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## Article

# A Robust and Comprehensive Study of the Molecular and Genetic Basis of Neurodevelopmental Delay in a Sample of 3244 Patients, Evaluated by Exome Analysis in a Latin Population

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**Abstract: Background and Objectives:** Neurodevelopmental disorders (NDDs), including developmental delay (DD), autism spectrum disorder (ASD), intellectual disability (ID), attention-deficit/hyperactivity disorder (ADHD), and specific learning disorders, affect 15% of children and adolescents worldwide. Advances in next-generation sequencing, particularly whole exome sequencing (WES), have improved the understanding of NDD genetics. **Methodology:** This study analyzed 3244 patients undergoing WES (single, duo, trio analyses), with 1028 meeting inclusion criteria (67% male; age 0–50 years). **Results:** Pathogenic (P) or likely pathogenic (LP) variants were identified in 190 patients, achieving a diagnostic yield of 13.4% (singleton), 14% (duo), and 21.2% (trio). A total of 207 P/LP variants were identified in NDD-associated genes: 38% were missense (48 de novo), 29% frameshift (26 de novo), 21% nonsense (14 de novo), 11% splicing site (14 de novo), and 1% inframe (1 de novo). De novo variants accounted for 49.8% of cases, with 87 novel de novo variants and 27 novel non-de novo variants unreported in databases like ClinVar or scientific literature. **Conclusions:** This is the largest study on WES in Colombian children with NDDs and one of the largest in Latino populations. It highlights WES as a cost-effective first-tier diagnostic tool in low-income settings, reducing diagnostic timelines and improving clinical care. These findings underscore the feasibility of implementing WES in underserved populations and contribute significantly to understanding NDD genetics, identifying novel variants with potential for further research and clinical applications.

**Keywords:** neurodevelopmental disorders; whole exome sequencing; genetic testing

## 1. Introduction

Neurodevelopmental disorders (NDDs) are a heterogeneous group of conditions that affect brain development. These disorders, including developmental delay (DD), autism spectrum disorder (ASD), intellectual disability (ID), attention-deficit/hyperactivity disorder (ADHD), and specific learning disorders, affect approximately 15% of children and adolescents worldwide [1,2]. The etiology of NDDs is complex, involving both genetic and environmental factors. Recent advances in genetic research, particularly next-generation sequencing technologies, have significantly enhanced

our understanding of the genetic landscape underlying these disorders, enlightening us about the intricate mechanisms at play [2–4].

The genetic architecture of NDDs exhibits extensive locus heterogeneity and a spectrum of variant types, including single nucleotide variants (SNVs), copy number variations (CNVs), and structural variations. Large-scale exome sequencing studies have revealed that de novo and inherited rare variants contribute substantially to individual risk for NDDs [4,5]. For instance, studies have identified over 100 high-confidence ASD-associated genes enriched with likely deleterious de novo variants. However, the genetic landscape is incomplete, with estimates suggesting that up to 1,000 genes may harbour de novo variants in ASD alone [5].

Recent meta-analyses and large-scale studies have provided important insights into the heritability and genetic overlap of various NDDs [2]. Family-based studies indicate that approximately two-thirds of the variation in NDDs can be attributed to genetic differences between individuals [3]. Moreover, there is significant genetic overlap between ASD, ID, ADHD and other neurodevelopmental conditions such as epilepsy [2,3]. For example, substantial genetic correlations have been observed between ASD and ADHD and between communication disorders and specific learning disorders [3,6].

As mentioned before, whole exome sequencing (WES) has emerged as a powerful first-tier diagnostic tool. In a previous study of our group, we reported 30-43 % diagnostic yields for unexplained NDDs, representing a significant improvement over traditional diagnostic methods such as chromosomal microarray analysis [7]. Molecular diagnosis follow-up of the clinical progression and associated phenotypes could have profound implications for clinical management, including initiating targeted surveillance and providing accurate genetic counselling for families [2,7]. As our understanding of the genetic basis of NDDs continues to evolve, it is essential to identify overlapping phenotypes because it could help develop a more personalized therapeutic approach in the future, offering hope for more effective treatments [1,5,7].

## 2. Materials and Methods

### 2.1. Patient Recruitment and Sampling

Patients who attended consultation for medical genetics at Clínica Colsanitas between January 2021 and October 2023. The inclusion criteria were the following: 1. patients with suspected or non-genetic clinical diagnosis of neurodevelopmental disorders (NDD), recorded in terms of HPO (Human Phenotype Ontology) or terms of the Diagnostic and Statistical Manual of Mental Disorders, DSM-5; 2. patients with request for Whole Exome Sequencing (WES) in trio (WES patient and both parents), duo (WES patient and one of his parents) or singleton (WES patient). The following patients were excluded from the study: 1. patients with identification of NDD caused by an extrinsic event such as perinatal noxa, dystocic delivery, severe childhood or adolescent trauma with clear evidence of structural injury, complicated infection and neurological symptomatic such as localized or generalised meningoencephalitis, clear history of perinatal or childhood and adolescent anoxia or hypoxia due to traumatic event; 2. patients with clear and defined metabolopathy of the perinatal stage with severe neonatal or perinatal distress leading to neurological deterioration; 3. patients with known syndromes, defined by aneuploidies identified in the cytogenetic analysis.

### 2.2. Review of Medical Records

The research group extracted patients' information from electronic medical records, and results were recorded in the information system of the Specialized Laboratory of Clínica Colsanitas. The information collected consisted of perinatal history, detailed developmental milestones, clinical suspicion or diagnosis of the patient, sex, age, personal history, imaging and electrophysiological test results, family history, clinical laboratory results and genetic tests. Based on the clinical histories, the patients were categorized into the following phenotypes associated with NDD: Neurodevelopmental Delay, Autism Spectrum Disorder, Cognitive impairment and Neurodevelopmental Delay + Epilepsy.

