challenge of preventing major chronic diseases requires reliable, early biomarkers. Gestational mild undernutrition in rats is enough to program the offspring to develop later pathologies; the intake of leptin, a breastmilk component, during lactation may reverse these programming effects. We used these models to identify, in peripheral blood mononuclear cells (PBMCs), transcriptomic-based early biomarkers of programmed susceptibility to later disorders, and explored their response to neonatal leptin intake. Microarray analysis was performed in PBMCs from the offspring of control and 20% gestational calorie-restricted dams (CR), and CR-rats supplemented with physiological doses of leptin throughout lactation. Notably, leptin supplementation normalised 218 of the 224 mRNA-levels identified in PBMCs associated to undernutrition during pregnancy. These markers may be useful for early identification and subsequent monitoring of individuals who are at risk of later diseases and would specifically benefit from the intake of appropriate amounts of leptin during lactation.

Prevention is the new paradigm in personalized nutrition and medicine. This perspective may benefit the approach to major chronic diseases such as obesity and its related pathologies, because of their increased worldwide prevalence and difficulty to treat. The development of effective preventive strategies requires reliable early biomarkers. The biomarkers that are conventionally used to predict the risk of obesity and its comorbidities mainly involve body weight, BMI, blood pressure, lipid profile, and plasma glucose and insulin levels. Rearing in mind the complexity of the mechanisms contributing to obesity and its related pathologies, there is a need for multiple novel biomarkers beyond the prediction of traditional metabolic risk factors. Application of early transcript-based metabolic markers might be more beneficial, providing more information regarding disease or physiological changes occurring in the body before phenotypic features become evident, as well as giving more time to intervene in the prevention of a future disease. Studies on molecular mechanisms revealing effects of diet on health usually imply invasive tissue biopsies. However, suitability of biomarkers for effective use requires that they can be easily accessed in humans. Peripheral blood mononuclear cells (PBMCs) provide an attractive alternative, as they can be easily and repeatedly collected in sufficient quantities. These cells are able to respond to internal and external signals, and thereby can be used as a source of biomarkers of health and disease, as their gene expression profile may reflect the physiological and pathological state of the organism.

Identification of early biomarkers requires the use of suitable animal models with a different predisposition to subsequent diseases. Of particular interest are the models whose bias is acquired due to the influence of common environmental and nutritional factors. In this sense, there is an accumulating body of evidence showing that maternal nutrition during the perinatal period has significant effects on fetal growth and can exert powerful influences upon long-term health and well-being. In this context, human and animal models associate maternal calorie-restriction during pregnancy with adverse health outcomes in adult offspring, mainly related, but not restricted, to the development of obesity, cardiovascular diseases and type II diabetes, particularly when
exposed postnatally to obesogenic conditions. Although the factors involved in the programming effects are not clearly known, the role of the hormone leptin is receiving special attention.

Leptin is mainly produced by the adipose tissue, but is also naturally present in significant amounts in breast milk. In addition to the well established role of leptin in the regulation of energy homeostasis in adulthood, it has been shown to play a critical role during development by programming hypothalamic circuit formation during a neonatal restricted window, which coincides with an increase in plasma leptin levels, the so-called leptin surge. In this sense, our group and others have evidenced that maternal undernourishment during gestation in rodents, which is associated with a disturbed neonatal leptin surge, perturbs hypothalamic structure and function, and hence results in a greater propensity for obesity and insulin resistance development in adulthood. More recently, we have also shown that daily administration of oral leptin at physiologic doses throughout lactation to the offspring of moderate calorie-restricted dams during gestation was able to revert most of the developmental malprogramming effects on hypothalamic structure and function. Similarly, daily subcutaneous injection of leptin into neonatal rats born to undernourished mothers has been shown to prevent the development of a programmed trend towards obesity and other metabolic alterations in later life. Positive effects of oral leptin during lactation are not restricted to the offspring of calorie-restricted dams during gestation, as we described for the first time that oral treatment with physiological doses of leptin throughout lactation to the offspring of ad libitum fed dams during gestation, protects against age-related overweight and prevents metabolic alterations associated to the intake of a high-fat diet. Other studies – which addressed the effects of early postnatal diet on healthy, lasting outcomes – revealed that infants who are breastfed are less likely to become obese than those who are exclusively formula fed, and a negative association has been found between maternal milk leptin levels and body weight increase of infants, which has been confirmed by other groups. Thus, leptin may be considered as an essential factor for programmed susceptibility to obesity acquired by fetal undernutrition.

Therefore, in the present study, we used whole genome transcriptome profiling of PBMCs of pups from calorie-restricted dams during gestation in order to identify early biomarkers of programmed susceptibility to obesity-related chronic diseases and to determine whether supplementation with physiological doses of leptin during the suckling period is able to revert these markers of developmental malprogramming.

### Results

**Anthropometric measurements and circulating parameters in the offspring.** Description of the phenotype of pups at birth and after weaning has been previously published. Here we summarize data related to body weight, body fat content and blood parameters (Table 1). Although mild maternal calorie restriction during gestation had no effects on the body weight of neonates rats, after weaning CR pups weighed less and exhibited lower body fat content than controls ($p < 0.05$; LSD post hoc one-way ANOVA test). Mentioned parameters were not influenced by oral leptin treatment throughout lactation ($p < 0.05$; LSD post hoc one-way ANOVA test).

As previously published, either maternal calorie restriction during gestation or leptin treatment throughout lactation did not affect circulating glucose and insulin levels at juvenile age (day 25); however, oral leptin treatment during the suckling period partially prevented the decreased plasma leptin levels found in CR rats ($p < 0.05$; LSD post hoc one-way ANOVA test).

