

Transcriptional modulation of the developing immune system by early life social adversity

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To identify molecular mechanisms by which early life social conditions might influence adult risk of disease in rhesus macaques (*Macaca mulatta*), we analyze changes in basal leukocyte gene expression profiles in 4-mo-old animals reared under adverse social conditions. Compared with the basal condition of maternal rearing (MR), leukocytes from peer-reared (PR) animals and PR animals provided with an inanimate surrogate mother (surrogate/peer reared, SPR) show enhanced expression of genes involved in inflammation, cytokine signaling, and T-lymphocyte activation, and suppression of genes involved in several innate antimicrobial defenses including type I interferon (IFN) antiviral responses. Promoter-based bioinformatic analyses implicate increased activity of CREB and NF- κ B transcription factors and decreased activity of IFN response factors (IRFs) in structuring the observed differences in gene expression. Transcript origin analyses identify monocytes and CD4⁺ T lymphocytes as primary cellular mediators of transcriptional up-regulation and B lymphocytes as major sources of down-regulated genes. These findings show that adverse social conditions can become embedded within the basal transcriptome of primate immune cells within the first 4 mo of life, and they implicate sympathetic nervous system-linked transcription control pathways as candidate mediators of those effects and potential targets for health-protective intervention.

stress | social genomics | gene regulation

Exposure to adverse social environments during early life is associated with increased risk of disease in adulthood (1–5), but the biological mechanisms producing such effects remain poorly understood. One possible explanation suggests that neural and endocrine responses to adversity in childhood affect the development of health-relevant molecular systems (i.e., a “defensive programming” of the developing body) (4, 6–10), rendering the body more vulnerable to subsequent pathogen challenges in adulthood (11, 12). Given the transience of most neuroendocrine responses, however, it remains unclear how the extraorganismic social conditions that do “get into the body” during early life could “stay there” over decades to impact the risk of disease in adulthood (13).

One molecular mechanism that could potentially create a persisting biological impact of early life socio-environmental conditions involves the complex systems behavior of the gene transcriptional networks that govern cell growth, differentiation, and function (14, 15). Gene regulatory networks show dynamic landscapes in which the system’s responses to external perturbations converge on a small number of stable “attractor” modes that can subsequently self-perpetuate (16). These self-perpetuating dynamics are sustained in part by the fact that the mRNA “output” of the system at one point in time (i.e., the genome-wide transcriptional profile) constitutes an “input” to the system at subsequent time points because translated mRNA shapes the cell’s response to future environments (17). Mathematical models of human development that capture such recursive dynamics show that small exogenous influences early in life can significantly alter the course of subsequent life trajectories (18–20). What is not

known is which specific genes might be sensitive to such early life environments.

Several recent studies have linked adverse social conditions in early life with adult differences in gene expression in cells of the nervous and immune systems (8–10, 21, 22). Early life social adversity has also been associated with adult cell differences in transcription-related epigenetic features such as DNA methylation (23–25). To determine whether these adult transcriptional alterations might potentially stem from a biological reprogramming of the developing immune system during early life, we analyze the genome-wide transcriptional profile of circulating leukocytes in infant rhesus macaques (*Macaca mulatta*) after 4 mo of experimentally imposed social adversity (peer vs. maternal rearing) (26). To the extent that adverse social conditions become rapidly embedded into the gene regulatory regime of the developing immune system, we expect that (i) surrogate/peer-rearing (SPR) and peer-rearing (PR) conditions increase the expression of genes involved in inflammation while decreasing expression of genes involved in type I IFN-mediated innate antiviral responses [i.e., the “conserved transcriptional response to adversity” previously observed in adults (9, 27–32)] and (ii) these effects are structured by transcription control pathways linked to stress-responsive “social signal transduction” pathways such as the sympathetic nervous system (SNS) and hypothalamus–pituitary–adrenal (HPA) axis (10, 13, 17, 32). These hypotheses are tested by coupling microarray-based assessment of the entire macaque transcriptome with recent advances in computational bioinformatics (33) and multiple-hypothesis testing (34–36) to map large ensembles of differentially expressed genes into a small number of higher-order biological themes regarding their regulatory causes (e.g., transcription factor activity) (37), cellular contexts (e.g., originating leukocyte subtype) (30), and functional consequences (e.g., Gene Ontology functional annotations) (38).