### *2.3. Sampling, Sequencing, Bioinformatics Processing and Variant Filtering*

WES (clinical exome or trio-exome sequencing) was performed in the Specialized Laboratory of Clinica Colsanitas from DNA extracted from peripheral blood by next-generation sequencing (NGS), using Capture Probes targeting exomic regions based on Illumina DNA prep with enrichment® and MGIEasy Exome Capture V5 Probe Set®. Sequencing was performed on NextSeq 2000 (Illumina, San Diego, CA, USA), NovaSeq 6000 Sequencing System (Illumina, San Diego, CA, USA) or G-400 (MGI Tech Co, San Jose, CA, USA). Sequence reads were aligned with Consortium Human Build 37, and visualisation and variant identification were done with the SOPHiA DDM and VarSome Clinical platforms. This methodology allows detection of single nucleotide variants (SNV), insertions/deletions (Indel), copy number changes (CNV) and structural variants (SV). The genetic variants found, were classified as pathogenic (P), likely pathogenic (LP), of uncertain clinical significance (VUS), likely benign (LB) or benign (B) according to the guidelines of the American College of Medical Genetics and Genomics (ACMG), supported by different clinical databases such as ClinVar from NCBI (<https://www.ncbi.nlm.nih.gov/clinvar/>), ClinGen (<https://clinicalgenome.org/>), GnomAD (<https://gnomad.broadinstitute.org/>), Franklin (<https://franklin.genoox.com/clinical-db/home>), UniProt (<https://uniprot.org/>) and OMIM (<https://omim.org/>). Variant analyses in inpatients with NDD were performed as follows: single or panel (patient only analysed), duo (patient and one parent analysed), and trio (patient and both parents analysed).

### *2.4. Classification and Ontology Analysis of Associated Genes*

The identified genes associated with NDD were classified into four groups based on patient history and clinical diagnosis. Genes and patients without specific phenotypes were classified into neurodevelopmental delay. To demonstrate the biological significance of the genes associated with the eight phenotypic groups, gene ontology network analysis was performed using Cytoscape software (v.3.10.2) with the ClueGo plug-in (v.2.5.10). With ClueGo, enrichment of the studied genes with GO terms linked to the kappa score is performed. Only GO terms with p-values < 0.05 were adjusted to the Bonferroni step-down.

### *2.5. Statistical Analysis*

Qualitative variables are presented as absolute and relative frequencies. Quantitative variables are described with measures of central tendency and dispersion. To calculate the diagnostic yield, a positive result was considered to be any result that had a variant classified as pathogenic (P) or likely pathogenic (LP) in a gene associated with a phenotype that correlates clinically with the phenotype of the patient under study (gene-disease association was performed according to the OMIM database). All results in which no variants related to the patient's phenotype were reported were considered harmful. The diagnostic yield of the test was calculated considering the total number of patients included in the study, which corresponds to the percentage of patients with a positive result.

### *2.6. Ethical Considerations*

The present study was developed within the framework of the macro research entitled "Development of a comprehensive care model based on personalised medicine for the diagnosis, treatment and follow-up of pediatric patients with NDD in the Colombian population", which was reviewed and approved by the Research Ethics Committee of the Fundación Universitaria Sanitas (CEIFUS code 1419-21, date of approval, July 2, 2021), following the principles of the Declaration of Helsinki. Clinica Colsanitas have approved the informed consent form for this study, and the participants, or their parents/legal representatives, have signed the corresponding informed consent form to perform WES.

The information associated with the patients above was handled exclusively by the principal investigators, who always respected the provisions of law 1581 of Colombian legislation regarding the handling of personal data.

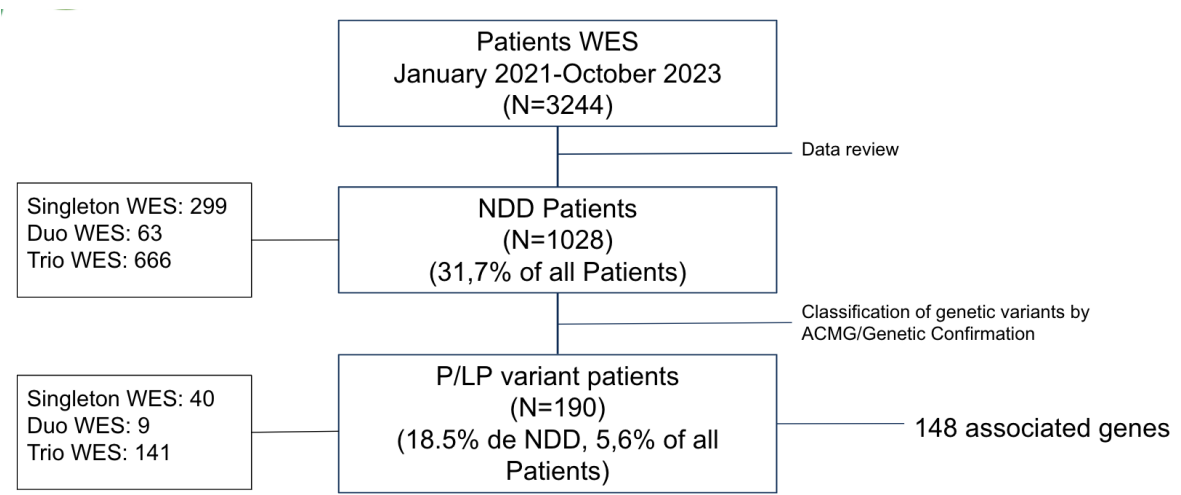


3. Results

Between January 2021 and October 2023, a total of 3244 patients with single, duo and trio exome analyses were sequenced by NGS. 1028 (31.7%) met the inclusion criteria, 67% (688) were male and 33% (340) were female. The age range of patients associated with NDD was between 0 and 50 years of age (mean  $\bar{X}$ : 5 SD: 4.7). Of the 1028 patients who met NDD criteria, 695 patients had clinically suspected DD (68% of patients), 199 with ASD (19% of patients), 79 with DD and epilepsy (8% of patients), and finally, 55 (5% of patients) with CI.

3.1. Diagnostic Yield

Pathogenic (P) or likely pathogenic (LP) variants were identified in 190 patients, corresponding to 18.5% of patients with NDD admissions and 5.6% of the total patients analysed in this period. The diagnostic yield varied depending on the type of analysis performed: Clinical exome 13.4% (299 admissions/ 40 positive), duo WES 14% (63 admissions/ 9 positive), and trio WES 21.2% (666 admissions /141 positive) (Figure 1).



