# Exploration of large, rare copy number variants associated with psychiatric and neurodevelopmental disorders in individuals with anorexia nervosa

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Anorexia nervosa (AN) is a serious and heritable psychiatric disorder. To date, studies of copy number variants (CNVs) have been limited and inconclusive because of small sample sizes. We conducted a case-only genome-wide CNV survey in 1983 female AN cases included in the Genetic Consortium for Anorexia Nervosa. Following stringent quality control procedures, we investigated whether pathogenic CNVs in regions previously implicated in psychiatric and neurodevelopmental disorders were present in AN cases. We observed two instances of the wellestablished pathogenic CNVs in AN cases. In addition, one case had a deletion in the 13q12 region, overlapping with a deletion reported previously in two AN cases. As a secondary aim, we also examined our sample for CNVs over 1 Mbp in size. Out of the 40 instances of such large CNVs that were not implicated previously for AN or neuropsychiatric phenotypes, two of them contained genes with previous neuropsychiatric associations, and only five of them had no associated reports in public CNV databases. Although ours is the largest study of its kind in AN, larger datasets are needed to comprehensively assess the role of CNVs in the etiology of AN. Psychiatr Genet 27:152-158 Copyright © 2017 The Author(s). Published by Wolters Kluwer Health, Inc.

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#### Introduction

Anorexia nervosa (AN) is a psychiatric disorder that carries significant morbidity and mortality (Papadopoulos *et al.*, 2009; Arcelus *et al.*, 2011). Multiple lines of evidence

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suggest a notable genetic component in the etiology of AN. Twin studies have estimated the heritability  $(h^2)$  of AN to be 0.5–0.6 (Bulik *et al.*, 2006; Yilmaz *et al.*, 2015), and genomic efforts are underway to elucidate the role of genome-wide common variation in the etiology of AN (Wang *et al.*, 2011; Boraska *et al.*, 2014; Duncan *et al.*, 2016). Considering the important role that copy number variants (CNVs) play in psychiatric phenotypes (International Schizophrenia Consortium, 2008; Cooper *et al.*, 2011; Levinson *et al.*, 2011; Sanders *et al.*, 2011; Bergen *et al.*, 2012; Malhotra and Sebat, 2012; Szatkiewicz *et al.*, 2014), studies are needed to help elucidate their role

in AN. To date, only one CNV study in AN has been published, and although none of the well-established pathogenic CNVs associated with psychiatric and neurodevelopmental disorders were observed in individuals with AN, the authors reported a novel 1.5 Mbp deletion in 13q12 in two cases (Wang et al., 2011). However, the study was underpowered to detect rare pathogenic CNVs and the preliminary findings pertaining to AN require replication (Wang et al., 2011).

The aim of the present study was to assess the prevalence of large, rare CNVs associated previously with schizophrenia, autism, intellectual disability, or developmental delay in individuals with AN.

# Materials and methods

We conducted a case-only genome-wide survey for CNVs in 2907 female AN cases included in the Genetic Consortium for Anorexia Nervosa (GCAN), genotyped as a part of the Wellcome Trust Case Control Consortium 3 (WTCCC3) (Boraska et al., 2014). Patient ascertainment, quality control (QC), and genotyping procedures have been described in detail elsewhere (Boraska et al., 2014). The WTCCC3 controls included in the primary genomewide association analysis were unavailable for subsequent analyses; therefore, we identified three dbGaP datasets genotyped using the same array as a source of potential controls for our female AN cases of European ancestry. However, despite multiple rounds of rigorous QC, biases pertaining to CNV calling were present. After ruling out ancestry, plate effect, and original affection status reported in dbGaP datasets, we identified differential processing of the intensity files (correction of which was not possible in our case) as the most likely source of this potential bias. Therefore, we decided that a case-only analysis was necessary to ensure the correctness and validity of our results. Genotype data for the majority of the AN cases included in this study are available on the European Genome-phenome Archive (study accession: EGAS00001000913; dataset accession: EGAD000100010 34; https://www.ebi.ac.uk/ega/studies/EGAS00001000913).

