

## Sequence analysis of the canola genome

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### ABSTRACT

Brassica genomes are relatively large and complex due to historic duplication events, the amplification of families of transposable elements, and polyploidisation. The development of second generation DNA sequencing methods is rapidly changing plant genome research and we are applying this technology for the analysis of the Brassica genomes. We have generated genome sequence data for several Brassica species and developed tools for the analysis of this data. These tools can be applied for gene and molecular marker discovery, providing an unprecedented insight into genome structure and variation to support Brassica crop improvement.

### INTRODUCTION

The application of second generation DNA sequencing technology is rapidly changing Brassica genome research. DNA sequencing technology has changed dramatically in recent years, revolutionising both human and plant genomics. Second generation DNA sequencing technologies can produce more than 200 billion nucleotides of sequence data in a single run (Imelfort and Edwards, 2009) and data production continues to increase rapidly. The completed genome sequences of Brassicas and Arabidopsis provides the opportunity to conduct re-sequencing and comparative genomic analysis of individuals and assist in the identification and characterisation of sequence variants. This crop genome sequencing data can be applied for genome analysis leading to crop improvement (Edwards and Batley, 2009).

The use of modern molecular genetics tools has increased the speed of breeding new varieties and permits the application of newly available genome sequence information for crop improvement. In crop species, genetic variation analyses predominantly focus on single nucleotide polymorphisms (SNPs) for marker-trait association. An appreciation of how this variation affects phenotypic variation in plants is now possible through the improvements in available technologies. Characterisation of SNP density in plants can assist in the understanding of recent selection pressures on plant genomes, the genomic components that contribute to adaptation and the identification of genes that have been the target of selection.

The Brassica sequencing projects are generating volumes of data that cannot be easily analysed using traditional bioinformatics methods and this creates a set of unique challenges that do not exist with traditional long-read sequencing. We have been developing a number of tools to interrogate and analyse this sequence information to accelerate research in Brassica crop improvement. These tools have applications in the areas of integrative genomics, gene discovery and gene annotation. We aim to analyse the Brassica genomes to identify genes, novel and mapped genetic markers and develop methods for the association of agronomic traits with underlying genomic variation.

## MATERIALS AND METHODS

### Resequencing Brassica Genomes

Illumina GAllx and Hi-Seq paired end and mate paired sequence data has been generated for eight *B. napus* varieties and compared to reference Brassica genomes using custom bioinformatics pipelines. SOAP (Li et al., 2008) is highly efficient for mapping *B. napus* paired reads against a *B. napus* reference genome.

### SNP Identification

The SNP discovery is performed in a stepwise manner, using the custom developed SGSautoSNP. SNPs are predicted from the aligned data and SNP confidence calculated based on a combination of redundancy, coverage and distribution of base calls between samples. Additional genomic variation such as indels, translocations and inversions can be predicted from the alignment of read pairs to the genome and the identification of paired read mapping variation. The total map of genetic variation is maintained in a custom database and viewed using standard genome feature format (GFF) in compatible genome viewers such as GBrowse (Arnaudova et al., 2009) or Biomatters Geneious (Drummond et al., 2009).

### Assessing SNP Density across the Genomes

The resulting identified genomic variation has been integrated with annotated genome features and previously mapped genetic markers to link agronomic traits, associated markers and candidate gene information on a genome wide scale. A custom pipeline has been developed for the assessment of SNP density across the genome, including specific regions associated with expressed genes.

## RESULTS AND DISCUSSION

### SNP Identification

More than 100,000 SNPs have been identified across eight varieties of *B. napus*. The number of predicted SNPs was distributed evenly across the 19 chromosomes, with variation as expected according to chromosome length. The SNP base changes were recorded. As the directionality of the change cannot be inferred from the data, polymorphisms were grouped alphabetically, ie. A>G and G>A are grouped as A>G. A greater number of transitions (A>G or C>T) than transversions (A>C, A>T, C>G or G>T) were identified. This is in accordance with previous computational and laboratory based SNP discovery studies (Deutsch et al., 2001, Duran et al., 2009) and reflects the high frequency of C to T mutation following methylation (Coulondre et al., 1978). SNP density varied across the chromosomes suggesting evidence of selection.

## CONCLUSIONS

The sequencing and re-sequencing of canola varieties has identified genome wide variation represented by more than 100,000 high confidence single nucleotide polymorphisms. Bioinformatics tools have been produced and applied to interrogate and annotate this abundant data, and genome wide variation has been integrated with genetic maps and phenotypic information. The Brassica genomes provide an insight into the evolution of these important crop plants and tools to advance breeding of improved varieties with enhanced agronomic traits.

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