Results

Effects of Surrogate/Peer Rearing. Previous studies have identified substantial increases in adult health risk in macaques exposed to SPR conditions in early life (5). Our initial analyses compare leukocyte transcriptional profiles in peripheral blood mononuclear cells (PBMCs) from 4 mo-old SPR animals ($n = 4$) relative to those from maternally reared (MR) animals ($n = 5$). Genome-

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Data deposition: The data reported in this paper have been deposited in the Gene Expression Omnibus (GEO) database, www.ncbi.nlm.nih.gov/geo (accession no. GSE35850).

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wide transcriptional profiling identified 249 transcripts showing a twofold or greater difference in average expression levels (85 up-regulated in SPR vs. MR and 164 down-regulated). Fig. 1 displays these transcriptome differences. **Dataset S1** lists specific up- and down-regulated genes.

Gene Ontology analyses (**Dataset S2**) characterize the genes up-regulated in PBMCs from SPR animals as being involved in multiple biological processes mediating immune activation, including metabolic activation (e.g., oxidation/reduction and glycogen metabolism), cytokine signaling (e.g., Interleukin 27, Leukemia Inhibitory Factor, Ciliary Neurotrophic Factor, Notch, and STAT1/STAT3 signaling), and T-cell proliferation. EntrezGene annotations for several up-regulated genes also indicate a common role in inflammation and tissue remodeling (e.g., **Dataset S1**: *IL8*, *MMP1*, *CCR3*, and *CCL2/MCP1*) (39). Down-regulated genes are characterized by involvement in innate immune response functions, such as antigen processing and presentation, antimicrobial defense responses (e.g., to bacteria and fungi), and liver development (**Dataset S2**). SPR down-regulated genes also include multiple transcripts identified in previous research as being involved in type I IFN-mediated innate antiviral responses (e.g., **Dataset S1**: *GBP1*, *IFIT1*, *IFIT2*, *IFITM3*, and *IRF7*) (39–42). Consistent with these functional bioinformatic results implicating T-cell activation and altered innate immune responses, transcript origin analyses identify monocytes and CD4⁺ T lymphocytes as major cellular sources of SPR up-regulated genes and B lymphocytes as major sources of SPR down-regulated genes (Fig. 1B).

To test the hypothesis that the observed differences in gene expression might be mediated by reciprocal up-regulation of proinflammatory NF- κ B family transcription factors and down-regulation of IFN response factor (IRF) family transcription factors, we carry out Transcriptional Element Listening System (TELiS) bioinformatic analysis of transcription factor-binding motifs in the promoters of differentially expressed genes. As in previous studies of social adversity (9, 27–29, 31, 32, 43), NF- κ B target motifs are significantly overrepresented within the promoter sequences of up-regulated genes and IRF motifs are significantly enriched within the promoter sequences of down-regulated genes (Fig. 1C). To determine whether such dynamics might be structured by social signal transduction pathways involving the SNS and the HPA axis (10, 13, 17, 32, 44), TELiS analyses also examine

motifs associated with the CREB transcription factors involved in β -adrenergic signaling by SNS catecholamines and glucocorticoid response elements (GREs) associated with HPA-axis signaling through the glucocorticoid receptor (GR). Results show significant enrichment of CREB sites within promoters of up-regulated genes, but no significant difference in GRE prevalence (Fig. 1C).

Effects of Peer Rearing. To determine whether similar dynamics might emerge in PR animals that lacked access to an inanimate surrogate mother and spent more time in contact with peers, we also compare PBMC gene expression profiles in PR animals ($n = 4$) vs. MR animals ($n = 5$). Analyses identify 256 transcripts showing a twofold or greater difference in average expression (105 up-regulated in PR vs. MR and 151 down-regulated; Fig. 2 and **Dataset S3**). Gene Ontology analyses again identify up-regulated genes as being involved in metabolic activation (ATP synthesis and electron transport chain, oxidation/reduction, and glycogen metabolism), gene translation, cytokine signaling (Interleukin 27, Leukemia Inhibitory Factor, Ciliary Neurotrophic Factor, Notch, and STAT1/STAT3 signaling), and T-cell proliferation (**Dataset S4**). Down-regulated genes are again characterized by involvement in innate immune response functions, including antigen processing and presentation and antimicrobial responses to bacteria, fungi, and viruses. Prominent among down-regulated transcripts are multiple genes involved in type I IFN-mediated innate antiviral responses (e.g., **Dataset S3**: *GBP1*, *IFI27*, *IFIT1*, *IFIT2*, *IFITM3*, *IRF7*, *MX1*, and *MX2*) (39–42). Gene Ontology annotations also link down-regulated genes to liver development and fat cell differentiation (**Dataset S4**). Transcript origin analyses identify monocytes and CD4⁺ T lymphocytes as cellular mediators of PR up-regulated genes (Fig. 2B) and B lymphocytes as cellular mediators of down-regulated genes. TELiS promoter-based bioinformatics again implicate a reciprocal increase in activity of NF- κ B and decrease in activity of IRF transcription factors in structuring the observed differences in immune response gene expression (Fig. 2C). TELiS analyses also indicate increased CREB activity, but provide no evidence of decreased GR-mediated transcription (Fig. 2C).