As GCAN included DNA samples derived from various tissues (i.e. blood, buccal epithelium, saliva, or cell lines), we removed all nonblood samples to ensure high-quality and high-confidence CNV calls that are not confounded by DNA source, which led to a sample size of 1983 AN cases. Our analysis pipeline, which followed the steps outlined by Szatkiewicz et al. (2014), is summarized in Fig. 1, and additional information on the process is available Supplementary Methods (Supplemental digital content 1, http://links.lww.com/PG/A188 and Supplementary Table 1, Supplemental digital content 1, http://links.lww.com/PG/A188).

CNV calling was performed using PennCNV (June 2011 version) (Wang et al., 2007, 2008; Diskin et al., 2008) with parameters appropriate for the Illumina 660W-Quad chip (Illumina Inc., San Diego, California, USA). All other analyses were carried out using PLINK (Purcell et al., 2007) and R (R Development Core Team, 2011). We implemented strict cutoffs for single-nucleotide polymorphism (SNP) level, sample-level, and CNV-level QC procedures (Supplementary Methods, Supplemental digital content 1, http://links.lww.com/PG/A188). We examined AN cases for large CNVs previously reported to be associated with schizophrenia, autism, intellectual disability, or developmental delay (Cooper et al., 2011: Levinson et al., 2011: Sanders et al., 2011; Malhotra and Sebat, 2012; Sullivan et al., 2012) (Table 1). We considered all CNV events more than 100 kbp that had more than 50% reciprocal overlap within  $\pm 20$  kbp of a known psychiatric or neurodevelopmental CNV (i.e. at least 50 kbp overlap with a known CNV was required). We also assessed the presence of the 1.5 Mbp 13q12 deletion reported previously in two AN cases (Wang et al., 2011) (Table 1). As a secondary aim, we searched for any CNVs that are more than 1 Mbp in size and checked the Database of Genomic Variants public CNV database (DGV; http://dgv. tcag.ca) to determine whether these CNVs were reported in previous studies. A CNV is considered novel if it has less than 50% reciprocal overlap with previously reported CNVs in DGV. We also examined Online Mendelian Inheritance in Men (OMIM; https://www.omim.org) for overlap with known disease genes.

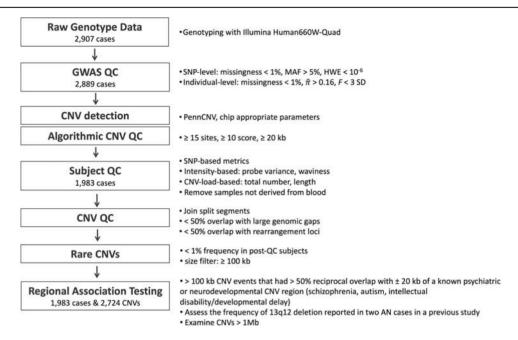
#### Results

Following rigorous QC, our analysis dataset comprised 2724 high-confidence, rare (<1% minor allele frequency), large (>100 kbp) CNVs in 1983 cases. Factors affecting the number of CNVs detected include array type used and analytic tools used (detection algorithms and QC procedures), with array type as the primary factor (Pinto et al., 2011; Szatkiewicz et al., 2013; Szatkiewicz et al., 2014). We observed a mean of 1.37 rare, large CNVs per patient, a rate comparable with what has been reported previously in the literature using similar SNP arrays (Szatkiewicz et al., 2014).

We observed two instances of CNVs with at least 50% reciprocal overlap with the regions associated with psychiatric and neurodevelopmental disorders (Table 1). More specifically, there were single instances of deletions in 15q13.3 (associated with autism, schizophrenia, and intellectual disability/developmental delay) and 16p11.12 (distal; deletions not associated with a psychiatric or neurodevelopmental phenotype), respectively. In addition, one AN case had a large deletion in the 13q12 region previously implicated in AN in a preliminary study (hg19 coordinates in Table 1; intensity plot in Supplementary Fig. 1, Supplemental digital content 1, http://links.lww.com/PG/A188); however, whether this CNV is AN specific is uncertain because of the case-only design of our study.

