



# Comparative transcriptome analysis to identify putative genes related to trichome development in *Ocimum* species

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## Abstract

Genus *Ocimum* is known to have species possessing important therapeutic essential oil. The major phytoconstituents of essential oil in *Ocimum* species are phenylpropanoids and terpenoids. The essential oil is accumulated in the trichomes; the specialized structures predominantly found on leaves and other tissues. The development of trichome is integrated with development of plant and leaf and also tightly coordinated with the primary and secondary metabolic pathways producing essential oil constituents. In continuation to our studies on elucidating/understanding the mechanism of biosynthesis of essential oil pathways in *Ocimum* species, we have performed comparative transcriptome analysis to investigate the role of trichome-related gene expression in the regulation of biosynthetic pathways of essential oil. The essential oil biogenesis is tightly integrated with primary metabolic activities, the analysis for the expression pattern of genes related to primary metabolism and its relationship with secondary metabolism was evaluated in comparative manner. Physiological parameters in relation to primary metabolism such as photosynthetic pigment content, soluble sugar content, and invertase enzymes along with morphological parameters were analysed in *O. basilicum* and *O. sanctum*. Differential expression profiling uncovered about 8116 and 2810 differentially expressed transcripts in *O. basilicum* and *O. sanctum*, respectively. Enrichment of differentially expressed genes were analysed in relation to metabolic pathways, primary metabolism and secondary metabolism. Trichome related genes identified from the *Ocimum* species *vis-à-vis* their expression profiles suggested higher expression in *O. basilicum*. The findings in this study provide interesting insights into the role of trichome-related transcripts in relation to essential oil content in *Ocimum* species. The study is valuable as this is the first study on revealing the transcripts and their role in trichome development and essential oil biogenesis in two major species of *Ocimum*.

**Keywords** Comparative transcriptomics · *Ocimum* · Trichome · Essential oil · Terpenoids · Tulsi · Phenylpropanoids

## Abbreviations

Ob *O. basilicum*

Os *O. sanctum*

CPC Caprice

ETC1 Enhancer of TRY and CPC1

ETC2 Enhancer of TRY and CPC2

ETC3 Enhancer of TRY and CPC3

GIS Glabrous inflorescence stems

GIS2 Glabrous inflorescence stems2

GL1 Glabrous1

GL2 Glabra2

GL3 Glabra3

SPL3 Squamosa promoter binding protein Like3

TCL1 Trichomeless1

TCL2 Trichomeless2

TRY Triptychon

TT8 Transparent testa8

UPL3 Ubiquitin protein ligase3

ZFP Zinc finger protein

KEGG Kyoto encyclopedia of genes and genomes

B2G Blast2Go

BLAST Basic local alignment search tool

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## Introduction

*Ocimum* genus is highly diverse and comprises of more than 60 species [1]. The genus is distributed all over the Asian and African sub-continent, with intra and inter-specific genetic diversity [2]. Amongst these, *Ocimum basilicum* and *Ocimum sanctum* are extensively used for specialized secondary metabolites found in their essential oils in medicinal and aroma industries. Recent efforts on plant metabolites are majorly focused on defining the metabolic pathways for the synthesis of secondary metabolites in cells. Pathways are classified on the basis of origin and function as primary metabolic pathways and, secondary metabolic pathways. Primary metabolic processes and pathways are largely responsible for the survival of plants and provide “C” flux for the secondary metabolic pathways [3]. On the other hand, secondary metabolites are reported to have important ecological, developmental and defense related functions [4]. Metabolites derived from secondary metabolic pathways include fragrances, pesticides, flavours, food additives, dyes, pigments etc, with applications in pharmaceuticals, agriculture and industrial products for plant defense, pollination etc. [2, 5, 6]. Secondary metabolites are classified into major chemical classes of flavonoids, phenolics, alkaloids, terpenoids and phenylpropanoids [6].