**Gene expression in PBMCs of male animals at the age of 25 days based on whole-genome microarray analysis.** Whole genome microarray analysis was performed in PBMCs of 25 day-old male animals belonging to the 3 groups of animals (control, CR, and CR-Leptin). Of the 45,220 probes tested, 36,122 probes remained after background correction, normalization and merged replicated clones were further taken into account. In all, 473 unique genes were found to be significantly different between control and CR male animals ($p \leq 0.010$; limma t-test). Using available databases (Genecards, KEGG, NCBI, Reactome, UniProt, USCNI, WikiPathways), these genes were classified into several biological processes according to their function. 249 genes were unknown and were not considered. From the remaining 224 known genes, 58 exhibited down-regulation and 166 up-regulation (Figure 1). The processes with the highest number of differentially expressed genes were related to transcription/translation machinery, immune system, signaling, cell turnover and metabolism of proteins and polyamines. Other processes with a notable number of genes whose expression was altered were related to transport, metabolism of lipids, cytoskeleton, sensory perception, nervous system and neural signaling. The remaining genes were related to cell communication, blood (including genes related to blood coagulation, or with specific functions of hematopoietic cells), metabolism of carbohydrates, epigenetic modification, metabolism of nucleotides, metabolism of vitamins and minerals, and redox metabolism. Other biological processes such as fertilization.

### Table 1 | Offspring parameters: anthropometric measurements and circulating parameters in the offspring of rats with free access to standard chow diet (control), the offspring of 20% calorie restricted dams during the first 12 days of pregnancy (CR), and CR rats daily supplemented with physiological doses of leptin throughout lactation (CR-Leptin)

|                       | Males                          | Females                        |
|-----------------------|--------------------------------|--------------------------------|
| **Anthropometric measurements** | Control (CR) | CR-Leptin | Control (CR) | CR-Leptin |
| Body weight, day 1 (g) | 6.57 ± 0.18                   | 6.37 ± 0.11                     | 6.45 ± 0.12                     | 6.38 ± 0.08                   | 6.15 ± 0.13                     | 6.18 ± 0.12                     |
| Body weight, day 21 (g) | 47.0 ± 0.9 a                   | 43.2 ± 0.9 b                    | 43.9 ± 0.9 b                    | 45.4 ± 0.6 a                   | 42.2 ± 0.8 b                    | 42.8 ± 0.8 b                    |
| Body weight, day 25 (g) | 65.5 ± 1.1 a                   | 59.6 ± 1.2 b                    | 60.2 ± 1.2 b                    | 61.7 ± 0.7 a                   | 58.5 ± 1.2 b                    | 57.0 ± 1.0 b                    |
| Body fat, day 25 (%)   | 12.4 ± 0.3 a                   | 10.1 ± 0.2 b                    | 10.5 ± 0.2 b                    | 12.2 ± 0.2 a                   | 10.5 ± 0.2 b                    | 10.5 ± 0.2 b                    |
| **Circulating parameters (day 25)** | Glucose (mg/dL)                  | 148 ± 4                         | 145 ± 2                         | 138 ± 4                         | 149 ± 4                         | 148 ± 5                         | 142 ± 4                         |
|                        | Insulin (ng/L)                  | 170 ± 24                        | 204 ± 33                        | 221 ± 59                        | 248 ± 41                        | 240 ± 49                        | 163 ± 52                        |
|                        | Leptin (ng/L)                   | 2206 ± 170 a                    | 1798 ± 121 b                    | 2042 ± 45 b                     | 1689 ± 241 b                    | 1461 ± 145 b                    | 1414 ± 129 b                    |

Body weight was measured on postnatal days 1, 21 and 25. The other parameters were determined on day 25. Data are means ± S.E.M. For body weight at different days and body fat content, n = 16–17; for circulating parameters, n = 6–8. Each group is made up of animals coming from at least six different litters. Statistics: data not sharing a common letter are significantly different (a > b) ($p < 0.05$; LSD post hoc one-way ANOVA test).
detoxification, angiogenesis, and embryonic development, were grouped with the name ‘others’.

Subsequently, we performed statistical analyses to compare mRNA expression levels between CR and CR-Leptin groups and between CR-Leptin and control groups. Of the 224 known genes differently expressed in CR pups vs controls (p ≤ 0.010; limma t-test), 22 of these were found to be different between CR and CR-Leptin groups (p ≤ 0.010; limma t-test) and simultaneously not statistically different between control and CR-Leptin pups; thus, we assumed that the expression levels of these genes were totally reverted by oral leptin treatment throughout lactation. The detailed list of these genes is shown in Table 2. Transcript levels of the remaining 196 genes, which appeared to be affected by moderate maternal calorie restriction during gestation, became partially reverted by leptin treatment throughout lactation (Supplementary Table 1). These include the set of genes whose expression profile differed significantly in CR vs control males (p ≤ 0.010; limma t-test) but did not differ significantly in CR-Leptin vs CR and CR-Leptin vs control animals. Only 6 of the 224 genes whose expression levels were changed due to gestational calorie restriction (CR vs control males, p ≤ 0.010; limma t-test) were not reverted by leptin treatment throughout lactation, as their expression levels did not differ between CR and CR-Leptin groups and were significantly different between control and CR-Leptin groups (p ≤ 0.010; limma t-test). These genes were the following: cardiomyopathy associated 5 (Cmya5); defensin, alpha, 24 (Defa24); desmoglein 2 (Dsg2); secretory leukocyte peptidase inhibitor (Slpi); tryptophan hydroxylase 2 (Tph2); and tripartite motif-containing 23 (Trim23). These are related to the immune system, cell turnover, neural signaling and metabolism of protein processes. The results from the array concerning the 224 genes differently expressed between control and CR groups across individual samples are depicted in a heat map (Figure 2). This figure illustrates the similarity between control and CR-Leptin groups concerning the expression pattern of these genes.