Comparison of Peer and Surrogate/Peer Rearing. The qualitative similarity in effects of SPR and PR conditions is underscored by the fact that relatively few genes show a twofold or greater

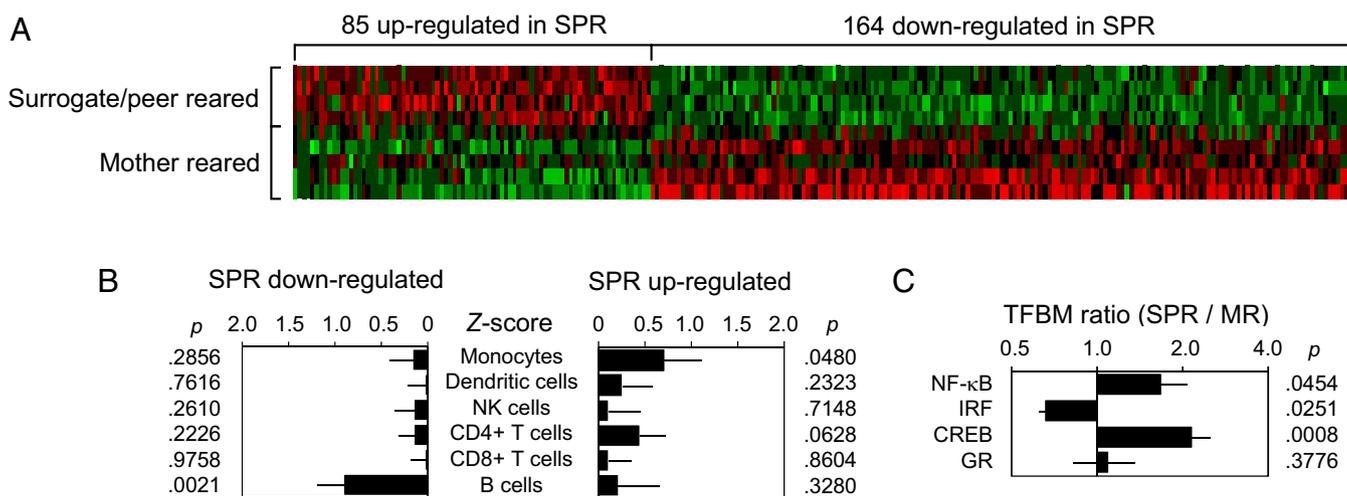


Fig. 1. Differential gene expression in leukocytes from mother-reared vs. surrogate/peer-reared macaques. (A) Heat plot representation of gene expression values for 249 transcripts showing a twofold or greater difference in average expression between peripheral blood mononuclear cells (PBMCs) from surrogate/peer-reared (SPR) rhesus macaques and those from maternally reared (MR) rhesus macaques. Rows, animals; columns, gene transcripts; red, up-regulated gene expression; green, down-regulated gene expression. (B) Transcript origin analyses assessing cellular origins of differentially expressed genes within specific PBMC subsets. (C) Relative prevalence of binding motifs for NF- κ B, IRF, CREB, and GR transcription factors within promoters of genes up-regulated in PBMCs from SPR vs. MR animals.