Following candidate CNV analysis, we next examined our dataset for the presence of rare (minor allele frequency < 1%) CNVs over 1 Mbp in size. We identified 42 regions with such

Fig. 1



Experimental workflow and CNV datasets. AN, anorexia nervosa; CNV, copy number variant; GWAS, genome-wide association study; HWE, Hardy-Weinberg equilibrium; MAF, minor allele frequency; QC, quality control; SNP, single-nucleotide polymorphism.

List of psychiatric and neurodevelopmental copy number variant regions examined in 1983 anorexia nervosa cases

Region	Coordinates (hg19)	Findings from the literature	Deletion count in AN	Duplication count in AN
1q21.1	chr1: 145 000 000-148 000 000	Deletion and duplication in SCZ; duplication in AUT; deletion and duplication in ID/DD	0	0
2p16.3	chr2: 50 100 000-51 200 000	Deletion in SCZ; deletion in ID/DD; deletion in AUT	0	0
3q29	chr3: 195 700 000-197 300 000	Deletion in SCZ; deletion in ID/DD	0	0
7q11.23	chr7: 72 700 000-74 100 000	Deletion and duplication in ID/DD; duplication in AUT	0	0
7q36.3	chr7: 158 800 000-158 900 000	Duplication in SCZ	0	0
13q12	chr13: 23 528 685-24 897 901	Deletion in AN (reported in two cases in a previous study)	1	0
15q11.2	chr15: 23 600 000-28 400 000	Deletion and duplication in SCZ; deletion and duplication in ID/ DD; duplication in AUT	0	0
15q13.3	chr15: 30 900 000-32 500 000	Deletion in SCZ; deletion and duplication in ID/DD; deletion and duplication in AUT	1	0
16p11.2(1)	chr16: 28 822 499-29 042 499	Deletion in SCZ; deletion in ID/DD	0	0
16p11.2(2)	chr16: 29 500 000-30 200 000	Duplication in AUT; duplication in SCZ	1	0
17q12	chr17: 34 800 000-36 200 000	Deletion in SCZ; deletion in ID/DD; deletion in AUT	0	0
22q11.21	chr22: 18 700 000-21 800 000	Deletion in SCZ; deletion and duplication in ID/DD; deletion and duplication in AUT	0	0

AN, anorexia nervosa; AUT, autism; ID/DD, intellectual disability/developmental delay; SCZ, schizophrenia.

large deletions and duplications (Table 2), including one instance of 15q13.3 and 13q12 deletions each (Table 1). Out of the remaining 40 CNVs, 18 of them housed a total of 35 genes associated with various Mendelian conditions in OMIM, most of which are not associated with psychiatric or neurodevelopmental phenotypes (Table 2). However, the 3p26.3 deletion observed in one case spans over the CRBN gene, which is associated with autosomal recessive intellectual disability. Similarly, two genes (SHROOM4 and SYP) located within the Xp11.23 region (in which one case had a large deletion) have been associated previously with X-linked recessive developmental delay and intellectual disability. A

duplication in the 22q11.21 region (which does not have 50% overlap with the 22q11 candidate CNV region) includes TBX1, previously linked to velocardiofacial syndrome. Also of interest, three CNV events in our AN database that were not reported in DGV were observed in schizophrenia cases in the PGC CNV database (CNV and Schizophrenia Working Groups of the Psychiatric Genomics Consortium & Psychosis Endophenotypes International Consortium, 2016).

We could not find previous reports of or frequency information for five of the 42 rare and large CNV events. Although two of them (2p25.1 and 2p25.2) do not contain

Table 2 Genomic coordinates for the 40 regions containing large (>1 Mbp) copy number variants in anorexia nervosa cases<sup>a</sup>