Confirmation of microarray results in male animals by RT-qPCR and verification in females. To confirm gene array findings in male pups as well as to verify whether the described changes were also occurring in females, expression levels of a selected set of genes – the 22 genes whose expression levels were completely normalized in leptin-treated CR male pups – were analysed by RT-qPCR. Among those genes, the expression levels were found to be quantifiable by RT-qPCR for: collagen response mediator protein 1 (Crmpl); digestive organ expansion factor homolog (zebrafish) (Diexf); fos-like antigen 1 (Fosl1); galactosidase, alpha (Gla); glutaminase (Gls); low density lipoprotein receptor-related protein 11 (Lrp11); polyamine oxidase (exo-N4-amino) (Paox); ring finger protein 10 (Rnf10); selenium binding protein 1 (Selenbp1); solute carrier family 7 (amino acid transporter light chain, L system), member 5 (Slc7a5); thymosin beta 4, X-linked (Tmsb4x); and ubiquitin associated and SH3 domain containing, B (Ubash3b). The expression patterns of these genes in male and female animals are shown in Figure 3. RT-qPCR analysis fully confirmed most of the microarray data in male pups, and gene expression profile was largely similar in females. In detail, considering males and females, gestational calorie restriction resulted in higher mRNA levels of Crmpl, Gla, Gls, Lrp11, Paox, Tmsb4x and Ubash3b; in turn, leptin treatment throughout lactation significantly diminished transcript levels of these genes to the control values, reversing the effects observed in CR animals (p < 0.05; LSD post hoc two-way ANOVA test).

Differences concerning Rnf10 and Selenbp1 expression levels identified using the microarrays were partially confirmed by RT-qPCR analysis. Gestational calorie restriction brought about down-regulation of mRNA levels of both genes in CR animals (p ≤ 0.05; LSD post hoc two-way ANOVA). In turn, leptin supplementation throughout lactation partially normalized their levels to those observed in controls (p = 0.05; LSD post hoc two-way ANOVA).

RT-qPCR analysis revealed that mRNA levels of Diexf and Slc7a5 showed different expression pattern between sexes (interaction between group and sex; p = 0.05; two-way ANOVA). Leptin treatment throughout lactation resulted in total reversion of increased Diexf mRNA expression levels in CR females (p ≤ 0.05; LSD post hoc one-way ANOVA), whereas no statistical differences were observed
Table 2 | Detailed list of genes whose expression in PBMC samples of male rats at the age of 25 days was affected by gestational calorie restriction and totally reverted by oral leptin supplementation throughout lactation

| Biological process                  | Gene name                 | Gene symbol | Sequence ID   | CR vs Controls | CR-Leptin vs CR |
|-----------------------------------|---------------------------|-------------|---------------|----------------|-----------------|
|                                   |                           |             | P  | FC  | P  | FC  |
| Cell communication                | Small cell adhesion glycoprotein | Smagg  | NM_182817    | 0.000 -0.50 | 0.006 +0.41 |
| Cell turnover                     | Digestive organ expansion factor homolog (zebrafish) | Diexf   | NM_000103986 | 0.002 +0.73 | 0.006 -0.66 |
| Cytoskeleton                      | Fos-like antigen 1         | Fosl1      | NM_012953    | 0.003 -0.64 | 0.009 +0.60 |
|                                   | Selenium binding protein 1 | Selbp1     | NM_080829    | 0.001 -0.93 | 0.007 +0.81 |
| Metabolism [carbohydrates]        | Myosin IIb                 | Myo3b      | NM_001191901 | 0.007 -0.42 | 0.010 +0.43 |
| Metabolism [lipids]               | Thymosin beta 4, X-linked  | Tmbx4      | NM_001136    | 0.010 +0.84 | 0.010 -0.91 |
|                                   | Glia                       | Gia        | NM_001108820 | 0.004 +0.88 | 0.004 -0.96 |
|                                   | Arachidonate lipoxigenase 3 | Alox3     | NM_001105793 | 0.009 -0.54 | 0.005 +0.63 |
|                                   | Butyryl Coenzyme A synthetase 1 | Bucs1   | NM_001108502 | 0.004 -0.47 | 0.004 +0.51 |
|                                   | Low density lipoprotein receptor-related protein 11 | Lrp11    | NM_001106217 | 0.002 +0.70 | 0.001 -0.77 |
| Metabolism (proteins and polypeptides) | Glutaminase               | Gls        | NM_001109968 | 0.008 +0.74 | 0.007 -0.80 |
|                                   | Polyamine oxidase (exo-N4-amo) | Paox     | NM_001106311 | 0.008 +0.62 | 0.010 -0.64 |
|                                   | Ubiquitin associated and SH3 domain containing, 8 | Ubash3b | NM_001191792 | 0.010 +0.45 | 0.000 -0.65 |
| Neural signaling                  | Cholinergic receptor, nicotinic, delta | Chrnd  | NM_019298   | 0.006 -0.56 | 0.004 +0.62 |
|                                   | Gamma-aminobutyric acid (GABA) A receptor, alpha 6 | Gaba6   | NM_021841    | 0.002 -1.00 | 0.004 +0.96 |
| Nervous system                    | Glutamate receptor, metabotropic 6 | Grm6    | NM_022920    | 0.010 -0.66 | 0.004 +0.79 |
|                                   | Collapsin response mediator protein 1 | Crmp1  | NM_012932    | 0.004 +0.82 | 0.008 -0.78 |
|                                   | Myelin transcription factor 1 | Mtf1      | NM_001108615 | 0.007 -0.57 | 0.005 +0.64 |
|                                   | Ring finger protein 10      | Rnf10     | NM_001101904 | 0.003 -1.22 | 0.010 +1.11 |
| Signaling                         | Calcium channel, voltage-dependent, L type, alpha 1C subunit | Cacna1c | ENSRNOT00000009343 | 0.006 -0.65 | 0.009 +0.66 |
| Transport                         | Fyve and coiled-coil domain containing 1 | Fyco1  | NM_001106870 | 0.003 +0.57 | 0.010 -0.51 |
|                                   | Solute carrier family 7 [amino acid transporter light chain], member 5 | Slc7a5 | NM_017353    | 0.007 -0.87 | 0.000 +1.20 |

