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# Gene ontology based characterization of Expressed Sequence Tags (ESTs) of *Brassica rapa* cv. Osome

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Chinese cabbage (*Brassica rapa*) is widely recognized for its economic importance and contribution to human nutrition but abiotic and biotic stresses are main obstacle for its quality, nutritional status and production. In this study, 3,429 Express Sequence Tag (EST) sequences were generated from *B. rapa* cv. Osome cDNA library and the unique transcripts were classified functionally using a gene ontology (GO) hierarchy, Kyoto encyclopedia of genes and genomes (KEGG). KEGG orthology and the structural domain data were obtained from the biological database for stress related genes (SRG). EST datasets provided a wide outlook of functional characterization of *B. rapa* cv. Osome. *In silico* analysis revealed % 83 of ESTs to be well annotated towards reeds one dimensional concept. Clustering of ESTs returned 333 contigs and 2,446 singlets, giving a total of 3,284 putative unigene sequences. This dataset contained 1,017 EST sequences functionally annotated to stress responses and from which expression of randomly selected SRGs were analyzed against cold, salt, drought, ABA, water and PEG stresses. Most of the SRGs showed differentially expression against these stresses. Thus, the EST dataset is very important for discovering the potential genes related to stress resistance in chinese cabbage, and can be of useful resources for genetic engineering of *Brassica* sp.

Keywords: Brassica rapa cv. Osome, ESTs, Gene ontology, Stress related genes

The genus *Brassica* includes many vegetable crops, such as broccoli, cabbage, Chinese cabbage, cauliflower, mustard, rape, kale and turnip<sup>1</sup>. Chinese cabbage, (*B. rapa* cv. Osome) is one of the most important vegetable crops and is cultivated widely in Asia, particularly in China, Korea, and Japan. Like many other crop plants, Chinese cabbage is challenged by many stresses including drought, high salt concentrations, low temperatures, pathogens and pests<sup>2,3</sup>. Efforts to develop plants resistant to biotic and abiotic stresses are under way and functional genomics study is one of the most important approaches for identifying potential genes related to stress resistance.

An efficient method of functional genomics is an analysis of the expressed sequence tags (EST). EST represents short, unedited randomly selected single pass sequences derived from the cDNA libraries, which are also known as a 'poor man's' genome and have proven to be valuable in molecular  $biology^{4,5}$ . This technology is a commonly used approach to identify the genes involved in specific biological functions<sup>6</sup>. Currently, an interesting application of EST sequencing is a study of the gene expression pattern in response to a given environmental stimulus' and a trancriptomics study of a plant at various stages of development under different experimental conditions with various plant tissues (leaf stem, flower bud). EST is also used for single nucleotide polymorphism (SNP) characterization, proteomic exploration, CpG Island and promoter analysis<sup>5,8</sup>.

Since EST technology was introduced to the human genome project, it has been used widely to

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clone new genes, determine tissue specific gene expression profiles, annotate functional genome sequences etc,<sup>9-12</sup>. Manual annotation is not possible in annotating high-throughput sequences, such as ESTs. Computational methods are used to process EST sequences, such as sequence cleaning, vector masking, clustering, assembly and annotation to yield biological information to putative sequences. The use of a bioinformatics tool for homology-based functional annotation and statistical information is simple for ESTs from a range of organisms in the public non redundant databases<sup>13,5,14</sup>. Gene ontology (GO) is the most reliable biological annotation schema, in which globally biological communities have an approved structure. The GO project was developed with three structured controlled vocabularies (i.e. ontologies) to describe various genes or proteins in terms of their associated cellular component (CC), biological process (BP) and molecular function  $(MF)^{15}$ .

In this study, EST sequences of B. rapa cv. Osome have been applied to in silico approaches for functional classification based on GO vocabularies, estimation, transcript abundance biochemical classification based on Kyoto encyclopedia of genes and genomes (KEGG) orthology and analyzed protein function domains from a range of biological databases for the respective EST sequences. According to reeds words, all one dimensional data have been assigned to the putative sequences and those functional annotations helped to develop a further understanding of complex gene expression networks.