Previous report(s) OMIM disease genes located within CNV and associated phenotypes in PGC? $^\circ$	Yes		Yes from exhiptorhoonis $BUB1$ (colorectal cancer with chromosomal instability); $MERIR$ (retinitis pigmentosa 3B)	(Sec) במה של של היים ש	ON	No			Yes CYP4V2 (Bietti crystalline corneoretinal dystrophy); F11 (factor XI deficiency, autosomal dominant or recessive)		°Z	No /L37RA (amyloidosis)	No SMN1 (spinal muscular atrophy)	No	Yes DLC1 (deletion associated with colorectal cancer)	No LPL (familial combined hyperlipidemia; lipoprotein lipase deficiency); LZTS1 (esophageal squamous cell	carcinoma)		Yes (schizophrenia PCDH15 (deafness, autosomal recessive 23; Usher syndrome, type 1D/F or 1F)	·		•	Yes XYL/1 (desbuquois dysplasia 2)	Yes	Yes		Yes (one schizophrenia PANKZ (HARP syndrome; neurodegeneration with brain iron accumulation)	case) Case) Vos Vos			Yes IGLL1 (agammaglobulinemia 2); SMARCB1 (Coffin-Siris syndrome 3; somatic rhabdoid tumors); SPECC1L	Yes WAS X-inked neutropenia, severe congenital; Wiskott-Adrich syndrome; X-inked trombocytopenia); GATA1	Allowed anemia; megakariyobiasiid ekkema with of without Down syndrome; Allowed thrombocytopenia);	PUBLY (renpenning syndrome); LLCL'9 (Dert disease; hypophosphaemic rickets; rephrolimatis, type I;	proteinura, jow molecular weight, with hypercarcuir reprincarcinosis), buying the processing and dysterior control of the processing of th	premarure ovarian fallure); $EBP$ (X-linked dominant hondrodysplasia punctate; MENU syndrome); $SHROUM4$	(tocco dos Santos X-linked mental retardation syndrome); I/E3 (papillary renal cell carcinoma); S/P/(X-linked	intellectual disability', CACATA' Ir (hand island eye disease), A-inkad cone-food dystrophy; A-inkad night bindness, connecital stability's (ACATA) (17 (hand island eye disease), A-inkad cone-food dystrophy; A-inkad antanonesh	congenina stationary (incompreted), i. Ozv. o tx. intract initioral seguration, polyenbodanty, and enteropanty Yes	\ \ \ \ \ \ \ \ \ \ \ \ \ \ \ \ \ \ \	20 \ > \	00 >>		Yes S/S (X-linked ichthyosis)	Yes	Yes	
Previous report(s) in DGV? <sup>b</sup>	o <sub>N</sub>	°;	Yes	2	Š	Š	Yes	Yes	Yes	Yes	Yes	8 N	Yes	Š	Yes	Š		<sub>S</sub>	Š	;	Yes	Yes	Yes	Yes	Yes	Yes	o Z	Z	Yes	2	Yes	°Z							Ž	2 2	2 2	2 2	<u>2</u> ;	o Z	o Z	S N	
CNV type	Deletion	Deletion	Deletion		Duplication	Duplication	Deletion	Deletion	Duplication	Duplication	Duplication	Deletion	Duplication	Duplication	Duplication	Duplication		Duplication	Duplication	:	Duplication	Duplication	Deletion	Duplication	Duplication	Duplication	Deletion	Duplication	Duplication		Duplication	Deletion							Duplication	Duplication	Duplication	Delational	Deletion	Duplication	Duplication	Duplication	
Coordinates (hg19)	chr1: 106 195 966-107 267 115	chr1: 194 453 253-195 527 078	chr2: 111 392 259-113 098 812 chr2: 123 030 939-126 370 246		chr2: 5 713 005-6 973 874	chr2: 7 284 752-8 332 717	chr2: 83 011 373-84 155 060	chr3: 2062298-3363379	chr4: 186 563 188-188 247 352	chr4: 188 317 381-189 536 211	chr5: 26 942 758-28 114 207	chr5: 53 865 607-55 220 819	chr5: 68 865 034-70 307 359	chr8: 110 934 142-114 949 589	chr8: 13369061-14658615	chr8: 19 723 503-21 556 732		chr8: 28 557 627-30 585 738	chr10: 55 198 707-56 731 004		chr12: 43 628 705-44 755 194	chr13: 103 682 440-104 973 086	chr16: 16 859 801-18 165 043	chr16: 82 185 320-83 665 269	chr17: 31 825 116-33 030 020	chr18: 68 814 612-69 928 013	chr20: 3392871-4622756	chr20: 7 102 986_8 575 671	chr22: 18 941 457–20 279 159		chr22: 23 690 325-24 996 630	chrX: 48 291 665–52 255 360							chrX: 6 458 166–7 517 395	chrX: 6 458 166-7 980 930	CHA: 0 450 100-7 900 950	CHA. 0 450 100-0 000 292	chrX; 6 458 166-8 135 U53	chrX: 6 458 166-8 141 017	chrX: 6 516 735-8 068 292	chrX: 6 564 943-7 745 286	CLT LTT C CCC T CC C C
CNV region		<b>m</b>	2q13	5		_	2p12	3p26.3	4q35.1						8p22	8p21.3			10q21.1	:				16q23.3	17q12	18q22.3	20p13		22011.21		22q11.23	Xp11.23							Xn22.31	Xn99.31						Xp22.31	