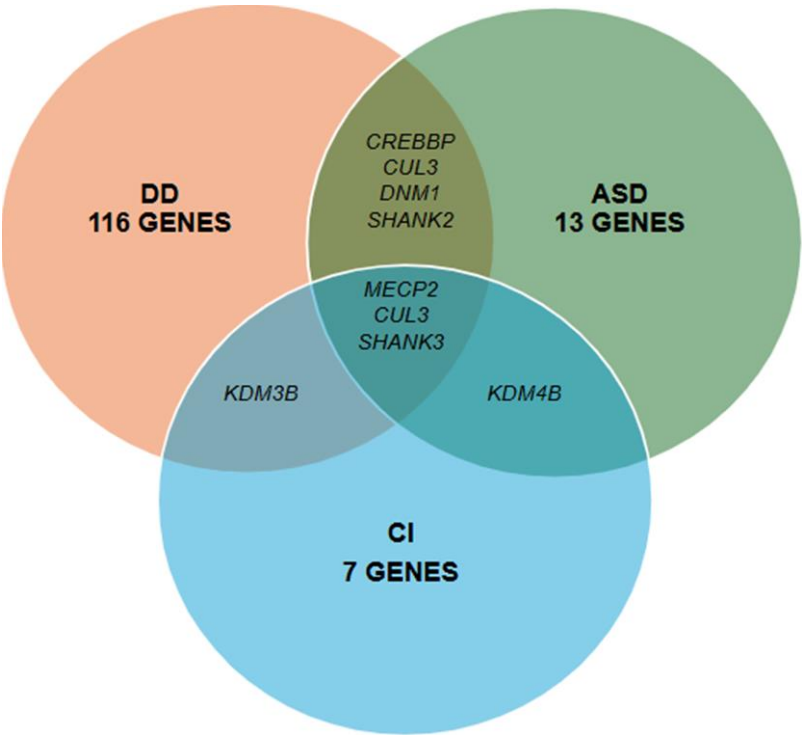
**Figure 1.** Summary of the sample of patients according to 1) the presence of pathogenic (P) of likely pathogenic (LP) variants in agreement with the ACMG criteria, and 2) if the exome sequencing was applied to a singleton, duo, or trio unit of analysis.

A total of 139 genes associated with NDD were identified in 190 patients with P/LP variants, of which 116 genes were identified in 151 patients with DD, 16 genes in 22 patients with DD and Epilepsy, 13 genes in 12 patients with ASD and seven genes in 5 patients with CI (Table 1). Some genes were associated with more than one of the above phenotypes (Figure 2). 186 P/LP variants were identified in the 190 NDD-positive patients (Table S1). The majority of patients (78%, 146/186) presented SNV-type variants associated with genes with autosomal dominant (AD) inheritance patterns, followed by 9% (17/186) of patients with genes with autosomal recessive (AR) inheritance patterns. Finally, genes with X-linked dominant (XLD), X-linked recessive (XLR) and X-linked (XL) inheritance patterns were identified in 8% (14/186), 3% (6/186) and 2% (3/186) of patients, respectively. 82% per cent (156/190) of patients had variants in a heterozygous state, 8% (15/190) homozygous, 6% (11/190) compound heterozygous and 4% (8/190) hemizygous.

**Table 1.** Genes in which LP/P variants were identified by phenotype.

Phenotype	Gene
Developmental Delay	ACTL6B, AHDC1, ANKRD11, ARID2, ATRX, BCL11A, BCL11B, BRAF, CHD3, CREBBP, CTNNB1, CUL3, DDX3X, DNMT3A, DPYD, DYNC1H1, FBXO11, FLNB, FOXG1, GLUD2, GNB1, GRIA2, GRIN1, H1-4, IFIH1, INTS1, IVD, JAG1, KCNT2, KDM6B, KIAA1109, KIF1A, KMT2A, KMT2C, LARP7,

	<i>LARS2, LMAN2L, LZTR1, MECP2, MN1, MSTO1, NACC1, NALCN, NARS, NEXMIF, NF1, NFIB, PHF8, PIK3R1, PPM1D, PTPN11, PURA, QRIC1, RAF1, RAI1, RBMX, RPS6KA3, SATB2, SCN1A, SCN2A, SCN8A, SETD2, SETD5, SHANK2, SHANK3, SIX3, SLC13A5, SPEN, STAG2, SYNGAP1, TAOK1, TBK1, TBR1, TCF20, TCF4, TOE1, TREX1, TRIP12, TSC2, TSPAN7, TUBB, UBT, USP7, WAC, ZMIZ1, AP1S2, ARSA, CAPN3, CDC42, COL6A2, COL6A3, CTBP1, DCX, DHTKD1, EP300, FBN2, GCDH, PMM2, POLR3B, PUF60, RTN2, RYR1, SPG11, SPG7, SPTBN2, TNPO3, TRPV4, TRIO, RNASEH2B, RFX7, KMT2E, ATP7B, ARID1B, INPP5E, KDM3B, CSNK2A1</i>
Developmental Delay & Epilepsy	<i>ABCC8, AFF3, ANKRD17, CDKL5, CHD2, GNAO1, GRIN2B, HNRNPU, KAT6A, KCNB1, KCNMA1, PTCH1, SETD1A, SLC2A1, STXBP1, MN1</i>
Autism Spectrum Disorder	<i>CACNA1E, CAMK2A, CHD8, CPT2, CREBBP, CSF1R, CUL3, DNMI, EBF3, KDM4B, PTEN, SHANK2, SHANK3</i>
Cognitive impairment	<i>KDM4B, KDM5C, KDM6A, PAX8, NAA15, KDM3B, SHANK3</i>



**Figure 2.** Genes with LP/P variants overlapped between phenotypes. DD, ASD and CI variants in the *MECP2*, *CUL3* and *SHANK3* genes were described. ASD and CI variants were described on DD and CI in *KDM4B* and *KDM3B* variants.

3.2. Characterization of Novel Variants

A total of 207 P/LP SNV variants were identified in NDD-associated genes, and missense variants were the most represented with 78 (38%), 48 were de novo, 61 (29%) Frameshift, 26 de novo; 44 (21%) Nonsense, 14 de novo; 22 (11%) Splicing site, 14 de novo; 2 (1%) Inframe, one de novo. Finally, 49.8% (103/207) of the variants were identified de novo in 100 patients with NDD. Additionally, we report 87 new variants de novo that have not been listed in ClinVar nor reported previously in any of the databases consulted or in scientific articles (marked with \* in Table 2). In addition, 27 non-de novo SNVs had not been previously reported in scientific articles or databases (marked without \* in Table 2). However, it was possible to classify them as P or LP according to ACMG, in silico analysis using relevant databases and tools (Table 2).