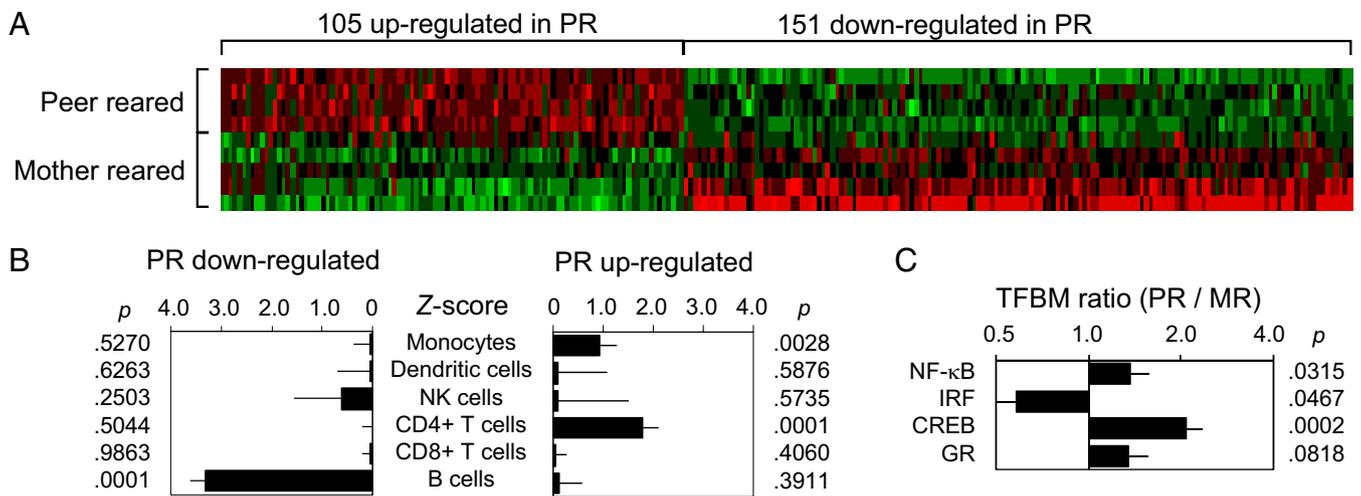


Fig. 2. Differential gene expression in leukocytes from mother-reared vs. peer-reared macaques. (A) Heat plot representation of gene expression values for 256 transcripts showing a twofold or greater difference in average expression between PBMCs from peer-reared (PR) rhesus macaques and those from maternally reared (MR) rhesus macaques. (B) Transcript origin analyses assessing cellular origins of differentially expressed genes within specific PBMC subsets. (C) Relative prevalence of binding motifs for NF- κ B, IRF, CREB, and GR transcription factors within promoters of genes up-regulated in PBMCs from PR vs. MR animals.

difference in average expression in direct comparison of these two groups ($n = 48$ up-regulated and 31 down-regulated, or less than one-third the number of differences observed in comparisons of each group with MR gene expression profiles; [Dataset S5](#)). Both SPR and PR groups show similar patterns of transcriptional differentiation from MR animals, with 49% (42/85) of SPR up-regulated transcripts also up-regulated by PR and 48% (79/164) of SPR down-regulated transcripts also down-regulated by PR (both exceeding the $<0.1\%$ overlap expected by chance; $P < 0.0001$). Gene Ontology analyses also identify few differences in the functional characteristics of SPR and PR PBMC transcriptomes ([Dataset S6](#)). Among the few functional differences that are identified is a comparative up-regulation of genes involved in antigen presentation (including proteolysis and antigen processing) in SPR animals relative to that in PR animals. No Gene Ontology annotations are identified as significantly up-regulated in PBMCs from PR animals relative to those from SPR animals.

Discussion

The results of this study show that adverse social conditions can become embedded in the basal transcriptome of primate immune cells within the first 4 mo of life. Compared with PBMCs from MR rhesus macaques, those from peer-reared animals (both SPR and PR) show enhanced expression of genes involved in inflammation and T-lymphocyte activation and reduced expression of genes involved in type I IFN-mediated innate antiviral responses and other pathogen-specific innate antimicrobial responses. This pattern of enhanced inflammatory gene expression and inhibited antiviral gene expression parallels the conserved transcriptional response to adversity (CTRA) observed in previous correlational studies of humans confronting adverse life circumstances (9, 27–32, 43). The experimental manipulation of early life social conditions in this study demonstrates that social adversity can play a causal role in activating CTRA dynamics and can do so during the earliest stages of postnatal immune system development. To the extent that such environmentally mediated transcriptome remodeling persists to affect immune responses to pathogens encountered later in life [e.g., inhibiting immune responses to viral infections (45, 46) or amplifying allergic inflammation (43)], the present findings provide a molecular framework for understanding the long-observed epidemiologic association between social adversity and reduced host resistance to disease (47–50), as well as more recently recognized effects of

early life social conditions on adult immune function (10, 12, 13, 51) and disease risk (1–5).