The secondary metabolites in *Ocimum* sp. are majorly documented from essential oil. The essential oil is sequestered in the characteristic anatomical structures known as glandular trichomes. Trichomes are epidermal outgrowths having specialized cells that have ability to secrete or store considerable quantities of specialized metabolites [7, 8]. *Ocimum* essential oils are reported to be widely used such as in treatment of stress, fever, cough relieving, arthritis, nervous disorders, and allergies, etc. [9, 10]. Due to these medicinal properties the market share of *Ocimum* oil is growing at an increasing pace. The essential oil of *Ocimum* species contains phenylpropanoids and terpenoids as major components of essential oils attributing specific functions for medicinal and aroma purposes. The diversity of *Ocimum* species studied by various groups at molecular and morphological levels [10, 11] however the mechanism and the factors responsible for variation in essential oil content and components are limited. Though some recent reports from our lab as well as from others have attempted to understand the regulation of essential oil accumulation [6, 11, 12, 33]. The *Ocimum* species differ distinctly in their composition such as in sesquiterpenoids, monoterpenoids as well as in phenylpropanoids based constituents in *O. basilicum* and in *O. sanctum* [6]. This observation prompted us to investigate transcriptomes of both the *Ocimum* species for transcripts responsible for essential

oil sequestration in trichomes, the secretory glands. Transcription factor families such as R2R3MYB, bHLH, and C2H2 etc. have been shown to act as major regulators in the regulation of genes responsible for trichome development [13–15]. The transcription factors such as WRKY and AP2 have been associated with the secondary metabolite pathways in medicinal plants [16]. Expression of trichome related genes such as glabrous, caprice, enhancer of triptychon and transparent testa in coherence to each other influences the development, clustering, and density of the trichomes [17, 18].

Recent developments in the NGS technology platforms have facilitated the generation of huge transcriptomic resources. Platforms related to NGS have also created the opportunity to draw comparative profiles using the transcriptome data. The increased number of publications related to the comparative transcriptome studies, manifest its utilization in the investigation of pathways, gene mining, pathway networks and interaction studies [19–23].

Transcriptome analysis provides useful information regarding all major pathways in *Ocimum*. In the present study, transcriptome analysis is conducted to understand the variation in relation to trichome development related genes, which may be associated with the development of trichomes, sequestration of essential oil content and regulation of composition. To the best of our knowledge, the present work is first effort in the identification and investigation of trichomes related gene profiling in *Ocimum* species in relation to metabolic pathways. The findings of the present work will provide guidelines for future research directions in the understanding of the molecular regulation of trichome development and essential oil sequestration.

## Results

### Assembly of reads

The data of *Ocimum sanctum* and *Ocimum basilicum* transcriptomes was analysed from the SRA (<https://www.ncbi.nlm.nih.gov/sra/>). *O. basilicum* data with > 18 million reads (13.5 Gb) and *O. sanctum* data with > 16 million reads (12.2 Gb) was analysed and presented in Table 1. After initial adapter removal and filtering of raw reads, data was re-assembled using CLC genomics workbench 8.2 (<https://digitalinsights.qiagen.com>). The distribution of assembled transcripts was assessed in between 200 and 5000 bases. After proper assembling of the transcripts by taking optimum L50 values, average transcript lengths ranged from 1363 to 1964 bp for *O. basilicum* and *O. sanctum*, respectively.

**Table 1** Statistical presentation of transcriptomes

	<i>O. basilicum</i>	<i>O. sanctum</i>
Data	13.5 Gb	12.2 Gb
Number of reads	> 18 million	> 16 million
After assembly data	181 Mb	118 Mb
L50 (bp)	11	13
Mapped reads	51,604	52,152
KEGG pathway mapped	152	154
Total enzymes for KEGG pathways mapped	865	922
No. of DE transcripts	8116	2810
KOBAS annotation (DE%)	77.9	74.9
No. of KEGG terms for DE	10	16
No. of GO terms for DE	69	40