Controls: the offspring of rats with free access to standard chow diet; CR: the offspring of 20% calorie restricted dams during the first 12 days of pregnancy; CR-Leptin: CR rats daily supplemented with physiological doses of leptin throughout lactation. p-values (P) of microarray data (limma test) and fold change (FC) values (calculated as the difference between Log2 means) of CR vs Controls and CR-Leptin vs CR comparisons are indicated; +, indicates upregulation; –, downregulation. Threshold of significance was set at p = 0.010. Expression levels of these genes were not significantly different between control and CR-Leptin groups.

Discussion
One of the major challenges in developed societies is to implement therapeutic and, even more interestingly, preventive strategies, to fight the increasing prevalence of obesity and its related metabolic disorders. In this regard, there is an increased need for identification of reliable, early biomarkers of propensity to these alterations. This could serve as a tool to improve the accuracy of disease diagnosis and effectiveness of its prevention, as well as to monitor the efficacy of therapy used. Therefore, adding novel multimarkers beyond the traditional risk factors for obesity development may substantially improve early identification of susceptible individuals in order to implement effective therapeutic and/or preventive strategies. A growing number of studies exploring nutrigenomic-derived biomarkers focus on blood cells as a surrogate tissue, since they can be easily and repeatedly collected in humans, and hence may give a chance to apply results obtained from animal studies into humans. On the other hand, regarding obesity prevention, neonatal leptin treatment in rats has been found to prevent age- and high fat diet feeding-related overweight and other metabolic alterations.

Moreover, the intake of adequate amounts of leptin during the suckling period has been proposed as one of the strategies for reversing the effects of metabolic disorders induced as a consequence of developmental programming. Therefore, in this study we undertook these issues and attempted to identify early biomarkers that predict programmed susceptibility to obesity-related chronic diseases caused by moderate undernutrition during gestation and to monitor the response to neonatal leptin treatment using transcript-based biomarkers identified in PBMCs.

The outcomes of maternal undernutrition during gestation on the offspring have been broadly discussed in scientific literature. This prenatal condition exerts adverse health effects on the offspring, leading to hyperphagia, hypertension and greater fat accumulation, impaired insulin and leptin sensitivity, alterations in the structure and expression of neuropeptides regulating feeding behaviour in hypothalamus as well as alterations in adipose tissue and stomach sympathetic innervations. Our study, for the first time, reveals, at transcriptional level, the whole of the detrimental pro-surrogate tissue since they can be easily and repeatedly collected in humans, and hence may give a chance to apply results obtained from animal studies into humans.

On the other hand, regarding obesity prevention, neonatal leptin treatment in rats has been found to prevent age- and high fat diet feeding-related overweight and other metabolic alterations. Moreover, the intake of adequate amounts of leptin during the suckling period has been proposed as one of the strategies for reversing the effects of metabolic disorders induced as a consequence of developmental programming. Therefore, in this study we undertook these issues and attempted to identify early biomarkers that predict programmed susceptibility to obesity-related chronic diseases caused by moderate undernutrition during gestation and to monitor the response to neonatal leptin treatment using transcript-based biomarkers identified in PBMCs.

