Copy Number Variants: detection and analysis

Manuel Ferreira & Shaun Purcell

Boulder, 2009

Large chromosomal rearrangements can cause sporadic disease

Down syndrome Duchenne Muscular Dystrophy (DMD) DiGeorge-Velo cardiofacial syndrome (VCFS)

. . .

Lupski 2007 Nat Genet 39: s43

Detection of large-scale variation in the human genome

A John Iafrate^{1,2}, Lars Feuk³, Miguel N Rivera^{1,2}, Marc L Listewnik¹, Patricia K Donahoe^{2,4}, Ying Qi³, Stephen W Scherer^{3,5} & Charles Lee^{1,2,5}

We identified 255 loci across the human genome that contain genomic imbalances among unrelated individuals. Twenty-four variants are present in >10% of the individuals that we examined. Half of these regions overlap with genes, and many coincide with segmental duplications or gaps in the human genome assembly. This previously unappreciated heterogeneity may underlie certain human phenotypic variation and susceptibility to disease and argues for a more dynamic human genome structure.

Iafrate et al 2004 Nat Genet 36: 949

Large-Scale Copy Number Polymorphism in the Human Genome

Jonathan Sebat,¹ B. Lakshmi,¹ Jennifer Troge,¹ Joan Alexander,¹ Janet Young,² Pär Lundin,³ Susanne Månér,³ Hillary Massa,² Megan Walker,² Maoyen Chi,¹ Nicholas Navin,¹ Robert Lucito,¹ John Healy,¹ James Hicks,¹ Kenny Ye,⁴ Andrew Reiner,¹ T. Conrad Gilliam,⁵ Barbara Trask,² Nick Patterson,⁶ Anders Zetterberg,³ Michael Wigler¹*

> vhich large duplications and deletions contribute to human genetic versity is unknown. Here, we show that large-scale copy number (CNPs) (about 100 kilobases and greater) contribute substantially ntion between normal humans. Representational oligonucleotide sis of 20 individuals revealed a total of 221 copy number differng 76 unique CNPs. On average, individuals differed by 11 CNPs, length of a CNP interval was 465 kilobases. We observed copy on of 70 different genes within CNP intervals, including genes urological function, regulation of cell growth, regulation of metabveral genes known to be associated with disease.

> > Sebat et al 2004 Science 305: 525

- 1. What is a Copy Number Variant (CNV)
- 2. Genome-wide detection of CNVs
- 3. Association analysis of CNVs
- 4. Online databases

1. Classes of structural variants

Quantitative (CNVs)

<u>Deletions</u>

Duplications

Insertions

Positional (Translocations)

Orientational (Inversions)

<u>Copy Number Polymorphism</u> (CNP) is a *CNV* that occurs in >1% population

<u>Structural Variants</u> Genomic alterations involving

segment of DNA >1kb





Sequence

Structural variation

Cytogenetic detection

Scherer 2007 Nat Genet 39: s7

2. Origins of CNVs

(A) Non-allelic homologous recombination



(B) Non-homologous end joining

(C) Tandem repeat sequences

(D) Retrotransposons

Bailey & Eichler 2006 Nat Rev Genet 7: 552

3. CNVs are abundant in the genome

Human vs Human	SNPs	CNVs
Base pairs	2.5 Mb	4 Mb
	1/1,200 bp	1/800
% genome	0.08%	0.12%

4. CNVs significantly overlap with known genes



Cooper et al 2007 Nat Genet 39: s22

5. CNVs influence gene expression

83.6%



SNP-express	ion	association
-------------	-----	-------------

1
2
3
4
5 • • • • • • • • • • • • • •
6 ••• •••• • ••• • ••• •
7 *** * *** * ** * ** *** *** ***
8 • • • • • • • • • •
9
10
11 • • • • • • • • • • • • • • • • • •
12
13
14 *** * *** *** **** **** ***
15
16
17 •••• •••• •••• •••
18 ***
19 *** ***
20
21
22
Χ
Υ
0 50300000 10300000 15000000 2000000 2500000



Stranger et al 2007 Science 315: 848

6. In healthy individuals, most CNVs are inherited...





McCarroll 2008 Hum Mol Genet 17: R135 McCarroll et al 2008 Nat Genet 40: 1166

A. Using intensity data from whole-genome arrays

<u>SNPs</u> → Genotype known common variants



(A) Genotype known common variants

(B) Identify and genotype new, potentially rarer variants

(A) Genotype known common CNVs using whole-genome arrays

Nimblegen



array-CGH, CNV only, test vs reference

custom or whole-genome (up to 2,1M probes)



Illumina 1M

>940,000 CNV non-polymorphic probes

High-density in ~5,600 CNV regions in DGV + extended to whole-genome

36,000 CNV non-polymorphic probes

covering ~4,000 CNV regions in DGV









Non-polymorphic probes

McCarroll et al 2008 Nat Genet 40: 1166

(B) Identify and genotype new, potentially rarer CNVs from whole-genome array data (CGH, Affymetrix/Illumina)

Example: rs1006737 A/G AA AG

GG

... AGCCCGAAATGTTTTCAGA...probe 1... AGCCCGAAGTGTTTTCAGA...probe 2



Intensity of probe 2



Genotype		Copy number for:			
Ind	Mat/Pat	Pattern	А	G	Total
1	A/G	…CG <mark>—A→</mark> ATG… …CG <mark>—G→</mark> ATG…	1	1	2

rs000, A/G ↓ ...CG<mark>—A→</mark>ATG...