### Re-annotation of the transcriptomes

Comprehensive analyses of the *O. basilicum* and *O. sanctum* transcriptomes were carried out and assembled transcripts were annotated by using different bioinformatics tools, softwares and online web servers. On annotation by Blast2Go (B2G), it became clear that approximately 121,797 (85.06%) of transcripts were significantly annotated in *O. basilicum* while 65,851 (87.66%) transcripts were annotated in case of *O. sanctum* in comparison to previously published report [33]. Distributions of data were depicted for transcripts at various steps of assignment in *O. basilicum* and *O. sanctum* transcriptomes (Fig. 1a). Mapping of sequences, validated the evidence code which provides functional terms and information about the annotations either derived from automatic/computational or manually curated ones. *O. basilicum* and *O. sanctum* transcriptomes showed maximum curation with IEA (Inferred from electronic annotation) while second annotation were to IBA (Inferred from biological aspects of ancestor) and likewise from IDA (Inferred from direct assay), ISS (Inferred from sequence or structural similarity), ISM (Inferred from sequence model) etc. Mapping with the database source Ensembl Plants (63,942 & 85,434), ensembl (1867 & 3833), and Uniprot (1,080,118 & 1,541,565) etc, GO annotations were retrieved, for *O. basilicum* and *O. sanctum*, respectively. 51,604 transcripts of *O. basilicum* and 52,152 transcripts of *O. sanctum* were mapped for the GO terms (Table 1).

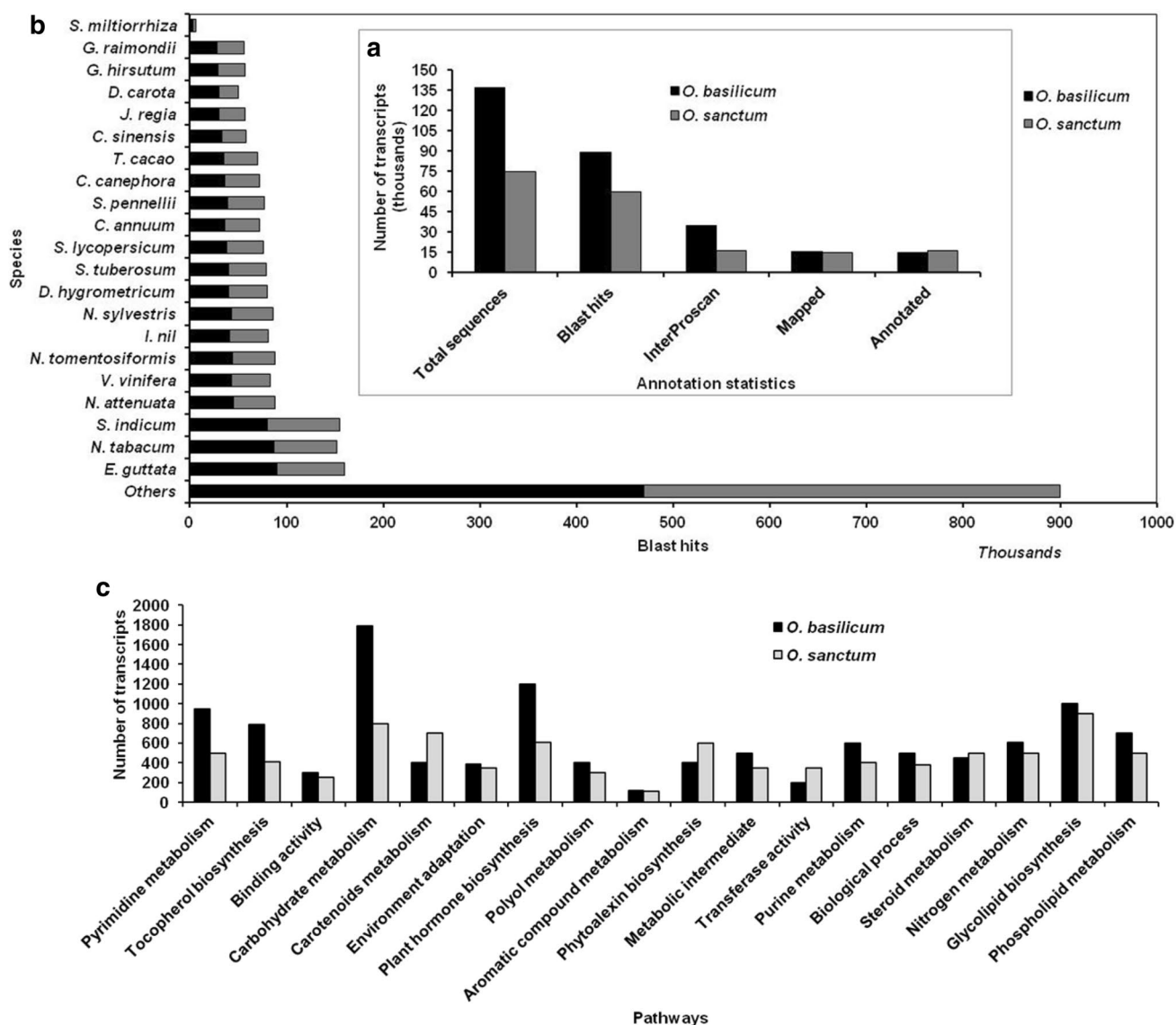
On blastx with Uniprot and non-redundant database, transcripts from *O. basilicum* showed maximum hits with *Erythranthe guttata* (> 90,000 hits), followed by *Sesamum indicum* (> 70,000 hits), *Nicotiana tabacum* (> 60,000 hits) and *Salvia miltiorrhiza* etc. Likewise, transcripts from *O. sanctum* showed maximum hits against the *Sesamum indicum* (> 90,000 hits), followed by *Erythranthe guttata* (> 70,000 hits), *Nicotiana tabacum* (> 60,000 hits)