# **Materials and Methods**

cDNA library construction—An FLcDNA library was constructed according to Sato et al.<sup>19</sup> which was reported previously<sup>20</sup> and here described briefly. It was done by biotinylated CAP trapper using trehalose-thermoactivated reverse transcriptase. The mRNA isolated from RNA samples was quality checked and used for first-strand cDNA synthesis. After oxidation, biotinylation and RNase digestion of first-strand cDNA/mRNA hybrids, FLcDNA/RNA hybrids were captured on magnetic beads. RNA was removed by alkaline treatment to collect first-strand FLcDNA. The oligo(dG)-tailed first-strand cDNA was used for second-strand cDNA synthesis. The cDNA was restricted with BamHI and SalI/XhoI. After purification, cDNA was cloned into a pFLC-III vector.

*EST sequencing*—Plasmid DNA was isolated from 3,429 selected colonies with 96 TurboFilter Miniprep kits (Qiagen, Valencia, CA) and a Qiagen BioRobot 9600. Sequencing of 3,429 clones was carried out using ABI 3700 automated capillary DNA sequencers (Applied Biosystems, Republic of Korea). Sequencing was performed using the M13 primer (5'-TGTAAAACGACGGCCAGT-3') to evaluate the clones from the 5' end of the full length cDNA inserts.

*EST assembly and annotation*—The 3,429 raw read sequences were composed of singlets, contigs and some short repetitive sequences. Obtaining high quality sequences requires several steps; all of them integrated in a freely accessible web-interface named an EGassembler<sup>16,13</sup>. For an EST assembly, an EGassembler was used with the default analysis parameters. This bioinformatics pipeline begins with a sequence cleaning stage, removing low quality sequence stretches, followed by the detection and removal of repetitive elements. The resulting output was then searched and cleaned from the organelle sequences. The sequences not included in the clusters were classified in the assembled dataset.

The assembled unique transcripts were compared with the public databases using  $Blast2go^{17}$ , a sequence-based tool to assign GO terms and annotation, extracting them for each BLAST hit obtained by mapping the extant annotation associations. The GO terms for each of the three main categories (biological process, molecular function and cellular component) were obtained from sequence similarity using the application default parameters. From these annotations, the Group 2<sup>nd</sup> level and multilevel GO terms were based on the biological process, molecular function and cellular component. This annotation was simplified and focused on the plant related to the functional categories using the Plant GOslim.

Pathway assignment with KEGG—Pathway assignments were mapped according to the Kyoto Encyclopedia of Genes and Genomes (KEGG) database (http://www.genome.jp/kegg/pathway.html)<sup>18</sup>. Enzyme commission (EC) numbers were assigned to the unique sequences with BLASTX scores with an *E* value cut-off of  $10^{-10}$  after searching the KEGG protein databases. The unique sequences were mapped to the specific biochemical pathways according to the corresponding EC distribution in the KEGG database.

RNA extraction—For an expression study, Chinese cabbage (Brassica rapa 'SUN-3061') seeds were grown aseptically on half-strength MS agar medium in a culture room under a 16 h light photoperiod at 25 °C. After 3 weeks growth, the seedlings were transferred to fresh liquid MSH (half-strength MS medium without sucrose) medium containing 250 mM NaCl and 100 mM abscisic acid (ABA) for 24 h. To induce cold stress, the seedlings were maintained at 4 °C for 24 h. A drought treatment was applied by keeping the seedlings on the filter paper at 28 °C for 24 h. For water stress, plants were transferred to a dish containing water in submerged condition. The samples were treated with all stresses for 0 (wild type), 30 min, 1, 2, 4, 8 and 24. The samples were then frozen immediately in liquid nitrogen, and stored at -80 °C for RNA isolation. The total RNA was extracted from the frozen samples of the roots, stems, leaves and flower buds of healthy plants and those exposed to abiotic stress using a RNeasy mini kit (Qiagen, USA). RNA was treated with RNase-free DNase (Promega, USA) to remove the genomic DNA contamination.