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Figure 2 | Heat map representing individual expression data of the genes differentially expressed in PBMCs between male offspring of control and calorie-restricted dams during gestation (CR) at the age of 25 days. Rows represent the 224 genes differentially expressed between control and CR pups ($p < 0.010$, limma $t$-test), sorted by fold change. Columns represent the log2 value of the expression of each gene in each animal studied.
Figure 3 | Q-PCR substantiation of microarray data of genes affected by gestational calorie restriction and totally reverted by oral leptin supplementation throughout lactation. To confirm and verify consistency of array findings, RT-qPCR was performed in PBMCs samples of both male and female offspring of control and calorie-restricted dams during gestation (CR) at the age of 25 days. mRNA levels were expressed as a percentage of the mean value of male controls. Data are mean ± S.E.M (n = 7–10 animals/group). Statistical analysis was performed by considering males and females as a whole (p ≤ 0.05; two-way ANOVA), and separately for each sex (p ≤ 0.05; one-way ANOVA). At any rate, data not sharing a common letter (a and b) are significantly different (a ≠ b) (p < 0.05; LSD post hoc one-way and two-way ANOVA). Symbols: G, effect of group; GxS, interaction between the effect of group and the effect of sex (p ≤ 0.05; two-way ANOVA); *, CR vs Controls (p < 0.05; Student’s t test); #, CR-Leptin vs CR (p < 0.05; Student’s t test); NS, not statistically significant.
offspring. The rational for performing microarray analysis only in males results from previous findings indicating that the overall detrimental effects of this prenatal condition were more marked in males than in females, particularly in terms of overweight and fat accumulation\textsuperscript{5,16,49}. Herein, we found that prenatal food restriction affected mRNA levels of 224 genes expressed in PBMCs. Induced changes in gene expression are mainly related to transcription and translation machinery, followed by genes related to immune system, which is not surprising as PBMCs are a subset of white blood cells. Gestational calorie restriction also affected PBMCs expression of genes involved, among others, in signalling, cell turnover, metabolism, transport, cytoskeleton, sensory perception, nervous system and neural signaling. Hence, we identified a comprehensive set of easily assessed transcript-based biomarkers that reflect a wide system of biological processes and can improve prediction of the programmed susceptibility to obesity and other pathologies induced by fetal undernutrition. Although it is true that, nowadays, the phenomenon of prenatal maternal undernutrition does not seem to be responsible for the increasing prevalence of obesity in developed countries, it might account for the increasing trends in the incidence of obesity-related pathologies in developing countries where maternal malnutrition is still widespread\textsuperscript{57}. Moreover, fetal undernutrition may also arise as a result of deficiency caused by maternal failure of complete absorption of food components\textsuperscript{60} and differences in seasonal food availability\textsuperscript{61}.

Interestingly, we also show here the overall effects of leptin supplementation throughout the suckling period in reverting gene expression alterations in PBMCs induced by maternal undernutrition during gestation. Neonatal leptin treatment normalized the expression of almost all of the genes whose expression was affected by calorie restriction during gestation in male offspring, with the exception of 6 genes. Among the 218 genes whose expression was normalized, 196 genes reverted partially and 22 were totally reverted. The results highlight the potential role of leptin during the suckling period, which might be worth considering when searching for strategies to treat and/or prevent the programmed trend to obesity acquired by inadequate fetal nutrition, particularly in susceptible subgroups. Microarray findings in PBMC samples from male animals were substantiated by analyzing expression levels of a selection of genes by RT-qPCR. We focused on the 22 genes whose expression levels were completely normalized in leptin-treated CR male pups. mRNA expression levels of the same set of genes were also determined in PBMC samples of female animals to verify whether their behaviour was similar to that of males. Among the 22 genes analyzed, expression levels of several of these (Crmp1, Gla, Glis, Lrp11, Paxo, Tmsb4x and Ubash3b) emerged as particularly promising to be used as biomarkers because qPCR analyses fully confirmed microarray data and showed similar behavior between males and females. In addition to the aforementioned genes, other genes such as Rnf10, Selrenp1, Dicef and Sckt7a5 may also be of interest. qPCR analysis of the expression of Rnf10 and Selrenp1 genes in both genders showed similar patterns to those found for males with the microarray analysis, although decreased expression levels occurring in CR animals vs their controls were only partially reverted by leptin treatment during lactation. Sexual dimorphism was found concerning the expression pattern of the Dicef and Sckt7a5 genes in blood cells as an effect of treatment. The increased expression levels of the Dicef gene became totally reverted by leptin treatment, but only in the group of females, and no changes were found in males. Concerning Sckt7a5, decreased expression levels of this gene occurring in CR animals were only normalized by leptin treatment during lactation in males, but not in females. Details regarding the proteins encoded by these genes and their potential functions are included as supplementary material (Supplementary Table 2). Besides the annotated basal function of proteins encoded by these genes, some of them have been found to serve as a bridge for several key biological pathways, and showed a significant association with some of the disease outcomes, although their specific function in PBMCs has not been generally explored.

Herewith, we identified a comprehensive set of easily assessed transcript-based biomarkers, with a particular emphasis for 7 of them (Crmp1, Gla, Glis, Lrp11, Paxo, Tmsb4x and Ubash3b), reflecting the reversion of a wide system of developmentally programmed biological processes induced by relative fetal undernutrition. Although the exact function of each of these genes in PBMCs remains to be determined, identification of these markers, indicators of efficacy of neonatal leptin treatment, supports evidence of the positive effects of leptin intake during the suckling period on later health programming.

Taken together, the results from this study show that leptin supplementation throughout lactation is able to revert the expression of most of the identified potential early biomarkers of programmed obesity risk and other metabolic alterations associated to undernutrition during pregnancy. These findings support the potential importance of leptin during lactation, a specific component of maternal milk, which might be of relevance when considering strategies to treat and/or prevent the programmed trend to diseases acquired by inadequate fetal nutrition, particularly in susceptible subgroups. Moreover, the biomarkers identified in the present study, if validated in humans, may allow the identification and subsequent monitoring of individuals at early ages who are at greater risk of developing obesity and other pathologies, and whose alterations can be reverted by the intake of adequate amounts of leptin during lactation.

**Methods**

**Ethics statement.** All experiments were performed in accordance with the approved guidelines. The animal protocol was approved by the Bioethical Committee of the University of the Balearic Islands (Resolution Number 8453. June, 2010).

**Animals and Experimental Design.** The animal protocol followed in this study has been previously described in detail\textsuperscript{56}. Briefly, male and female Wistar rat pups coming from 17 litters and belonging to 3 different groups (control, CR and CR-Leptin) were used, according to the schema presented in Figure 4. Animals were housed under standard laboratory conditions (12 h dark and light cycle, 22 °C) and allowed free access to water and a standard chow diet (3.3 kcal/g; Panlab, Barcelona, Spain), unless specified.