**Table 2.** Description of variants without previous reports in literature or databases.

Gene*	DNA	Protein	Variant Type	ACMG Classification	Transcripts	OMIM code
ACTL6B	c.521_522insA	p.Thr175Hisfs*7	Frameshift	LP	NM_016188.4	612458
ACTL6B*	c.991G>A	p.Gly331Ser	Missense	LP	NM_016188.5	612458
AHDC1	c.4294del	p.Ala1432Profs*13	Frameshift	LP	NM_001371928.1	615790
ANKRD11	c.741C>A	p.Tyr247*	Nonsense	LP	NM_013275.6	611192
ANKRD11*	c.7124_7152del	p.Glu2375Alafs*147	Frameshift	P	NM_013275.5	611192
ANKRD17*	c.4453_4457del	p.Lys1485Glufs*17	Frameshift	P	NM_032217.4	615929
AP1S2	c.180-1G>C		Splicing site	LP	NM_001272071.2	300629
BCL11B*	c.2345dup	p.Gly785Argfs*100	Frameshift	P	NM_138576.3	606558
BRAF*	c.2030A>G	p.Asp677Gly	Missense	P	NM_004333.6	164757
CACNA1E*	c.5365-2A>G	-	Splicing site	LP	NM_001205293.1	601013
CHD2*	c.2822A>T	p.Gln941Leu	Missense	LP	NM_001271.4	602119
CHD3	c.3481C>T	p.His1161Tyr	Missense	LP	NM_001005273.3	7806365
CHD8*	c.4987_5003del	p.Val1663Glnfs*59	Frameshift	P	NM_020920.4	610528
COL6A3*	c.6156+2T>C	-	Splicing site	P	NM_004369.4	120250
COL9A3	c.1021C>T	p.Arg341*	Nonsense	LP	NM_001853.4	120270
CUL3*	c.769delG	p.Glu257Lysfs*5	Frameshift	P	NM_003590	603136
CUL3*	c.494dup	p.Leu166Ilefs*37	Frameshift	P	NM_003590.4	603136
DCX	c.166C>G	p.Arg56Gly	Missense	LP	NM_001195553.1	300121
DDX3X	c.1646A>T	p.Asn549Ile	Missense	LP	NM_001356.4	300160
DNM1*	c.1751A>T	p.His584Leu	Missense	LP	NM_004408.4	602377
DNM1*	c.2318+2T>C	-	Splicing site	P	NM_004408.4	602377
DYNC1H1*	c.11632C>G	p.Gln3878Glu	Missense	LP	NM_001376.5	600112
EP300*	c.4779+1G>A	-	Splicing site	P	NM_001429.3	602700
FBXO11*	c.1685A>G	p.Tyr562Cys	Missense	LP	NM_025133.4	607871
GNB1*	c.310G>C	p.Ala104Pro	Missense	LP	NM_002074.5	139380
GRIN1*	c.2248G>A	p.Gly750Arg	Missense	LP	NM_000832.7	138249
GRIN1*	c.1824G>C	p.Trp608Cys	Missense	P	NM_007327.3	138249
GRIN2B*	c.1990T>C	p.Ser664Pro	Missense	LP	NM_000834.3	138252
HNRNPU	c.1484_1487del	p.Lys495Ilefs*5	Frameshift	LP	NM_031844.3	602869
HNRNPU*	c.1576_1580del	p.Asn526Serfs*9	Frameshift	P	NM_031844.2	602869
IFIH1	c.2863C>T	p.Gln955*	Nonsense	LP	NM_022168.3	606951
JAG1	c.1725_1726dupTG	p.Asp576Valfs*168	Frameshift	LP	NM_000214.3	601920
KAT6A*	c.1019del	p.Asn340Thrfs*3	Frameshift	P	NM_006766.4	601408
KAT6A*	c.4140_4141insA	p.Asp1381Argfs*13	Frameshift	P	NM_006766.4	601408
KCNB1*	c.1223C>T	p.Pro408Leu	Missense	LP	NM_004975.3	600397
KCNB1*	c.1202G>T	p.Gly401Val	Missense	P	NM_004975.4	600397
KCNMA1	c.2095A>T	p.Lys699*	Nonsense	LP	NM_001161352.1	600150
KCNT2	c.3118C>T	p.Arg1040*	Nonsense	LP	NM_198503	610044
KDM3B*	c.3638dup	p.(Asp1214Ter	Nonsense	LP	NM_016604.4	609373
KDM4B	c.2147del	p.Leu716Tyrfs*42	Frameshift	LP	NM_015015.2	609765
KDM5C*	c.1571A>T	p.Asn524Ile	Missense	LP	NM_004187.5	314690
KIAA1109	c.4118_4119del	p.Ser1373*	Nonsense	LP	NM_015312.3	611565
KIAA1109*	c.18T>A	p.Asn6Lys	Missense	LP	NM_015312.3	611565
KIAA1109*	c.4118_4119del	p.Ser1373*	Nonsense	LP	NM_015312.3	611565
KMT2A*	c.7187_7188del	p.Pro2396Argfs*2	Frameshift	P	NM_001197104.2	159555
KMT2C*	c.5551C>T	p.Gln1851*	Nonsense	P	NM_170606.2	606833
KMT2E	c.1944_1948del	p.Lys649GlufsTer8	Frameshift	LP	NM_182931.3	608444
LARP7	c.1118_1130del	p.Val373Glufs*11	Frameshift	LP	NM_016648.4	612026
LARS2*	c.1420del	p.Leu474Trpfs*6	Frameshift	P	NM_015340.4	604544
MN1	c.97del	p.His33ThrfsTer20	Frameshift	LP	NM_002430.3	156100
NAA15*	c.2214del	p.Met738IlefsTer18	Frameshift	P	NM_057175.5	608000
NACC1*	c.166C>T	p.Arg56Trp	Missense	LP	NM_052876.3	610672
NEXMIF	c.1998del	p.Glu667Lysfs*5	Frameshift	LP	NM_001008537.2	300524
NEXMIF	c.1998del	p.Glu667Lysfs*5	Frameshift	LP	NM_001008537.3	300524
NF1	c.2056A>T	p.Lys686*	Nonsense	LP	NM_001042492.2	613113
NFIB*	c.626A>G	p.Glu209Gly	Missense	LP	NM_001190737.3	600728
NFIX*	c.442del	p.Ile148Serfs*71	Frameshift	P	NM_001271043.2	164005
LPM1D*	c.1245dupT	p.Thr416Tyrfs*18	Frameshift	P	NM_003620.4	605100