RT-PCR analysis-RT-PCR was performed using an Avian Myeloblastosis Virus (AMV) one step RT-PCR kit (Takara, Japan). The gene specific primers for the stress responsive genes are listed in Supplementary data, Table S1. RT-PCR was performed using 50 ng cDNA of plants exposed to various abiotic stress, such as cold, salt drought, ABA, water, and PEG in different time intervals (0, 30 min, 1, 2, 4, 8, 24 h). In 0.5 mL PCR tubes, 20 pmol of each primer, 150 µM of each dNTP, 1.2 U of Taq polymerase, 1x Taq polymerase buffer, and double-distilled H<sub>2</sub>O to a total volume of 20 µL were added and mixed. The PCR procedure involved pre-denaturing at 94 °C for 5 min followed by 30 cycles of denaturation at 94 °C for 30 s, annealing at 58 °C for 30 s and extension at 72 °C for 45 s, and was terminated with additional extension for 5 min at 72 °C.

## **Results and Discussion**

Sequencing and assembly of ESTs—Full length cDNA library of B. rapa cv. Osome were constructed following the methods described by Sato et al.<sup>19</sup> and for that the plants were maintained in a growth chamber under normal conditions. Samples of leaves and stems were collected from five weeks old seedlings and flower buds were collected at flowering stage. These samples of three different organs were mixed for RNA isolation. A single-run partial sequencing of randomly selected cDNA clones was conducted and obtained 3,429 ESTs from this library<sup>20</sup>. With a view to identify stress related genes of Brassica, this annotation study was conducted based on gene ontology. After removing the repetitive sequence, short sequence and vector organelle sequence 3.284 ESTs were used for further analysis. The EGassembler online clustering pipeline provided 333 contigs and 2,446 singlets of ESTs giving a total of 3,284 unigenes (analysis preformed with default parameters) (Table 1). Sequences included in the contigs were similar, ranging from 9.7% for the EST library. This result revealed the detection of 0.05% reteroelements, 0.05% LTR elements, 0.02% TY1/Copia, 10.02% Gypsy/DIRS, 0.03% DNA transposons, and 0.03% MuDR-IS905 elements in these sequences. These elements have an important role in genome evolution in *Brassica* species<sup>21</sup>.

ESTs against public non-redundant databases—A homology based functional annotation assignment for the putative sequence was accomplished using BLASTX, queries against non-redundant databases. 3,284 ESTs were used to search for non redundant protein databases using BLASTX in the blast2go suite with parameters with an E-value of  $10^{-3}$  or below, a HSP cut-off of 33 and a maximum of 20 blast hits per sequence description tool<sup>17,22</sup>. The average result of BLASTX was 17 sequences per EST for 2,730 ESTs (83.13%). The remainder of the unique sequence 554 ESTs (16.8%) had no homology searches, which

Table 1—General clustering of B. rapa EST sequences				
Descriptive category	EST sequence	Sources		
Total ESTs sequenced	3,429	-		
Number of cluster sequence	3,284	EGassembler http://egassembler.hgc.jp/		
Number of contigs	333			
Number of singletons	2,446			
No blast hits	554			
Number of sequence with EC	1,197	Blast2go V.2.5.0 www.blast2go.com		
Number of pathway maps	124			
Number of Interpro annotation	17,266			

suggests that the little or no similarity was caused mostly by the UTR sequence, or it could be due to the presence of genes that remained unassigned in the genome annotation effort. The total blast hits was 42,716 (90.09%) from 47,413 sequences from the 29 species and another 4,637 (9.78%) sequences from other species of a non redundant database (Supplementary data, Table S2). All the plant species have been well studied and have more experimental data. The use of a homology based functional annotation of those species with the BLAST score is acceptable<sup>23</sup>.