Virgin female rats were mated with male rats. After conception, the group of calorie-restricted dams (n = 10 animals) was submitted to 20% calorie restriction diet during the first 12 days of gestation, while the group of control dams (n = 7 animals) was fed ad libitum. After delivery, male and female offspring of calorie-restricted dams was distributed into two groups: CR and CR-Leptin. The group of CR-Leptin pups was treated orally throughout lactation with a water solution of recombinant murine leptin (PeproTech, London, UK). As established previously\textsuperscript{15}, the dosis of leptin was at physiological level, progressively increased from 1 ng to 43.8 ng through this period. CR pups and the offspring of control dams (controls) were treated orally with the vehicle (water).

At weaning (day 21), pups from control, CR and CR-Leptin groups (35, 34 and 33 pups, respectively) were used. They were housed (n = 2 per cage) and fed on a standard chow diet until their decapitation at the age of 25 days, under ad libitum feeding conditions. After sacrifice, trunk blood was collected from neck for PBMCs isolation and gene expression analysis (n = 10–11 animals per group), and for plasma circulating parameters determination (n = 6–8 per group). To obtain the plasma, blood was collected in heparinized tubes and centrifuged at 1000 g for 10 min. Animals used for analyses were from a minimum of six different litters.

**PBMC isolation.** Trunk blood samples of control, CR and CR-Leptin pups collected at the age of 25 days under ad libitum feeding conditions, were used to isolate PBMCs. Peripheral blood samples were collected using EDTA (final concentration of 3–4 mM) as anticoagulant, and then diluted with an equal volume of buffered saline (isosmotic). PBMCs were immediately isolated by OptiPrep density-gradient separation (Sigma Aldrich Quimica SA, Madrid, Spain) according to the manufacturer’s instructions.

**Total RNA isolation.** Total RNA was extracted from PBMCs of control, CR and CR-Leptin male and female animals by EZNAP Complete TOTAL RNA kit I (Omega Bio-Tek Inc., Norcross, GA, USA) following the manufacturer’s instructions.

**Microarray processing.** For microarray analysis, RNA from PBMC samples obtained from male offspring of controls, CR and CR-Leptin animals at the age of 25 days were used (n = 10–11/group). RNA samples were analyzed on Agilent 2100 Bioanalyzer with RNA 6000 Nano chips (Agilent Technologies, Barcelona, Spain). To ensure the
After conception, the group of calorie-restricted dams was supplied with 20% calorie restriction diet from day 1 to day 12 of gestation, while the group of control dams was fed ad libitum. At birth, the offspring of control dams (control) was treated orally with vehicle throughout lactation, and the other group was treated with a daily oral dose of leptin (CR-Leptin) throughout lactation. Daily oral dose of leptin was 5 times the average amount of daily leptin intake from maternal milk. Offspring was weaned at the age of 21 days and fed with normal fat diet until their sacrifice at the age of 25 days, when blood samples for plasma and PBMCs were obtained.

Microarray data analysis. The arrays were scanned with an Agilent Microarray Scanner (Agilent Technologies). Scanned images were examined for visible defects and proper grid alignment. The intensities of the signals from each spot were quantified, and the raw data were extracted using Feature Extraction Software version 10.10.1.1 (Agilent Technologies). Background correction and normalization were performed within the Babelomics platform (http://www.babelomics.org), a suite of web tools for microarray data analysis50. Differential gene expression between groups of animals (CR vs controls, CR-Leptin vs CR, and CR-Leptin vs controls) was assessed using the limma package from Bioconductor, implemented into Babelomics web platform51. The threshold of significance for the test was set at p ≤ 0.01. Subsequently, a statistically generated list of genes was manually analyzed in regard to their biological information, obtained with the use of available databases (Genecards, KEGG, NCBI, Reactome, UniProt, USCN, WikiPathways) based on key biological domains, such as molecular function and biological process. Genes whose expression levels were significantly different between control and CR groups were plotted in a heatmap using R (v 3.1.1, R Development Core Team). To control for false positives we performed the Benjamin-Hochberg false discovery rate (FDR) test; all the genes with a p < 0.01 had an adjusted p value < 0.42. Fold change (FC), defined here as a difference in log2 mean values between experimental groups, was also calculated within the Babelomics platform.

Real-time quantitative RT-polymerase chain reaction (RT-qPCR) analysis. To validate microarray data, mRNA expression levels of selected genes: collapsin response mediator protein 1 (Crmpl); digestive organ expansion factor homolog (zebrafish) (Diexf); fos-like antigen 1 (Fosl1); galactosidase, alpha (Gla); glutaminase (Gls); low density lipoprotein receptor-related protein 11 (Lrp11); polypeptide oxidase (exo-N4-amino) (Paox); ring finger protein 10 (Rnf10); selenium binding protein 1 (Selenbp1); solute carrier family 7 (amine acid transporter light chain, L system, member 5 (Slc7a5); thymosin beta 4, X-linked (Tmbb4x); ubiquitin associated and

