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Correspondence and requests for materials should be addressed to M.N. (natowim@ccf. org)

Patterning of Regional Gene Expression in Autism: New Complexity

Matthew R. Ginsberg¹, Robert A. Rubin² & Marvin R. Natowicz^{1,3}

¹Cleveland Clinic Lerner College of Medicine, Cleveland Clinic, Cleveland, Ohio, ²Department of Mathematics, Whittier College, Whittier, California, ³Pathology & Laboratory Medicine, Genomic Medicine, Neurological and Pediatrics Institutes, Cleveland Clinic, Cleveland, Ohio.

Autism is a common and often severe neurodevelopmental disorder for which diverse pathophysiological processes have been proposed. Recent gene expression data comparing autistic and control brains suggest that the normal differential gene expression between frontal and temporal cortex is attenuated in autistic brains. It is unknown if regional de-differentiation occurs elsewhere in autistic brain. Using high resolution, genome-wide RNA expression microarrays and brain specimens meeting stringent selection criteria we evaluated gene expression data of two other regions: Brodmann area 19 (occipital cortex) and cerebellar cortex. In contrast to frontal/temporal cortical data, our data do not indicate an attenuation of regional specialization between occipital and cerebellar cortical regions in autistic brains.

utism is a common and often severe neurodevelopmental condition of high heritability¹. Because of the personal, family and societal burden of autism, understanding the causes and pathophysiological basis of autism is a public health priority. More than 100 uncommon and rare monogenic and genomic copy number variants are known causes or major contributing factors of autism, but most cases are idiopathic². Neuropathological, neuroimaging, neurophysiological, molecular genetic, biochemical and bioinformatics analyses have each provided data leading to the numerous hypotheses regarding underlying pathophysiological processes in autism³. Voineagu et al. recently made the important observation that regional patterns of gene expression that distinguish frontal and temporal cortex are significantly attenuated in autistic brain⁴. This, in turn, suggests an abnormality of patterning of cortical gene expression as a pathophysiological process in autism. It is unknown if regional de-differentiation occurs elsewhere in autistic brains.

We asked whether gene expression distinctions in other human brain regions, in particular, between the Brodmann area 19 (BA19) of the occipital cortex and the cerebellar cortex, are attenuated in autistic brain. We therefore compared gene expression profiles of these brain regions using specimens meeting stringent selection criteria that were evaluated with high resolution, genome-wide RNA expression microarrays. Earlier work demonstrated the validity of the quantitative gene expression data using this approach⁵.

Results

Our data do not provide evidence for attenuation of differences in regional differentiation between autistic and control brain in the regions that we evaluated. The number of genes that are differentially expressed between BA19 and cerebellum in control brain compared to autistic brain ($\Delta\Delta_{C-A}$) using a false discovery rate (FDR) of 1% and a log fold change (LFC) of 1 is 1.2 fold (**Table 1**). The $\Delta\Delta_{C-A}$ increased as the LFC threshold was relaxed. This suggested that the seeming difference noted at low or absent LFC thresholds might be due to differences in gene expression variances between groups and, in particular, greater variances within the autism group, as suggested by our previous work⁵. Indeed, fold change values for differential regional expression in control brain are highly correlated to those in autistic brain, while p-values are not (**Supplementary Fig. 1**).

Next, although quantitative differences in regional differentiation between autistic and control brain were not apparent, we explored qualitative differences in the probe lists using a bioinformatics approach. Using a FDR = 1% and LFC = 1 we explored those probes that are regionally differentially expressed in control vs. autistic brain (Fig. 1; Supplementary Table 1). The majority of differentially expressed probes between BA19 cortex and cerebellar cortex are shared in both control and autism brain. Moreover, even for those genes uniquely differentially expressed in the autism or control group, the biological functions of the genes are similar, and included genes associated with synapse development or synaptic function (Figure 2).