AN, anorexia nervosa; AUT, autism; CNV, copy number variant; DGV, Database of Genomic Variants; ID/DD, intellectual disability/developmental delay; OMIM, Online Mendelian Inheritance in Men; PGC, Psychiatric Genomics Consortium; SCZ, schizophrenia.

<sup>&</sup>lt;sup>a</sup>This table does not include the 13q12 deletion or the 15q13.3 duplication, and all events are singletons (unless indicated otherwise).

<sup>b</sup>htp://dgv.tcag.ca; at least 50% reciprocal overlap.

<sup>c</sup>http://pgc.tcag.ca/gb2/gbrowse/pgc\_hg18/; at least 50% reciprocal overlap.

<sup>d</sup>Observed in two AN cases.

any OMIM disease genes, the remaining three CNV regions (5q11.2, 8p21.1, and 8p21.3) span over OMIM disease genes associated with amyloidosis, hyperlipidemia, hemolytic anemia, and esophageal carcinoma (Table 2). It is also noteworthy that 10 cases had CNV events (eight duplications and two deletions) in the Xp22.31 region (chrX: 6458166–8141017; Table 2). The follow-up quantitative PCR experiment examining one deletion and one duplication from this region validated these CNVs successfully (details in Supplementary Information, Supplemental digital content 1, http://links. lww.com/PG/A188). There were no reports of CNVs with more than 50% reciprocal overlap with Xp22.31 in DGV; however, deletions and duplications in this region were found in both schizophrenia cases and controls as a part of the Psychiatric Genomics Consortium CNV Working Group (CNV and Schizophrenia Working Groups of the Psychiatric Genomics Consortium & Psychosis Endophenotypes International Consortium, 2016).

## **Discussion**

In this case-only analysis, two individuals with AN had large, rare CNVs with over 50% reciprocal overlap with regions associated with psychiatric and neurodevelopmental disorders. The frequency with which these CNVs were observed in our sample is consistent with the literature (Levinson et al., 2011; Szatkiewicz et al., 2014). Furthermore, one AN case in our study had a large deletion in the 13q12 region described previously in two cases with AN (Wang et al., 2011). It is noteworthy that there is no frequency information available for the 13q12 deletion in 1000 Genomes, which suggests that the precise population frequency of this CNV is not well known. However, we found three studies in DGV, which reported CNVs in controls with more than 50% reciprocal overlap with the CNV in our study (Pinto et al., 2007; Cooper et al., 2011; Uddin et al., 2015). Although we cannot rule out a possible AN diagnosis in these individuals, 13q12 deletion does not appear to be AN specific, and its presence in one AN case should be interpreted with caution as larger case-control samples are required to rigorously evaluate the validity of this deletion in AN.