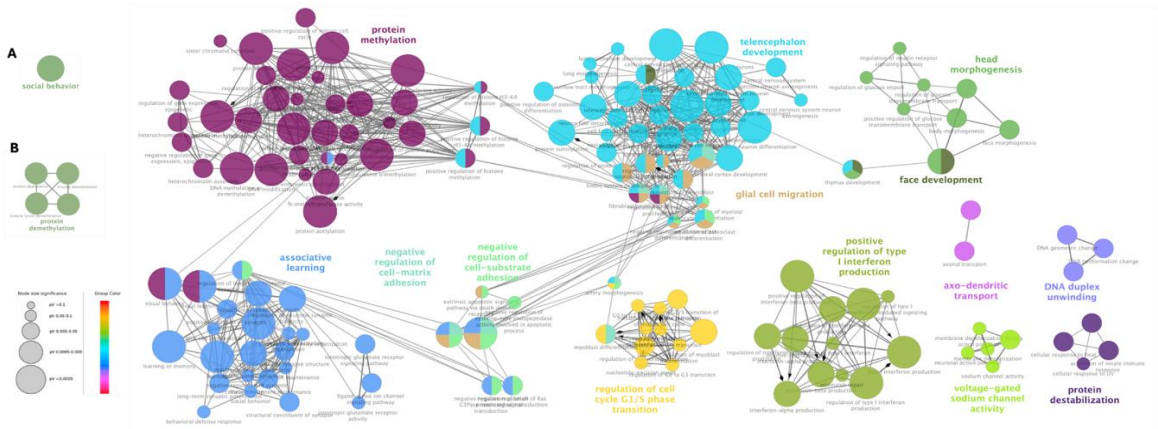
PUF60*	c.1334C>T	p.Thr445Ile	Missense	LP	NM_014281.5	604819
RFX7*	c.2236C>T	p.Gln746*	Nonsense	P	NM_022841.7	612660
RPS6KA3*	c.383C>T	p.Pro128Leu	Missense	LP	NM_004586.3	300075
SATB2	c.1165C>A	p.Arg389Ser	Missense	LP	NM_001172509.2	608148
SCN1A*	c.4987G>T	p.Gly1663Cys	Missense	P	NM_006920.6	182389
SCN1A*	c.4582-1_4583del	-	Splicing site	P	NM_001165963.4	182389
SCN1A*	c.4987G>T	p.Gly1663Cys	Missense	P	NM_006920.6	182389
SCN2A	c.641C>A	p.Ser214*	Nonsense	LP	NM_001040143.2	182390
SCN8A*	c.5235C>A	p.Phe1745Leu	Missense	P	NM_001330260	600702
SETD1A*	c.5116C>G	p.Leu1706Val	Missense	LP	NM_014712.3	611052
SHANK3*	c.352dup	p.Leu118ProfsTer28	Frameshift	P	NM_001372044.2	606230
SIX3*	c.221del	p.Pro74Argfs*177	Frameshift	P	NM_005413.4	603714
SPEN*	c.5485_5486insTTTGAAC	p.Gln1829Leufs*2	Frameshift	P	NM_015001.4	613484
STAG2	c.1018-2_1018-1delinsTT	-	Splicing site	LP	NM_001042750.2	300826
STXBP1*	c.903-1G>C	-	Splicing site	P	NM_001032221.3	602926
SYNGAP1*	c.1713_1714delinsAC	p.Trp572Arg	Missense	LP	NM_006772.2	603384
SYNGAP1*	c.1216_1218delins	p.Tyr406Asnfs*4	Frameshift	P	NM_006772	603384
TAOK1	c.1721dupA	p.Ser575Glufs*28	Frameshift	LP	NM_020791	610266
TAOK1	c.1489_1492del	p.Asp497Lysfs*42	Frameshift	LP	NM_020791.4	610266
TBR1*	c.893dup	p.His298Glnfs*23	Frameshift	P	NM_006593.3	604616
TCF20*	c.5047_5054del	p.Pro1683Valfs*34	Frameshift	P	NM_005650.3	603107
TCF4	c.-20-184_72+815del	-	Splicing site	LP	NM_001083962.2	602272
TNPO3	c.120+2T>G	-	Splicing site	LP	NM_012470.4	610032
TRIP12	c.3206+1G>T	-	Splicing site	LP	NM_001348323.3	604506
TUBB*	c.1145C>T	p.Ser382Leu	Missense	LP	NM_178014.4	191130
TUBB*	c.1017C>G	p.Ser339Arg	Missense	LP	NM_178014.4	191130
USP7*	c.502T>C	p.Ser168Pro	Missense	LP	NM_003470.2	602519
WAC*	c.620del	p.Lys207Serfs*124	Frameshift	P	NM_016628.5	615049
ZMIZ1*	c.1413+4A>G	-	Splicing site	LP	NM_020338.3	607159

Genes with the highest number of variants were *MECP2* (n=6) and *CUL3* (n=4). Two Nonsense and two frameshifts were identified in this gene, three were de novo (c.764C>G, p.Ser255\*;c.769delG, p.Glu257Lysfs\*5; c.494dup, p.Leu166Ilefs\*37), two were not previously reported (.769delG, p.Glu257Lysfs\*5; c.494dup, p.Leu166Ilefs\*37).