and *Salvia miltiorrhiza* etc. maximum hits were with the order lamiales (Fig. 1b).

### Global and secondary metabolism pathway analysis

To get the details of the genes with respect to the primary metabolism of the plant, standalone version of blast is used for identification of mined transcripts from the transcriptome. To establish the relation amongst global pathways (primary metabolism) and specialized pathways (secondary metabolism), *in silico* transcriptome screening was performed by isolating and mapping the transcripts for global and secondary metabolic pathways. Transcripts related to metabolism, degradation, synthesis, translation etc. were identified. Abundance of transcripts was more for *O. sanctum* as compared to *O. basilicum* for the pathways taken into consideration (Fig. 1c). In *O. basilicum* 1177 transcripts were assigned to the primary metabolic pathways and 3653 transcripts assigned from *O. sanctum* were assigned to the primary metabolic pathways. Total 89 transcripts related to photosynthesis were found in *O. basilicum* and 92 in *O. sanctum*. Likewise, Krebs's cycle, sucrose metabolism, lipid metabolism and signal transduction related transcripts were found to be abundant in *O. sanctum*. FPKM values were calculated to get an idea of the up/down regulation of primary and secondary metabolic pathways in both the *Ocimum* species (Fig. 2a, b). There were considerable differences in expression of transcripts, pathway genes related to the glycolysis & glycogenesis, transport and signal transduction were up regulated in *O. basilicum*. While genes related to photosynthesis, starch and sucrose metabolism were relatively upregulated in *O. sanctum* (Fig. 2a). Similarly, FPKM values indicate transcripts related to pathway of monoterpenoids, diterpenoids, flavonoids, and isoquinoline alkaloids were upregulated in *O. basilicum*, and sesquiterpenoids/triterpenoids were upregulated in *O. sanctum* transcriptome, respectively (Fig. 2b).

KEGG based classification showed transcripts mapping with metabolic pathways (KO1100), biosynthesis of secondary metabolites (KO1110), carbon metabolism (KO1200), fatty acid metabolism (KO01212), biosynthesis of amino acids (01230), 2-oxocarboxylic acid metabolism (01210) etc. Mapping with the KEGG pathway database retrieved 154 and 152 pathways for *O. sanctum* and *O. basilicum* respectively (Table 1). Major global pathways showed 8025 & 6038 transcripts in KEGG pathway with only 851 (10.95%) and 661 (10.60%) enzymes identified for the *O. basilicum* and *O. sanctum*. Likewise, biosynthesis of secondary metabolism retrieved 1524 and 1357 transcripts with 340 and 289 EC assigned for each pathway (Table 2).