Outside of the well-established neuropsychiatric CNVs, 40 instances of rare and large CNVs were observed in AN cases. Although many of them contained OMIM disease genes, only two of these events (3p26.3 and Xp11.23) had previous associations with psychiatric/neurodevelopmental phenotypes. However, the lack of detailed phenotypic information prevented us from further examining the characteristics of the AN patients with these CNVs. Also of interest, three large CNVs not available in public databases were observed in schizophrenia cases, but not controls in the PGC CNV database, thus suggesting a potential association with schizophrenia that requires replication. Although there were 10 instances of CNV events in the Xp22.31 region in AN cases in our study

(whose validity was confirmed by quantitative PCR), this CNV does not appear to be rare and has been reported in healthy controls alongside schizophrenia cases in PGC, and therefore unlikely to be an AN-specific risk CNV. Although this region includes STS, a gene associated with X-linked ichithyosis (a family of skin disorders), there are no known associated medical phenotypes observed in females. It is noteworthy that we failed to detect any clinical patterns involving AN age at onset, lowest illnessrelated BMI, highest-lifetime BMI, or AN subtype among the patients with CNVs in this Xp22.31 region.

Although the present study is the largest AN CNV analysis carried out to date, limitations must be considered. As a case-only design, our analyses focused on the characterization of the large, rare, and well-replicated psychiatric and neurodevelopmental CNVs in individuals with AN, as well as the description of 1 Mbp + CNVs observed in our sample. The GCAN/WTCCC3 AN genomic dataset is challenging because of the ancestral heterogeneity of the component samples, which required us to apply strict QC cutoffs. Furthermore, the WTCCC3 controls used in the primary genome-wide association studies were unavailable for our analysis. We accessed and tested several dbGaP datasets as controls with the goal of investigating CNV burden and searching for novel CNVs associated with AN; however, several technical issues arose caused by the arrays having been processed separately, ultimately leading to the decision to extract as much information as possible from cases by determining whether CNVs in regions implicated in psychiatric and neurodevelopmental disorders were present in AN cases. Furthermore, the lack of detailed clinical phenotype information prevented us from performing a more in-depth examination of whether there are clinical manifestations associated with these CNVs in patients with AN. Although it is possible that some of the CNVs included in our analysis do not confer risk for AN, our study may have been underpowered to detect a few of these rare CNVs, thus potentially failing to capture their actual prevalence in individuals with AN. Future directions include examining a well-matched large case-control sample (ideally around 5000 cases, which would confidently allow for the assessment of known CNVs with 0.1% frequency implicated in other psychiatric disorders in AN) to assess case-control differences in CNV (e.g. genic and genome-wide) as well as searching for novel CNVs that confer risk to AN.

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#### **Conflicts of interest**

C.M. Bulik is a grant recipient from and consultant for Shire Pharmaceuticals on topics unrelated to this submission. P.F. Sullivan advises Pfizer Inc. For the remaining authors there are no conflicts of interest.

### References

- Arcelus J, Mitchell AJ, Wales J, Nielsen S (2011). Mortality rates in patients with anorexia nervosa and other eating disorders. A meta-analysis of 36 studies. Arch Gen Psychiatry 68:724-731.
- Bergen SE, O'Dushlaine CT, Ripke S, Lee PH, Ruderfer DM, Akterin S, et al. (2012). Genome-wide association study in a Swedish population yields support for greater CNV and MHC involvement in schizophrenia compared with bipolar disorder. Mol Psychiatry 17:880-886.
- Boraska V, Franklin CS, Floyd JA, Thornton LM, Huckins LM, Southam L, et al. (2014). A genome-wide association study of anorexia nervosa. Mol Psychiatry 19:1085-1094.
- Bulik CM, Sullivan PF, Tozzi F, Furberg H, Lichtenstein P, Pedersen NL (2006). Prevalence, heritability, and prospective risk factors for anorexia nervosa, Arch Gen Psychiatry 63:305-312.
- CNV and Schizophrenia Working Groups of the Psychiatric Genomics Consortium & Psychosis Endophenotypes International Consortium (2017). Contribution of copy number variants to schizophrenia from a genome-wide study of 41 321 subjects. Nat Genet 49:27-35.
- Cooper GM, Coe BP, Girirajan S, Rosenfeld JA, Vu TH, Baker C, et al. (2011). A copy number variation morbidity map of developmental delay. Nat Genet 43:838-846
- Diskin SJ, Li M, Hou C, Yang S, Glessner J, Hakonarson H, et al. (2008). Adjustment of genomic waves in signal intensities from whole-genome SNP genotyping platforms. Nucleic Acids Res 36:e126.