Table 3 | Sequences of primers and amplicon size used for qRT-PCR

| Gene   | Forward primer (5’ to 3’) | Reverse primer (5’ to 3’) | Amplicon (bp) |
|--------|---------------------------|---------------------------|---------------|
| Crmp1  | TGAATTGGTGTCTGCCTGCTT    | GGAATTGGTGTCTGCCTGCTT    | 248           |
| Diexf  | TTTACAAGCATCTCACTCTT     | GCCATCTCACTCATTCTT       | 258           |
| Fosl1  | GCTAGGAAAGGGGATCAGGG     | CGTGGGAAGGGGATCAGGG     | 261           |
| Gla    | TCCCCAGTGGCAAAATGTC      | TCCCCAGTGGCAAAATGTC      | 199           |
| Gls    | AGGAGCGAGAAAGGGATCAGGG   | AGGAGCGAGAAAGGGATCAGGG   | 133           |
| Lrp11  | ACAGCAGCAGCAGCATT        | CCGGGGAAACAGCACTTACCA   | 198           |
| Paox   | TACCACCAGCTGCTTCACTTCT   | TAAAAACCATGCTTCACTTCTG   | 190           |
| Rnf10  | CTGCTGCACTCTCTGCTG       | CTGCTGCACTCTCTGCTG       | 206           |
| Selenbp1 | TGGGAAAAAAGAAAAAAGGG    | AAGGTTGGTGAGGAGGACAGAAG | 124           |
| Tmbb4x | GCCACGCAGCAGCATTACCT     | CCGTGGCTGAGCTTTCCTCC    | 278           |
| Ubash3b| ATCTACTGTTCCGCTTCTTTTTGT | TGTTCGGGGAGGATTCTTCTT | 189           |

Abbreviations: Crmp1, digestive organ expansion factor homolog (zebrafish); Diexf, fos-like antigen 1 (Fosl1); Gla, galactosidase, alpha; Gls, glutaminase; Lrp11, low density lipoprotein receptor-related protein 11; Paox, polypeptide oxidase (exo-N4-amino); Rnf10, ring finger protein 10; Selenbp1, solute carrier family 7 (amine acid transporter light chain, L system, member 5; Slc7a5, thymosin beta 4, X-linked; Tmbb4x, ubiquitin associated and

Figure 4 | Schematic diagram of experimental design. After conception, the group of calorie-restricted dams was supplied with 20% calorie restriction diet from day 1 to day 12 of gestation, while the group of control dams was fed ad libitum. At birth, the offspring of control dams (control) was treated orally with vehicle throughout lactation, and the offspring of calorie-restricted dams was divided into two groups: one group was also treated orally with vehicle (CR) and the other group was treated with a daily oral dose of leptin (CR-Leptin) throughout lactation. Daily oral dose of leptin was 5 times the average amount of daily leptin intake from maternal milk. Offspring was weaned at the age of 21 days and fed with normal fat diet until their sacrifice at the age of 25 days, when blood samples for plasma and PBMCs were obtained.
levels of the same set of genes were analyzed in PBMC samples of control, CR and CR-Leptin male animals. In addition, mRNA expression

9. Caimari, A., Oliver, P., Keijer, J. & Palou, A. Peripheral blood mononuclear cells as a tool in dietary intervention analysis. Statistical significances were assessed by one-way (separately for each sex) test. Student’s t test was used to compare individual means. P < 0.05 was defined as the threshold of significance, unless stated. Statistics were computed with SPSS Statistics 19.0 (SPSS, Chicago, IL).

Statistical analysis. Data are expressed as mean ± SEM. The statistical analysis of microarray data has been described in detail in the previous section (microarray data analysis). Statistical significances were assessed by one-way (separately for each sex) and two-way ANOVA, and least significance difference (LSD) post hoc test. Student’s t test was used to compare individual means. P < 0.05 was defined as the threshold of significance, unless stated. Statistics were computed with SPSS Statistics 19.0 (SPSS, Chicago, IL).

SH3 domain containing, B (Ueho3b) were measured by RT-qPCR in PBMC RNA samples of control, CR and CR-Leptin male animals. In addition, mRNA expression

10. Rasmussen, K. M. The ‘‘fetal origins’’ hypothesis: challenges and opportunities for maternal and child nutrition. Annu Rev Nutr 29, 143–164 (2009).

11. Garcia, A. P. et al. Early alterations in plasma ghrelin levels in offspring of calorie-restricted rats during gestation may be linked to lower sympathetic drive to the heart. Int J Obes (Lond) 34, E648–E652 (2012).

12. Vickers, M. H., & Breier, B. H., Catfield, W. S., Hofman, P. L. & Gluckman, P. D. Fetal origins of hyperphagia, obesity, and hypertension and postnatal amplification by hypercaloric nutrition. Am. J. Physiol Endocrinol Metab 279, E83–E87 (2000).

13. Pico, C. et al. The intake of physiological doses of leptin during lactation in rats prevents obesity in later life. Int J Obs (Lond) 31, 1199–1209 (2007).

14. Jones, R. Obesity: Leptin intake during the suckling period may protect against obesity and metabolic-related disorders. Nat Rev Gastroenterol Hepatol 7, 359 (2010).

15. Houseknight, K. L., McGuire, M. K., Portocarrero, C. P., McGuire, M. A. & Beerman, K. Leptin is present in human milk and is related to maternal plasma leptin concentration and adiposity. Biochem. Biophys. Res. Commun. 240, 742–747 (1997).

16. Schwartz, M. W., Woods, S. C., Porte, D., Jr., Seeley, R. J. & Baskin, D. G. Central nervous system control of food intake. Nature 404, 661–671 (2000).

17. Arora, S. & Anubhuti. Role of neuropeptides in appetite regulation and obesity—a review. Neuropeptides 40, 475–401 (2006).

18. Bouret, S. G., Draper, S. J. & Simerly, R. B. Trophic Action of Leptin on Hypothalamic Neurons That Regulate Feeding. Science 304, 108–110 (2004).

19. Bouret, S. G. & Simerly, R. B. Developmental programming of hypothalamic feeding circuits. Clin Genet. 70, 295–301 (2006).