Table 1 | Number of differentially expressed probes between cerebellar cortex and occipital cortex (BA19) at varying thresholds of false discovery rate and log fold change. FDR = False discovery rate; $LFC = \log$ fold change

	FDR			
	5%		1%	
LFC 0 1 1.5	Autism 5057 1277 528	Control 9845 1294 473	Autism 1745 1030 479	Control 5998 1280 473
2	213	207	203	207

Our analysis of the $\Delta\Delta_{C-A}$ demonstrated sensitivity to LFC thresholds. Voineagu et al. reported differences in the differential gene expression between frontal and temporal cortex in control vs. autistic brain, but did not report the magnitude of the differential gene expression differences⁴. We therefore re-evaluated their archived data using varying thresholds. This analysis confirmed an attenuation of RNA expression difference between frontal and temporal cortex in autistic brain compared to control brain when no LFC threshold is used. However, the attenuation of differential RNA expression between control and autistic brain is not noted when a LFC threshold ≥ 1 is used (Supplementary Table 2). Thus, the cortical gene expression differences reported by Voineagu et al. are not large in magnitude. Unlike in our dataset, however, there was not a high correlation between the fold change values in the autistic and control groups, suggesting that greater variability in the autistic group was not likely to be solely responsible for the difference between the two groups in the study by Voineagu et al. (Supplementary Fig. 2).

Although Voineagu et al. also studied gene expression profiles of cerebellar hemisphere⁴, they did not evaluate their data regarding differential gene expression of cerebellum vs. either frontal or temporal cortex in control brain compared to autistic brain. We therefore analyzed their archived data from these three brain regions with respect to this issue. We found that the results of comparisons of gene expression between cerebellum and frontal cortex or between



Figure 1 | Differentially expressed RNAs between cerebellar cortex and occipital cortex (BA19) comparing autistic and control brain. Differentially expressed probes common to both types of brains as well as those that are unique to one type or another are noted.

cerebellum and temporal cortex were similar to each other and similar to our data comparing cerebellar cortex and occipital cortex (Supplementary Tables 3, 4; Supplementary Fig. 3).

Discussion

Because of the prevalence of autism and its personal and societal impacts, the determination of its etiologies and pathogenetic processes and the development of effective therapies are public health priorities. At this time, most cases are idiopathic although many rare and uncommon causes of autism are now recognized. Numerous pathogenetic processes for autism have been proposed. Neurophysiological and, especially, functional neuroimaging data reveal abnormal functional connectivity in autistic brains^{6,7}. This is likely consequent to multiple underlying primary conditions and has lead to differing models of an altered brain connectome in autism^{8,9}. Voineagu et al. recently observed that there is an attenuation of regional gene expression differentiation in autistic brain between frontal and temporal cortex⁴. That work provides important biochemical data in support of the general hypothesis of functional regional disconnectivity in autistic brain.

We sought to determine if other areas of autistic brain show a similar attenuation of differences of gene expression. To date, there are few whole genome transcriptomic analyses of autistic brain and still fewer that include both transcriptomic analyses of multiple regions of brain and an adequate number of independent brain specimens to allow for comprehensive statistical evaluation. Our work indicates that the attenuation of gene expression differences that was found in autistic frontal vs. temporal cortex is not generalizable to all cortical regions as it is not noted in occipital cortex vs. cerebellar cortex. Furthermore, we analyzed archived whole genome transcriptomic data to compare differences between frontal cortex and cerebellum and between temporal cortex and cerebellum in autistic vs. control brain⁴. The results of these analyses indicate a lack of attenuation of gene expression differences between these regions in autistic brain and are similar to the analysis of our data regarding cerebellar cortex and occipital cortex.

Our findings, and the results of our analyses of the cerebellar gene expression data of Voineagu et al., contrast with the conclusions of Ziats and Rennert who analyzed differentially expressed RNAs between prefrontal cortex and cerebellum using two autistic and two control brains. They reported reduced regional transcriptional differentiation in the autistic brain samples, both for messenger RNA and non-coding RNA¹⁰. However, the small number of brains studied by Ziats and Rennert prevent assessment of the effect of RNA expression variability whose importance is highlighted in this study.