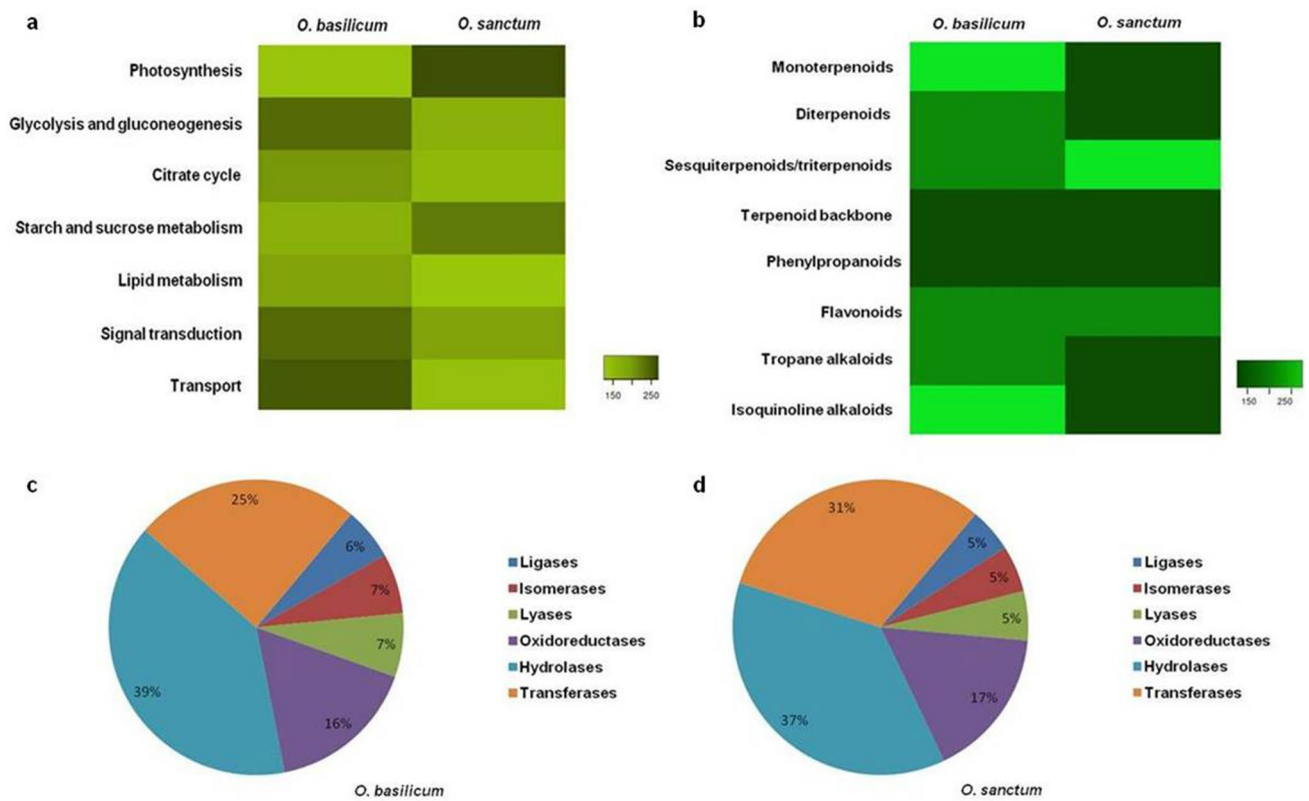


**Fig. 1** a Distribution of transcripts from several plant species as per annotation analysis. b Homology search of transcripts to the nr database. c Comparative assignment of transcripts related to the various metabolic processes