3.3. Gene Ontology Analysis

GO network analysis of biological processes, based on the four categories in which the NDD genes were classified, the genes associated with ASD, CI and DD presented different patterns among them. In the case of the genes related to DD and Epilepsy, they did not show any pattern of association. Three ASD genes and four CI genes presented significant association (false discovery rate and p-value < 0.05). IC genes showed a single association with the term GO protein demethylation and ASD genes with social behavior (Figure 3A,B). As for the DD genes, 113 genes formed a complex network without a solid or consistent association with each other. Some fragmented associations were observed, such as protein methylation (12 genes), telencephalon development (12 genes), associative learning (9 genes), regulation of cell cycle G1/S phase transition (8 genes), positive regulation of type I interferon production (6 genes), glial cell migration (5 genes), face development (5 genes), negative regulation of cell-matrix adhesion (5 genes), negative regulation of cell-matrix adhesion (5 genes), negative regulation of cell-substrate adhesion (5 genes), DNA duplex unwinding (5 genes), axo-dendritic transport (5 genes), head morphogenesis (4 genes), voltage-gated sodium channel activity (4 genes) and protein destabilization (4 genes) (Figure 3c).





**Figure 3.** Functionally cluster gene networks for the CI (A), ASD (B) and DD (C) phenotypes. Networks were obtained from ClueGo enrichment analysis. Gene ontology terms and associated genes are in the same color. The node size of each term corresponds to its importance in enrichment.

4. Discussion

Despite the genomic analyses, understanding the etiology of NDDs remains challenging due to their broad genetic and phenotypic heterogeneity. WES has played an essential role in identifying causatives and has proven to be a valuable diagnostic tool. This study achieved a molecular diagnosis for 190/1028 patients with NDD spectrum in Clínica Colsanitas between January 2021 and October 2023.

In patients with NDD and the complete spectrum of ASD, ID, and DD, we applied a retrospective chart review of the probands' and their relatives' medical records before continuing to the molecular analyses. The epilepsy phenotype was excluded. It was taken into account for the results but omitted from the analyses as it is an extensive phenotype and will be considered for future group publications.

Clinical studies should address the effectiveness of genetic studies targeting the aetiological diagnosis. The NDD spectrum is highly heritable and heterogeneous and affects a significant proportion of the population. The etiology of such disorders arises from environmental factors such as malnutrition, perinatal infections, drug misuse or pollution, which may contribute to the risk for these disorders through epigenetic dysregulation and mutations; synaptopathies are also a significant cause of NDD in the context of structural as corticogenesis and functional as synaptic disruption, affecting the plasticity, signalling and disrupting cerebral connectivity characterized by an imbalance between excitatory and inhibitory transmissions. It is also known that differentially expressed gene networks enriched neurotransmitter and synapse activity, immune processes, and cortical development (6). Achieving a molecular diagnosis of NDD has an economic impact not only on the patient's healthcare system but also on their families.

The array comparative genomic hybridization (aCGH) has supported greater diagnostic effectiveness concerning historical cytogenetic techniques (3 vs. 10%, respectively) (8). Development of next-generation sequencing (NGS) techniques, which allow genome sequencing (GS), or WES, have shown a high diagnostic capacity, leading to an exponential drop in costs and expanded sequencing coverage of the genome, as well as the ability to capture high read depth to detect low-level mutations. In our study, the diagnostic yield of trio-exome sequencing was significantly high (21.2%) and like reported yields in other studies (7,8), supporting its utility in molecular diagnosis of NDD spectrum patients. The strengths of this study are the sizeable Colombian cohort, which included all patients assessed by a clinical geneticist, and the extensive clinical and phenotypic data that were available, which were used for the stratification of the central overlapping NDD spectrum phenotype.

The most common clinical symptom shared by all NDDs was cognitive dysfunction and Autism. The classification of patients in the diagnostic spectrum categories might have also affected the proportion of ASD; patients with ASD features were diagnosed as DD due to either not being old enough to be diagnosed as ASD or not being assessed with a specific ASD-standardized scale to provide an accurate diagnosis, indeed. Statistical significance between molecular findings on each phenotype ID/NDD, ASD/NDD and DD/NDD.

Evidence of diagnostic yield supports NGS-based genetic testing for diagnosing NDD (2,8,9, 10). Current evidence suggests that a diagnostic yield of 35% can be obtained for WES in patients with intellectual disability and global developmental delay and 15% for patients with ASD (11). The overall WES yield for NDD was 36%, 31% for isolated DD, and 53% for NDD with associated conditions. In the present study, an overall diagnostic rate of 18.5% was observed for WES, within the range reported in the literature (12). Additionally, when evaluating only patients with clinical suspicion of DD, the diagnostic yield was 22% (151/695), ASD was 6% (12/199), DD and epilepsy was 28% (22/79) and IC with 5% (5/55).

The diagnostic yield was significantly different comparing clinical exome with 13.4% and trio, analyzing the parents (diagnostic rates of 21.2%), conditioning the modification of the genetic algorithms in the diagnosis of different NDD, positioning the use of WES as an initial analysis in this type of patients, and going above directed molecular studies such as the triplet expansion study for the FMR1 gene as well as aCGH (12, 13,23).

Mutations in various genes have been shown to interfere with the proliferation and migration of neurons. Genetic advances resulting from new sequencing techniques have also expanded our understanding of neuronal migration disorders that affect each stage of neurodevelopment. From the early stages of gestation, the development of the neuroepithelial progenitors that cover the wall of the ventricles begins. This process requires different stages, such as proliferation, differentiation, and migration. Enhancing corticogenesis is characterized by several unique features, including a unique germinal zone and the outer subventricular zone, increasing size from week 20, and making an integration circuit (14, 21). Pathogenic variants that could modify cortical development and the timing and complexity of cortical neurogenesis or synaptogenesis could be linked to neurodevelopmental disorders, providing evidence for their physiological relevance (17, 18).

We report the mutational spectrum of *MECP2*, *CUL3* and *SHANK3* genes. The *MECP2* (MIM\*300005) binds methylated CpGs, is a chromatin-associated protein required to mature neurons and is developmentally regulated. The *MECP2* syndrome is a neurodevelopmental disorder that occurs almost exclusively in females and has an XLD inheritance pattern. It is characterized by arrested development between 6 and 18 months of age, regression of acquired skills, loss of speech, stereotypic movements (classically of the hands), microcephaly, seizures and mental retardation. Also, it is associated with susceptibility to X-linked autism 3, with an XL inheritance pattern. Pathogenic and probably pathogenic variants in homozygous or compound heterozygous state in the *MECP2* gene have also been associated with severe neonatal encephalopathy, syndromic X-linked intellectual development disorder 13 and syndromic X-linked intellectual development disorder, Lubs type, phenotypes with XLR inheritance pattern (19). Two Nonsense and three Missense variants were identified (one present in two patients).