Function analysis based on gene ontology—GO is used widely to simplify the annotation process, gene functional annotation and classification of functional genomics. GO describes the gene function using controlled vocabularies and hierarchy, including three major categories, namely molecular function, biological processes and cellular component<sup>24</sup>. The EST sequences were grouped in terms of the GO vocabularies belonging to only one combination of two, and all three vocabularies were organized in a Venn diagram. A total of EST sequences were classified into 1,986, 2,042 and 2,116 ESTs of Molecular Functoion (MF), Biological Process (BP) and Cellular Component (CC), respectively. In addition, 1,420, 1,608 and 168 ESTs were mapped under CC and BP, CC and MF, and MF and BP, respectively. 1,420 were annotated according to all GO sub-vocabularies (i.e. CC, BP, and MF) (Fig. 1). Plant-GOslim was used to screen the plant-specific GO vocabularies. A large number of unique sequences were grouped under the first category of MF with

nucleotide binding, structural molecule activity, RNA binding, transcription factor activity, etc. The second category included BP with subcategories, such as the response to stress, response to biotic stimulus, response to abiotic stimuli, protein modification process, catabolic process, and lipid metabolic process, etc. The third category included CC with the subcategories of plastid, plasma membrane, mitochondrion, cytosol, and vacuole, etc. The GO results relied on well annotated GO information of other plants. A large number of unique sequences from this study mapped to MF included nucleotide binding, structural molecule activity, RNA binding, and transcription factor activity. 255 ESTs of nucleotide binding have a significant representation in this category. These ESTs are related to the disease resistance, pathogenesis, hypersensitivity response (HR) and plant defense responses to diseases. The catalytic activities are more important for a cell to survive major metabolic changes while the plant is under biotic and abiotic stress<sup>25,26,23</sup>. The second most represented category was BP, which includes the unique sequences associated with metabolic process, cellular process, stimulus localization, cell growth and development process. The growth and development of plants were altered by the application of external stimuli<sup>27</sup>. Although the BP category has an abundance of responses to stress 462 (SR), abiotic stimulus 415 (ABS) and biotic stimulus 140 (BS) of ESTs, 255 ESTs were involved in ABS and SR. 74 ESTs were involved in SR and BS. One EST was involved in ABS and BS. 50 ESTs were involved in all three stresses (Fig. 2). On the CC category, there is a plastid, plasma membrane, mitochondrion, nucleus, cytosol, thylakoid and endoplasmic reticulum. In this category,



Fig. 1—Venn diagram of 3,284 ESTs dataset showing numbers annotated to a one a combination of two and all three GO vocabularies (MF: molecular function, CC: cellular component, BP: biological process)



Fig. 2—Venn diagram of 1,017 stress related ESTs dataset showing numbers of annotated, response to stress (SR), response to abiotic stimulus (ABS), and response to biotic stimulus (BS)

there is a significant representation of plastid 784 ESTs. The plastids are involved in nucleus communication, which appears to be of particular importance during plant stress responses. The plastid signals identified thus far can be linked to specific stress conditions<sup>28</sup>. These annotations can be used to identify the genes in a particular component of the plant cells, the elemental activities of a gene product at the molecular level and the operations of molecular events with a defined beginning and end, and are pertinent to the functioning of integrated living units, such as cells, tissues, organs and organisms. An overview of the groups of genes cataloged by the specific annotated GO terms is given as Supplementary data, Table S3.

KEGG based biochemical analysis-Biochemical analysis of the ESTs was performed using KEGG. KEGG was created from bioinformatics algorithms and is the most accessible database of the major biochemical pathways and represents five categories and 32 sub categories for plants<sup>18</sup>. All putative transcripts were subjected to a KEGG database query with the BLAST score to retrieve the KEGG enzyme codes and pathway maps. A collection of 1,197 ESTs were assigned enzyme commission (EC) numbers and had 124 unique mapping to the KEGG biochemical pathway. The KEGG profiles of the transcripts from B. rapa cv. Osome are listed in Supplementary data, Table S4 and the metabolism was the most represented category with 12 sub categories representing the total number of corresponding ESTs. Among these, only stress related ESTs corresponding to each sub category of the metabolism category were presented in the Table 2. According to the electronic annotation, approximately 560 stress related enzyme activities of these transcripts were captured. An overview of the metabolic processes