These data provide additional insights into the specific immune cell subtypes that are most sensitive to socio-environmental regulation and the neural and endocrine pathways that may mediate such relationships. Transcript origin analyses link SPR/PR-induced transcriptional up-regulation to monocytes and CD4⁺ T lymphocytes and transcriptional down-regulation to B lymphocytes. These findings parallel previous primate studies documenting altered CD4/CD8 T-lymphocyte ratios as a function of social vs. nonsocial housing conditions (52, 53) and defining leukocyte subset alterations as a key mechanism of social influences on the aggregate leukocyte transcriptome (54). These findings are also consistent with previous studies indicating monocyte-derived gene activation in humans confronting adversity (30, 31). On the basis of the known functions of these specific cell subtypes (30), SPR/PR animals might be expected to show reduced antibody responses (mediated by B cells, e.g., in response to vaccines or infections) and increased chronic inflammation (initiated by monocytes and perpetuated by CD4⁺ T lymphocytes, e.g., in responses to injury or infection). Additional research will be required to directly assess these specific immune system functional alterations, but the present results are broadly consistent with the increased disease risk observed in SPR/PR animals (5).

Also consistent with previous observations are results from promoter-based bioinformatic analyses implicating increased activity of proinflammatory NF- κ B transcription factors and decreased activity of IRF family transcription factors in structuring the observed gene expression differences (32). These analyses also implicate CREB family transcription factors as potential molecular mediators of PR/SPR effects on the basal leukocyte transcriptome. CREB factors play a central role in mediating the transcriptional effects of SNS activation via β -adrenergic receptors (55), and β -adrenergic signaling can also activate NF- κ B (56), up-regulate transcription of proinflammatory cytokine genes (57), and inhibit IRF transcription factors and type I IFN gene expression (46, 58) [i.e., the same proinflammatory/anti-antiviral transcriptional shift observed here and in other adversity studies (32)]. A potential increase in SNS-induced β -adrenergic signaling would parsimoniously account for many of the transcriptional dynamics observed here and provide a specific social signal transduction pathway by which early life social adversity alters basal leukocyte gene expression profiles and immune cell function (51, 52, 59, 60).

Institutes of Health Animal Center (Poolesville, MD) and approved by the Institutional Animal Care and Use Committee.

Gene Expression and Transcriptional Bioinformatics. Genome-wide transcriptional profiling and bioinformatic analyses were carried out essentially as described in previous studies (27, 30, 57), using Affymetrix Rhesus Genome Arrays. Detailed methods are provided in *SI Methods*, and data are deposited as Gene Expression Omnibus series GSE35850. Briefly, raw expression values for 52,024 probes assessing ~47,000 distinct macaque mRNA transcripts (including 7,185 distinct named macaque genes) were quantile normalized and \log_2 -transformed to identify genes showing twofold or greater differences in average expression levels across groups. Functional characteristics of differentially expressed genes were identified through National Center for Biotechnology Information (NCBI) EntrezGene annotations (66) and Gene Ontology (GO) annotations in the Affymetrix Rhesus Genome Array annotation file (i.e., both testing for significant differences in average levels of gene expression across rearing conditions, using small-sample permutation-based inference, and correcting for multiple-hypotheses testing using the stepdown algorithm of Romano and Wolf as developed and applied in ref. 34, and for overrepresentation of annotations in differentially expressed gene lists relative to the sampling frame of all genes present on the microarray, as outlined in *SI Methods*). Activity of specific transcriptional control pathways was assessed by TELiS bioinformatics analysis of transcription factor-binding motifs (TFBMs) in the promoters of differentially expressed genes (www.telis.ucla.edu) (37, 57). Promoter sequences derived from the *M. mulatta* genome

sequence were analyzed for TFBMs corresponding to NF- κ B (TRANSFAC V \$NFKAPPAB65_01 motif), IRFs (V\$IRF1_01), CREB (V\$CREB_01), and the glucocorticoid receptor (V\$GR_Q6), using PromoterScan and PromoterStats algorithms as previously described (37). Differential prevalence was quantified by the ratio of TFBM frequency in promoters of genes up-regulated in one group vs. another and summarized by the geometric mean ratio computed over nine parametric variations of promoter length (–300 bp relative to transcription start site, –600 bp, and –1,000 bp to +200 bp) and TFBM detection stringency (mat_sim = 0.85, 0.90, 0.95). Geometric mean ratios were tested for statistical significance, using a single-sample *t* statistic with bootstrap-derived SEs (37). Transcript origin analyses were conducted as previously described (30) to identify specific leukocyte subsets contributing to the observed PBMC transcriptome alterations.

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