## Enzymatic classification of the transcripts in *Ocimum* species

In order to understand the enzyme distribution in *Ocimum* species, a comprehensive analysis was conducted for the major classes of the enzymes. Transcript's distribution against six categories of enzymes such as transferases, oxido-reductases, hydrolases, lyases, ligases and isomerases were retrieved. Results revealed that more than > 16,000 transcripts were assigned to the different enzyme classes with maximum being the 6295 for hydrolases and 5513 for transferases in *O. sanctum*, whereas relatively less number of transcripts were observed for these two classes in *O. basilicum*. Both *O. basilicum* and *O.*

*sanctum* showed maximum hits with the hydrolases followed by the transferases (Fig. 2c). In hydrolases group, enzymes acting on ester bonds accounted for 348 transcripts in *O. basilicum* and 320 transcripts in *O. sanctum*, respectively. Esters considered as the phytochemicals responsible for the mild aroma for which maximum number of transcripts were assigned to the *O. basilicum* and relatively less to the *O. sanctum*. Within transferases maximum numbers of transcripts were assigned to transferring phosphorus groups approximately 733 sequences, followed by glycosyltransferases and acyltransferases. Oxidoreductases account for approximately 2500 transcripts followed by lyases, isomerases and ligases, in both the *Ocimum* species. Total 865 enzyme Ids were assigned to *O. basilicum*



**Fig. 2** In-depth FPKM based transcripts profiling of pathways. **a** Primary metabolic pathways. **b** Secondary metabolic pathways. **c, d** Assignment of *O. basilicum* and *O. sanctum* transcripts for different classes of enzymes

**Table 2** Global and KEGG pathway mapping of *Ocimum* species

KEGG pathways	Reference KEGG pathway number (KO)		Transcripts in each KEGG pathway		Percent of identified genes in each KEGG pathway	
	Ob	Os	Ob	Os	Ob	Os
Global metabolism	01100	01100	8025	6038	10.60	10.95
Biosynthesis of secondary metabolites	01110	01110	1524	1357	22.31	21.29
Carbon metabolism	01200	01200	396	799	20.20	28.78
Fatty acid metabolism	01212	01212	233	153	10.30	44.44
Biosynthesis of amino acids	01230	01230	985	1050	29.44	20.28
2-Oxocarboxylic acid metabolism	01210	01210	101	170	32.67	32.35
Terpenoid biosynthesis	00900	00900	281	350	22.77	28.86

\*Ob = *O. basilicum*, Os = *O. sanctum*

sequences and 922 enzyme Ids to *O. sanctum* after KEGG classification (Table 1).

### Differential gene expression

Mapping of *O. basilicum* and *O. sanctum* transcriptomes examine the expression differences in the form of transcriptome abundance estimation. Satisfying  $\log_{2}FC \geq 2$  and  $FDR \leq 0.001$ , corrected P-value calculated by

Benjamin-Hochberg procedure, a total of 8116 and 2810 DE (Differentially expressed) transcripts were observed (Table 1). In both the species, differential expression was high in *O. basilicum*.

### Functional enrichment analysis of DE transcripts

Enrichment of GO terms and KEGG was conducted using KOBAS server to explore the biological functions of the