20. Yura, S. et al. Role of premature leptin secretion in obesity resulting from intrauterine undernutrition. Cell Metab 1, 371–378 (2005).

21. Delahaye, F. et al. Maternal perinatal undernutrition drastically reduces postnatal leptin surge and affects the development of arcuate nucleus proopiomelanocortin neurons in neonatal male rat pups. Endocrinology 149, 470–475 (2008).

22. Ikenasio-Thorpe, B. A., Breier, B. H., Vickers, M. H. & Fraser, M. Prenatal influences on susceptibility insulinsensitivity are mediated by altered neuroendocrine gene expression. J. Endocrinol. 193, 31–37 (2006).

23. Garcia, A. P. et al. Moderate caloric restriction during gestation results in lower arcuate nucleus NPY- and alphaMSH-neurons and impairs hypothalamic response to fed/fasting conditions in weaned rats. Diabetes Obes Metab 12, 403–413 (2010).

24. Konieczna, J. et al. Oral Leptin Treatment in Suckling Rats Ameliorates Detrimental Effects in Hypothalamic Structure and Function Caused by Maternal Caloric Restriction during Gestation. PLoS One 8, e81906 (2013).

25. Vickers, M. H. et al. Maternal leptin treatment reverses developmental programming. Endocrinology 143, 4211–4216 (2002).

26. Vickers, M. H. et al. The effect of neonatal leptin treatment on postnatal weight gain in male rats is dependent on maternal nutritional status during pregnancy. Endocrinology 149, 1906–1913 (2008).

27. Sanchez, J. et al. Oral supplementation with physiological doses of leptin during lactation in rats improves insulin sensitivity and affects food preferences later in life. Endocrinology 149, 733–740 (2008).

28. Pierro, T., Sanchez, J., Palou, A. & Pico, C. Leptin intake during the suckling period improves the metabolic response of adipose tissue to a high-fat diet. Int J Obs (Lond) 34, 809–819 (2010).

29. von Kries, R. et al. Breast feeding and obesity: cross sectional study. BMJ 319, 147–150 (1999).

30. Armstrong, J. & Reilly, J. J. Breastfeeding and lowering the risk of childhood obesity. Lancet 359, 2003–2004 (2002).

31. Miralles, O., Sanchez, J., Palou, A. & Pico, C. A physiological role of breast milk leptin in body weight control in developing infants. Obesity. (Silver. Spring) 14, 1371–1377 (2006).

32. Schuster, S., Hecher, C., Gebauer, C., Kiiess, W. & Kratzsch, J. Leptin in maternal serum and breast milk: association with infants’ body weight gain in a longitudinal study over 6 months of lactation. Pediatr. Res 70, 633–637 (2011).

33. Doneray, H., Orbak, Z. & Yildiz, L. The relationship between breast milk leptin and neonatal weight gain. Acta Paediatr. 98, 643–647 (2009).

34. Pico, C., Jirkova, Z. M., Kus, V., Palou, A. & Kopecky, J. Perinatal programming of body weight control by leptin: putative roles of AMP kinase and muscle thermogenesis. Am J Clin Nutr 94, 1830S–1837S (2011).

35. Vickers, M. H. & Sobeda, D. M. Strategies for reversing the effects of metabolic disorders induced as a consequence of developmental programming. Front Physiol 3, 242 (2012).

36. Sanchez, J. et al. Blood cells as a source of transcriptional biomarkers of childhood obesity and its related metabolic alterations: results of the IDEFICS study. J Clin Endocrinol Metab 97, E648–E652 (2012).

37. Pierro, T. et al. Influence of breastfeeding on blood-cell transcript-based biomarkers of health in children. Pediatr Obes 9, 463–470 (2014).

38. Garcia, A. P. et al. Moderate caloric restriction during gestation in rats alters adipose tissue sympathetic innervation and later adiposity in offspring. PLoS One 6, e17733 (2011).

39. Garcia, A. P. et al. Early alterations in plasma ghrelin levels in offspring of calorie-restricted rats during gestation may be linked to lower sympathetic drive to the stomach. Peptides 39, 59–63 (2013).

40. Jones, A. P. & Friedman, M. I. Obesity and adipocyte abnormalities in offspring of restricted feeding. Science 215, 1518–1519 (1982).

41. Rasmussen, K. M. The “fetal origins” hypothesis: challenges and opportunities for maternal and child nutrition. Annu Rev Nutr 21, 73–95 (2001).

42. McArdle, H. J. & Ashworth, C. J. Micronutrients in fetal growth and development. Br Med Bull. 55, 499–510 (1999).
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Author contributions
Conceived and designed the experiments: A.P. and C.P. Performed the experiment: J.K., J.S. and M.P. Analyzed the data: J.K., J.S. and C.P. Contributed reagents/materials/analysis tools: J.K., J.S. and M.P. Wrote the manuscript: J.K., C.P. and A.P. All authors reviewed the final manuscript.

Additional information
Supplementary information accompanies this paper at http://www.nature.com/scientificreports

Competing financial interests: A.P., C.P. and J.S. are authors of a patent held by the University of the Balearic Islands entitled “Use of leptin for the prevention of excess body weight and composition containing leptin” (WO 2006089987 A1) (Priority data: 23 February 2005). A.P., C.P., J.K., J.S. and M.P. are authors of a patent application of the University of the Balearic Islands entitled “Method for the prediction and or prevention of overweight, obesity and/or its complications by gene expression analyses”. (P201430428, Spain) (Priority data: 26 March 2014).

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