showed the highest transcripts (152) followed by carbohydrate metabolism (114)and energy metabolism (96) in the stress related genes. Under these sub categories, there are some pathways These ESTs have been clustered involved. according to the role in the respective pathways (Supplementary data, Table S5). In the cluster of glycolysis/glycogenesis 13 ESTs, of glyoxylate and dicarboxylate 36 ESTs, of carbon fixation and photosynthetic organism 47 ESTs were involved in the stress-related functions. Demonstrated direct involvement of the glycolysis/glycogenesis and glyoxylate and dicarboxylate metabolism in many biochemical adaptations of plant and non plant species to environmental stresses, such as drought, cold/freezing, osmotic stress and anoxia has been demonstrated<sup>29,30</sup>. In the energy metabolism, the mechanism of carbon fixation in photosynthetic organisms are involved in the efficient light harvesting mechanism, repression of cell growth, alteration in enzyme activity, increased respiration and accumulation of osmolytes and proteins and thereby increase stress tolerance<sup>31,32</sup>.

*KEGG orthology and protein domains*—To improve the theoretical evidence of the annotation, some data mining was performed from the biological databases. An alternative control vocabulary of biochemical for genes is KEGG orthology (KO). The use of the KOBAS (http://kobas.cbi.pku.edu.cn/program. inputForm.do?program=Annotate) bioinformatics pipeline assigned KOs of 83, 281 and 303 to 140 ESTs of BS, 415 ESTs of ABS and 462 ESTs of SR genes in that clusters, respectively. The use of these 83, 281 and 303 putative sequences was assigned to KOs, and 65.5% of the annotation was improved for the putative sequence. Interproscan was provided by EBI web service<sup>33</sup>. Based on the GO

Metabolism pathways	Stress related ESTs
Carbohydrate metabolism	114
Energy metabolism	96
Lipid metabolism	30
Nucleotide metabolism	21
Amino acid metabolism	52
Metabolism of other amino acids	32
Glycan biosynthesis and metabolism	2
Metabolism of cofactors and vitamins	12
Metabolism of terpenoids and polyketides	8
Biosynthesis of other secondary metabolites	16
Xenobiotics biodegradation and metabolism	29
Overview	152

Table 2-Stress related genes based on KEGG biochemical analysis

terms, the functional domains from a range of primary and secondary protein databases were obtained for ESTs using Blast2Go bioinformatics tool. Databases, including PFAM<sup>34</sup>, SMART<sup>35</sup>, GENE3d<sup>36</sup>, PROSITE<sup>37</sup>, PROFILE<sup>37</sup>, SUPERFAMILY<sup>38</sup>, SUPERFAMILY<sup>38</sup>, PANTHER<sup>39</sup>, PIR<sup>40</sup>, PRINTS<sup>41</sup> and TIGRFAMs<sup>42</sup>, TMHMM<sup>43</sup> and SINGNALP<sup>44</sup> were used to identify the trans-membrane regions and signaling part of the EST sequence. The total unique ids were 1,378 PFAM, 306 SMART, 1,100 GENE3d, 291 PROSITE, 402 PROFILE, 688 SUPERFAMILY, 1,971 PANTHER, 52 PIR, 235 PRINTS, and 87 TIGRFAMs. For the transmembrane regions, 1,342 TMHMM and 1,274 SINGNALP were found. Functional domains were identified for the genes involved in the response to stress Glyoxalase/bleomycin resistance protein/dioxygenase PF00903 (PFAM), NAC (Nascent polypeptideassociated complex) (PF01849), PDZ binding protein (PF10235)<sup>45-47</sup>. Using these merging results with the GO annotation, a mean of 12.2% totally augmented the functional annotations for the putative sequences.