Birdseye Affy 5.0, 6.0 Korn et al 2008 Nat Genet 40: 1253

PennCNV

Affymetrix and Illumina Wang et al 2007 Genome Res 17: 1665

Combine information across probes to identify new CNVs

For example	Cases	Controls
100kb deletion chr. 2	10/5,000	1/5,000

Detecting CNVs through GWAS arrays is challenging...

Lots of confounders: DNA quality, concentration, source, batch effects, date effects.

Arrays have poor resolution for CNVs (>100kb).

Genotype calling is computationally demanding, as it requires analysis of very large 'raw' cell files.

Genotype calling software often platform specific, not very user friendly.

B. Identifying CNVs through genotyping errors





Conrad et al 2006 Nat Genet 38: 75 McCarroll et al 2006 Nat Genet 38: 86

C. Targeted or whole-genome sequencing



Korbel et al 2007 Science 318: 420

Summary so far...

CNVs are abundant, often overlap genes, can influence gene expression and most are inherited in healthy individuals

Known and new CNVs can be identified and genotyped in largescale studies using whole-genome genotyping arrays, such as the 6.0 and 1M. Low resolution (>100Kb) & low signal/noise ratio.

More accurate CNV genotyping maps/arrays/algorithms expected in the next few years.

What are the particular strategies and challenges for association analysis of CNVs?

3. Association analysis of CNVs

1. Some of the relevant questions

(A) Are CNPs associated with variation in human traits or diseases?

(B) Can we identify rare CNVs associated with large increase in disease risk? Are these de novo or inherited in cases?

(C) When considering the whole-genome, do cases have more CNV events then controls, ie. increased burden?

(D) How to test SNPs in copy number regions?

(E) Are most CNVs tagged by SNPs in genotyping arrays?

Example 1: Autism whole-genome CNV analysis

Sample	16p11	Cases	Controls	Р	
Discovery	Del (600kb)	5/1,441	3/4,234	1 1 1 10-4	COPPER
[Affy 500K]	Dup	7/1,441	2/4,234	1.1 X 10	CNAT
Replication 1 (CHB)	Del	5/512	0/434	0.007	
[array-CGH]	Dup	4/512	0/434	0.007	
Replication 2 (deCODE)	Del	3/299	2/18,834	4.2 × 10-4	
[Illumina]	Dup	0/299	5/18,834	4.2 X 10 '	

Deletion frequency Iceland			del	dup
Autism	1%	inherited	2	6
Psychiatric disorder	0.1%	de novo	10	1
General population	0.01%	unknown	1	4

Weiss et al. N Engl J Med 2008; 358: 667

Example 2: SCZ whole-genome CNV analysis



Controls

Specific large (>500kb) rare deletions





11:0

A "positive control"

1:4000 live births ~30% develop psychosis In ~0.6-2% SCZ patients

3Mb and 1.5Mb variants

2 additional atypical deletions observed

15q13.3



9:0

CHRNA7, alpha 7 nicotinic acetylcholine receptor

5 cases w/ impaired cognition; 1 w/ epilepsy

Previously seen in mental retardation with seizures

1q21.1



10:1

3 cases had cognitive abnormalities; 1 with epilepsy

Also seen in a patient with MR and seizures and two patients with autism.

Genome-wide burden of rare CNVs in SCZ

3,391 patients with SCZ, 3,181 controls *Filter for <1% MAF, >100kb* **6,753 CNVs**



Results invariant to obvious statistical controls

Array type, genotyping plate, sample collection site, mean probe intensity



- Two other studies supporting a genome-wide increase in rare CNVs in schizophrenia
 - Walsh et al (2008) Science
 - 5% controls, 15% cases, 20% early onset cases
 - neurodevelopmental genes disrupted
 - Xu et al (2008) Nature Genetics
 - strong increased de novo rate in sporadic cases; but increased inherited rate also

Association analysis of CNVs

2. Testing SNPs in CNV regions





$$y = \beta_1 \cdot \text{SNP} + \beta_2 \cdot \text{CNV}$$

$$\downarrow$$

$$y = \beta_1 \cdot (\text{A} - \text{B}) + \beta_2 \cdot (\text{A} + \text{B})$$

Normalized intensity of allele A

Allele-specific risk CNV

Korn et al 2008 Nat Genet 40: 1253

Association analysis of CNVs

3. Testing CNVs through the analysis of SNPs in LD



Coverage limited by lack of SNPs in CNV regions (poor genotyping)

McCarroll et al 2008 Nat Genet 40: 1166

4. Online databases

Database of Genomic Variants

http://projects.tcag.ca/variation/



Comprehensive summary of structural variation in the human genome. Healthy control samples

DECIPHER

https://decipher.sanger.ac.uk/



Database of submicroscopic chromosomal imbalances, from array-CGH data. Focuses on data from patients with developmental delay, learning disabilities or congenital anomalies.