The *CUL3* gene (MIM \*603136) encodes a scaffolding component of the Cullin-RING ligase (CRL) complex, essential for mitotic division. *CUL3* transcript levels are relatively high during early embryonic development, playing an important role during fetal development and maturation. *CUL3* neurodevelopmental disorder with or without autism or seizures, with autosomal dominant inheritance pattern, is characterized by global developmental delay evident in childhood, impaired intellectual development and speech delay. Some patients develop seizures and may show regression after the onset of seizures. Others present with autistic features or behavioural abnormalities. Additional variable systemic features such as cardiac defects, growth retardation or brain imaging abnormalities may also be present. Also, it is associated with pseudohypoaldosteronism type IIE, which is related to an AD inheritance pattern (20, 25).

*SHANK3* gene (MIM\*606230), expressed predominantly in the cerebral cortex and cerebellum, encodes a scaffolding protein that is enriched in postsynaptic densities of excitatory synapses; it has been shown to bind to neuroligins, which, together with the neuexins, form a complex at glutamatergic synapses. *SHANK3* was shown to coincide with the most severe cases of autism and Phelan-McDermid Syndrome (22q13.3) deletion syndrome when including the gene); because it affects the development and morphology of dendritic spines and reduces synaptic transmission in mature neurons, contributing to an imbalance of inhibition to excitation (26).

In positive Trio Exomes, 100 LP/P variants were identified as *de novo* (absent in the parents). *De novo* variants gain value and increase the diagnostic performance of the test when there is no family history of similar conditions or reports of consanguinity (21). However, it is essential to highlight that in cases where variants inherited from the parents are identified, the inheritance pattern of the phenotype should be considered since there are cases where the variants can be heterozygous in the mother, being carriers, and hemizygous in male children, who would express the phenotype for diseases with recessive patterns linked to the X chromosome. Another possibility is that there are diseases for which incomplete penetrance and variable expressivity have been reported due to differences in genetic background, environmental factors or a combination of both, so it is possible that within the same family, there are affected individuals with different levels of involvement, or even that they are asymptomatic despite having the same variant (22, 24).

The present study has several limitations, such as its retrospective design, the possible overestimation of the clinical exome sequencing diagnostic yield due to a bias in the selection of samples for NGS, and the fact that aCGH is not being compared with WES. To confirm our results, a prospective study comparing the diagnostic yield of aCGH and clinical exome sequencing in an unbiased sample would be desirable, and for those recently described new variants, further mechanistic and phenotypic characterization of additional patients could confirm their roles in human neurodevelopment disease and to delineate their associated phenotypic spectrums.

To our knowledge, this is the first study to evaluate the clinical utility of WES for children with NDD spectrum in Colombia in a large cohort of patients; we show the importance of reducing the expenses in genetic testing for NDD disorders with a cost-saving first-tier diagnostic test that would serve for developing countries, and to define an aetiological diagnosis in less time.

**Supplementary Materials:** The following supporting information can be downloaded at the website of this paper posted on Preprints.org, Table S1: List of P/LP variants identified in patients with NDD.

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## References

1. Gidziela, A., Ahmadzadeh, Y. I., Michelini, G., Allegrini, A. G., Agnew-Blais, J., Lau, L. Y., Duret, M., Procopio, F., Daly, E., Ronald, A., Rimfeld, K., & Malanchini, M. A meta-analysis of genetic effects associated with neurodevelopmental disorders and co-occurring conditions. *Nature Human Behaviour*. 2023; 7(4), 642–656. <https://doi.org/10.1038/s41562-023-01530>
2. Srivastava, S., Love-Nichols, J. A., Dies, K. A., Ledbetter, D. H., Martin, C. L., Chung, W. K., Firth, H. v., Frazier, T., Hansen, R. L., Prock, L., Brunner, H., Hoang, N., Scherer, S. W., Sahin, M., & Miller, D. T. Meta-analysis and multidisciplinary consensus statement: exome sequencing is a first-tier clinical diagnostic test