*Expression analysis after abiotic stress treatments*—This study was extended to analyze the responses of stress-responsive ESTs against corresponding stresses as experimental evidence of such EST clustering and 18 ESTs were randomly selected from 415 abiotic stress-responsive ESTs

and sequenced as full length cDNA. In another study, 3 chitinase genes were identified from the 140 biotic stress-responsive ESTs and characterized their function against soft rot causing bacteria, Pectobacterium carotovorum subsp. carotovorum<sup>48</sup>. Here, the full length cDNA sequences were then blasted in the public database and found high homology with Arabidopsis thaliana. All these sequences were well annotated and relied on the abiotic stress related genes with a high percentage of identity, excluding SRG-11 (Table 3). In addition their expression was analyzed after applying cold, salt, drought, ABA, water and PEG stress treatments in Brassica rapa. Among these genes, 15 SRGs showed responsive expression against the abiotic stress factors applied in this study. The following genes were up-regulated from 0 h to 24 h: after cold SRG, 14, 24, 47, 52, 58, 65 and 71, after salt SRG 3, 24, 44 and 52, after drought SRG 3, 9, 14, 15, 24, 42, and 53, after ABA SRG 14, 42, 52 and 53, after water SRG 9, 11, 14, 28, 42, 44 and 53, and after PEG stress treatments, SRG 14, 24, 53 and 71 (Fig. 3). Other SRGs might be responsive to other stress factors and have different functional roles despite their expression in all time courses (unpublished data). Among these differentially expressed genes, SRG14, 42, 65 and 75 were observed in metabolic pathway which is regulated by drought stress<sup>49</sup>. SRG14 and 42 also accounted in ascorbate and aldarate metabolism

Table 5—Sequence comparison of suess related genes with Arabiaopsis manana				
Gene	Top matched gene to A. thaliana	Identity (%)	Seq. description of A. thaliana	
SRG-3	AT3G03270	90	universal stress protein family protein	
SRG -9	AT3G09870	83	auxin-responsive family protein	
SRG -11	AT5G53820	90	unknown protein	
SRG -14	AT1G76160	86	copper ion binding	
SRG -15	AT1G05180	90	auxin resistant 1	
SRG -19	AT1G13450	87	DNA binding protein GT-1	
SRG -24	AT5G15970	83	KIN2, COR6.6	
SRG -27	AT1G30360	82	early-responsive to dehydration 4	
SRG -28	AT2G47710	88	universal stress protein (USP) family protein	
SRG -42	AT1G55570	80	copper ion binding /oxidoreductase	
SRG -44	AT1G06040	88	salt tolerance	
SRG -47	AT5G12020	86	HSP17.6II class II (heat shock protein)	
SRG -52	AT1G78240	87	TSD2 (tumorous shoot development 2)	
SRG -53	AT5G39730	84	avirulence-responsive protein-related	
SRG -58	AT1G29420	85	response to auxin stimulus	
SRG -65	AT3G30775	87	proline dehydrogenase	
SRG -71	AT1G30360	82	early-responsive to dehydration 4	
SRG -75	AT1G13280	85	allene oxide cyclase 4	

Table 3-Sequence comparison of stress related genes with Arabidopsis thaliana



Fig. 3—RT-PCR analysis of stress related genes (SRG). Total RNA was isolated from 3 weeks old plants and treated under different stress condition (A) ABA, (B) salt, (C) PEG, (D) Cold, (E) water and (F) drought for different time courses from 0 m to 24 h (0m as wild type, m: minute, h: hour)

pathway which is regulated by UV-radiation and sulphur di oxide stress<sup>50,51</sup>. *SRG65* also accounted in arginine and proline metabolism and biosynthesis of secondary metabolites. These pathways were commonly regulated by environmental and biotic stress<sup>52,53</sup>. *SRG75* also involved in alpha-linolenic acid metabolism and biosynthesis of plant hormones pathways were regulate by temperature effects and plant growth and development<sup>54,55</sup>. This information provided here is the important to better understand the molecular mechanism involved in abiotic stresses. Other differentially expressed genes may be involved in other defense related pathways which require further study. These results showed that the ESTs were well clustered by such EST analysis.

Overall, the EST dataset provides significant resources for discovering the potential genes of interest and suggests a possible way to characterize them.

# Supplementary data

Supplementary data (Tables S1–S5) associated with this article may be obtained from the correspondent author on request.

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