- Duncan I. Yilmaz Z. Walters R. Goldstein I. Antilla V. Bulik-Sullivan B. et al. (2016). Genome-wide association study reveals first locus for anorexia nervosa and metabolic correlations. bioRxiv. doi: 10.1101/088815.
- International Schizophrenia Consortium (2008). Rare chromosomal deletions and duplications increase risk of schizophrenia. Nature 455:237.
- Levinson DF, Duan J, Oh S, Wang K, Sanders AR, Shi J, et al. (2011). Copy number variants in schizophrenia: confirmation of five previous findings and new evidence for 3q29 microdeletions and VIPR2 duplications. Am J Psychiatry 168:302-316.
- Malhotra D, Sebat J (2012). CNVs: harbingers of a rare variant revolution in psychiatric genetics. Cell 148:1223-1241.
- Papadopoulos FC, Ekbom A, Brandt L, Ekselius L (2009). Excess mortality, causes of death and prognostic factors in anorexia nervosa. Br J Psychiatry
- Pinto D, Marshall C, Feuk L, Scherer SW (2007). Copy-number variation in control population cohorts. Hum Mol Genet 16:R168-R173.
- Pinto D, Darvishi K, Shi X, Rajan D, Rigler D, Fitzgerald T, et al. (2011). Comprehensive assessment of array-based platforms and calling algorithms for detection of copy number variants. Nat Biotechnol 29:512-520.
- Purcell S, Neale B, Todd-Brown K, Thomas L, Ferreira MA, Bender D, et al. (2007). PLINK: a tool set for whole-genome association and population-based linkage analyses. Am J Hum Genet 81:559.
- R Development Core Team (2011). R: a language and environment for statistical computing. Vienna, Austria: R Foundation for Statistical Computing.
- Sanders SJ, Ercan-Sencicek AG, Hus V, Luo R, Murtha MT, Moreno-de-Luca D, et al. (2011). Multiple recurrent de novo CNVs, including duplications of the 7q11.23 Williams syndrome region, are strongly associated with autism. Neuron 70:863-885.
- Sullivan PF, Daly MJ, O'Donovan M (2012). Genetic architectures of psychiatric disorders: the emerging picture and its implications. Nat Rev Genet 13:537.
- Szatkiewicz JP, Neale BM, O'Dushlaine C, Fromer M, Goldstein JI, Moran JL, et al. (2013). Detecting large copy number variants using exome genotyping arrays in a large Swedish schizophrenia sample. Mol Psychiatry 18:1178-1184.
- Szatkiewicz JP, O'Dushlaine C, Chen G, Chambert K, Moran JL, Neale BM, et al. (2014). Copy number variation in schizophrenia in Sweden. Mol Psychiatry
- Uddin M, Thiruvahindrapuram B, Walker S, Wang Z, Hu P, Lamoureux S, et al. (2015). A high-resolution copy-number variation resource for clinical and population genetics. Genet Med 17:747-752.
- Wang K, Li M, Hadley D, Liu R, Glessner J, Grant SF, et al. (2007). PennCNV: an integrated hidden Markov model designed for high-resolution copy number variation detection in whole-genome SNP genotyping data. Genome Res 17:1665-1674.
- Wang K, Chen Z, Tadesse MG, Glessner J, Grant SF, Hakonarson H, et al. (2008). Modeling genetic inheritance of copy number variations. Nucleic Acids Res 36:e138.
- Wang K, Zhang H, Bloss CS, Duvvuri V, Kaye W, Schork NJ, et al., Price Foundation Collaborative Group (2011). A genome-wide association study on common SNPs and rare CNVs in anorexia nervosa. Mol Psychiatry
- Yilmaz Z, Hardaway JA, Bulik CM (2015). Genetics and epigenetics of eating disorders. Adv Genomics Genet 5:131-150.