- for individuals with neurodevelopmental disorders and the NDD Exome Scoping Review Work Group. *Genetics in Medicine*. 2019; 21, 2413–2421. <https://doi.org/10.1038/s41436-019-0554-6>
3. Hu, W. F., Chahrour, M. H., & Walsh, C. A. The diverse genetic landscape of neurodevelopmental disorders. *Annual Review of Genomics and Human Genetics*. 2014; 15, 195–213. <https://doi.org/10.1146/annurev-genom-090413-025600>
  4. Wayhelova, M., Vallova, V., Broz, P. et al. Exome sequencing improves the molecular diagnostics of paediatric unexplained neurodevelopmental disorders. *Orphanet J Rare Dis*. 2024; 19, 41. <https://doi.org/10.1186/s13023-024-03056-6>
  5. Satterstrom, F. K., Kosmicki, J. A., Wang, J., Breen, M. S., de Rubeis, S., An, J. Y., Peng, M., Collins, R., Grove, J., Klei, L., Stevens, C., Reichert, J., Mulhern, M. S., Artomov, M., Gerges, S., Sheppard, B., Xu, X., Bhaduri, A., Norman, U., ... Buxbaum, J. D. Large-Scale Exome Sequencing Study Implicates Both Developmental and Functional Changes in the Neurobiology of Autism. *Cell*. 2020; 180(3), 568–584.e23. <https://doi.org/10.1016/j.cell.2019.12.036>
  6. Griffin A, Mahesh A, Tiwari VK. Disruption of the gene regulatory programme in neurodevelopmental disorders. *Biochim Biophys Acta Gene Regul Mech*. 2022 Oct;1865(7):194860. doi: 10.1016/j.bbagr.2022.194860. Epub 2022 Aug 23. PMID: 36007842.
  7. Ballesta-Martínez, M.J., Pérez-Fernández, V., López-González, V. et al. Validation of clinical exome sequencing in the diagnostic procedure of patients with intellectual disability in clinical practice. *Orphanet J Rare Dis*. 2023; 18, 201. <https://doi.org/10.1186/s13023-023-02809-z>
  8. Martinez-Granero, F., Blanco-Kelly, F., Sanchez-Jimeno, C. et al. Comparison of the diagnostic yield of aCGH and genome-wide sequencing across different neurodevelopmental disorders. *npj Genom. Med*. 2021; 6, 25. <https://doi.org/10.1038/s41525-021-00188-7>
  9. Monroe GR, Frederix GW, Savelberg SM, de Vries TI, Duran KJ, et al. Effectiveness of whole-exome sequencing and costs of the traditional diagnostic trajectory in children with intellectual disability. *Genet Med*. 2016; 18:949–56. doi: 10.1038/gim.2015.200
  10. Vrijenhoek T, Middelburg EM, Monroe GR, van Gassen KL, Geenen JW, Hövels AM, Knoers NV, van Amstel HK, Frederix GW. Whole-exome sequencing in intellectual disability; cost before and after a diagnosis. *European Journal of Human Genetics*. 2018; Nov;26(11):1566–71.
  11. Savatt JM, Myers SM. Genetic testing in neurodevelopmental disorders. *Frontiers in Pediatrics*. 2021; 19;9:526779.
  12. Zhou, X., Feliciano, P., Shu, C., Wang, T., Astrovskaya, I., Hall, J. B., Obiajulu, J. U., Wright, J. R., Murali, S. C., Xu, S. X., Brueggeman, L., Thomas, T. R., Marchenko, O., Fleisch, C., Barns, S. D., Snyder, L. A. G., Han, B., Chang, T. S., Turner, T. N., ... Chung, W. K. Integrating de novo and inherited variants in 42,607 autism cases identifies mutations in new moderate-risk genes. *Nature Genetics*. 2022; 54(9), 1305–1319. <https://doi.org/10.1038/s41588-022-01148-2>
  13. Servetti M, Pisciotto L, Tassano E, Cerminara M, Nobili L, Boeri S, Rosti G, Lerone M, Divizia MT, Ronchetto P, Puliti A. Neurodevelopmental disorders in patients with complex phenotypes and potential complex genetic basis involving non-coding genes, and double CNVs. *Frontiers in Genetics*. 2021; 21;12:732002. <https://doi.org/10.3389/fgene.2021.732002>
  14. Leite AJ, Pinto IP, Leijsten N, Ruiterkamp-Versteeg M, Pfundt R, de Leeuw N, da Cruz AD, Minasi LB. Diagnostic yield of patients with undiagnosed intellectual disability, global developmental delay and multiples congenital anomalies using karyotype, microarray analysis, whole exome sequencing from Central Brazil. *PLoS One*. 2022; 7;17(4):e0266493.
  15. Charouf, D., Miller, D., Haddad, L., White, F. A., Boustany, R.-M., & Obeid, M. High Diagnostic Yield and Clinical Utility of Next-Generation Sequencing in Children with Epilepsy and Neurodevelopmental Delays: A Retrospective Study. *International Journal of Molecular Sciences*. 2024; 25(17), 9645. <https://doi.org/10.3390/ijms25179645>
  16. Vissers, L., Gilissen, C. & Veltman, J. Genetic studies in intellectual disability and related disorders. *Nat Rev Genet*. 2016; 17, 9–18. <https://doi.org/10.1038/nrg3999>
  17. Wilfert, A.B., Sulovari, A., Turner, T.N. et al. Recurrent de novo mutations in neurodevelopmental disorders: properties and clinical implications. *Genome Med*. 2017; 9, 101. <https://doi.org/10.1186/s13073-017-0498-x>
  18. Vanderhaeghen, P., Polleux, F. Developmental mechanisms underlying the evolution of human cortical circuits. *Nat Rev Neurosci*. 2023; 24, 213–232. <https://doi.org/10.1038/s41583-023-00675-z>
  19. Swanberg SE, Nagarajan RP, Peddada S, Yasui DH, LaSalle JM. Reciprocal co-regulation of EGR2 and MECP2 is disrupted in Rett syndrome and autism. *Human Molecular Genetics*. 2009; 1;18(3):525–34. doi: 10.1093/hmg/ddn380.
  20. Fischer S, Schlotthauer I, Kizner V, Macartney T, Dorner-Ciossek C, Gillardon F. Loss-of-function Mutations of CUL3, a High Confidence Gene for Psychiatric Disorders, Lead to Aberrant Neurodevelopment In Human Induced Pluripotent Stem Cells. *Neuroscience*. 2020; 10;448:234–254. doi: 10.1016/j.neuroscience.2020.08.028.



21. Bruno, L. P., Doddato, G., Valentino, F., Baldassarri, M., Tita, R., Fallerini, C., Bruttini, M., Rizzo, C. lo, Mencarelli, M. A., Mari, F., Pinto, A. M., Fava, F., Fabbiani, A., Lamacchia, V., Carrer, A., Caputo, V., Granata, S., Benetti, E., Zguro, K., ... Ariani, F.. New candidates for autism/intellectual disability identified by whole-exome sequencing. *International Journal of Molecular Sciences*. 2021; 22(24). <https://doi.org/10.3390/ijms222413439>
22. Heiman P, Drewes S, Ghaloul-Gonzalez L. A familial case of CAMK2B mutation with variable expressivity. *SAGE Open Medical Case Reports*. 2021 Feb;9:2050313X21990982.
23. Jin C, Zhang X, Lei Q, Chen P, Hu H, Shen S, Liu J and Ye S. Case report: genetic analysis of a novel frameshift mutation in FMR1 gene in a Chinese family. *Front. Genet*. 2023; 14:1228682. doi: 10.3389/fgene.2023.1228682
24. Pande, S., Majethia, P., Nair, K. et al. De novo variants underlying monogenic syndromes with intellectual disability in a neurodevelopmental cohort from India. *Eur J Hum Genet*. 2024; 32, 1291–1298. <https://doi.org/10.1038/s41431-023-01513-7>
25. Lin P, Yang J, Wu S, Ye T, Zhuang W, Wang W, Tan T. Current trends of high-risk gene Cul3 in neurodevelopmental disorders. *Front Psychiatry*. 2023; 28;14:1215110. doi: 10.3389/fpsy.2023.1215110.
26. Uchino S, Waga C. SHANK3 as an autism spectrum disorder-associated gene. *Brain Dev*. 2013; 35(2):106-10. doi: 10.1016/j.braindev.2012.05.013.

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