Overall, our data do not indicate significant differences in cerebral cortical-cerebellar cortical gene expression differentiation between autistic and control brains. This is in contrast to the differences between frontal and temporal cortical differentiation noted earlier. Taken together, our data and that of Voineagu et al. suggest that abnormal regional gene expression differentiation may be limited to specific cerebral cortical regions, and that such perturbations are significant but subtle at a transcriptomic level. Our findings also indicate that studies of regional differential gene expression need to address variability within groups.

Methods

Subjects and samples. Brain tissue samples from Brodmann area 19 (BA19) occipital cortex and cerebellar hemispheric cortex were procured from subjects and controls through the Autism Tissue Program (ATP, www.atpportal.org) from the Harvard Brain Tissue Resource Center (www.brainbank.mclean.org) and the National Institute for Child Health and Human Development (NICHD) Brain and Tissue Bank (www.btbank.org). Tissues were procured from a total of 9 autism and 9 control subjects. Inclusion and exclusion criteria and details regarding each subject and brain specimen are noted elsewhere⁵. This study was approved by the Institutional Review Board of the Cleveland Clinic and is in accord with the principles of the Declaration of Helsinki. The gene expression data presented in this publication have been deposited

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Figure 2 | Gene ontology enrichment analysis for uniquely differentially expressed RNAs between cerebellar cortex and occipital cortex (BA19) in control brain (Panel A) and autistic brain (Panel C), and those differentially expressed RNAs that are shared in both autistic and control brain (Panel B). The enrichment score represents the negative logarithm of the p-value evaluating the significance of gene ontology terms for regionally differentially expressed RNAs. The top 6 annotation clusters are listed as derived from the DAVID bioinformatics tool.

in NCBI Gene Expression Omnibus (GEO, http://www.ncbi.nlm.nih.gov/geo/) and are accessible through GEO Series accession number GSE38322.

Sample processing. Total DNA and RNA were co-extracted from ~40 mg of cerebellar cortex and ~40 mg BA19 cortex and RNA and DNA were tested for purity and concentration as described⁵. Samples of RNA were processed and applied to Illumina HumanRefHT12 v4 BeadChip gene expression microarrays according to manufacturer's instructions.

Statistical analyses. Data were imported from Genome Studio (Illumina) to the R statistical environment (http://www.r-project.org/) and processed via standard Bioconductor packages: lumi, made4, and limma (www.Bioconductor.org/packages/release/bioc/). Expression data from the full dataset were quantile-normalized, variance-stabilized, and filtered from probes with ≤ 0.01 detection p-values. Differential expression analyses were then performed separately for autism and control tissue in our own dataset and that of Voineagu and others⁴ (GEO accession: GSE30573), who utilized the SAM package for their statistical analyses. Differentially expressed probes (between regions, within the autism or control group) were determined using a linear modeling approach in limma, with results filtered by varying thresholds for p-value and log fold change. The relationship between differential regional gene expression. Coefficient of determination was used to assess correlations between autistic and control groups for log fold changes or p-values of probe-wise comparisons between regions.

Bioinformatics analysis. For gene ontology analysis of differentially expressed genes, we submitted differentially expressed probes to the DAVID bioinformatics tool (http://david.abcc.ncifcrf.gov/)¹¹. The list was compared with a background of the total set of expressed genes in our samples (detection p-value ≤ 0.01) and functional annotation clustering was performed. Default settings for medium stringency (in DAVID version 6.7) were used and the top 6 functional annotation clusters were reported with enrichment scores^{11,12}. Enrichment scores are the negative log₁₀ of p-values based on Fisher's exact test. Ontology terms related to cellular localization, gene product function, and biological pathway were included in the analysis, and clusters were manually annotated with representative terms for the set of annotation terms in a cluster.

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Author contributions

M.R.G. and M.R.N. designed the study. M.R.G. and R.A.R. performed the statistical analyses. M.R.N. supervised the study and wrote the initial draft of the manuscript. All authors read and revised the manuscript before the submission.

Additional information

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

Competing financial interests: The authors declare no competing financial interests.

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