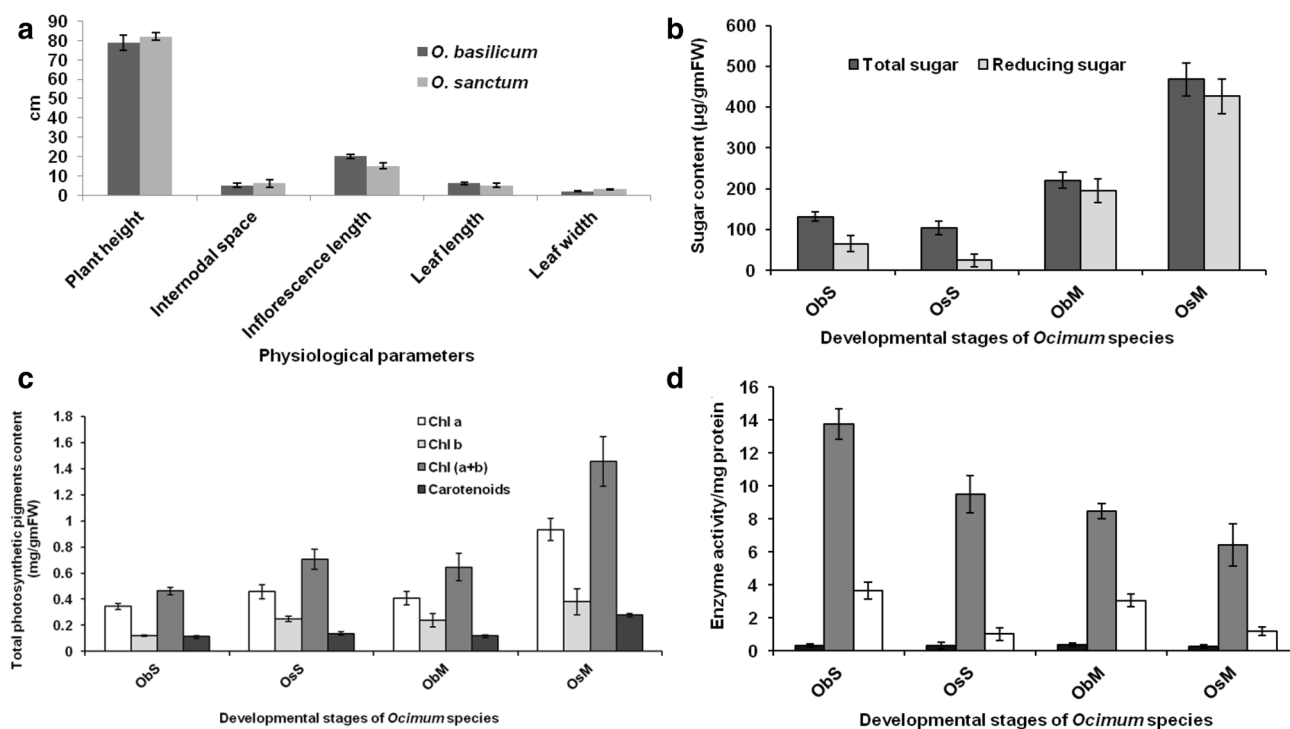
DE transcripts. In the two-way comparison 77.9% (6330 of 8116) and 74.9% (2107 of 2810) in *O. basilicum* and *O. sanctum* respectively, transcripts were functionally annotated. Significant correlations were found for the 10 and 16 KEGG terms and 69 and 40 GO terms, for the *O. basilicum* and *O. sanctum* respectively (Table 1). For *O. basilicum* enriched KEGG terms were for metabolic pathways, biosynthesis of secondary metabolites, biosynthesis of amino acids, amino sugar and nucleotide sugar metabolism, biosynthesis of antibiotics, carbon metabolism, pentose phosphate pathway, porphyrin and chlorophyll metabolism, and in *O. sanctum* they were metabolic pathways, biosynthesis of antibiotics, biosynthesis of secondary metabolites, biosynthesis of amino acids, carbon metabolism, citrate cycle (TCA cycle), cysteine and methionine metabolism, fatty acid metabolism, biosynthesis of unsaturated fatty acids, ubiquitin mediated proteolysis, 2-oxocarboxylic acid metabolism, fatty acid biosynthesis, amino sugar and nucleotide sugar metabolism, lipoic acid metabolism, steroid biosynthesis and glyoxylate and dicarboxylate metabolism. For GO terms enrichment, maximum terms were placed in biological process category (32 & 18), followed by molecular function (20 & 15) and cellular component (17 & 7) for *O. sanctum* and *O. basilicum* respectively (Supplementary table 1). Network of the

enriched terms on the basis of biological process predicted for the *Ocimum* species (Supplementary Fig. 1). Statistical validation of enrichment analysis of DE transcripts on the basis of P-value was also carried out.

### Physiological studies in different developmental stages of *O. basilicum* and *O. sanctum*

Key physiological parameters (such as plant height, leaf length/width, internodal space, and inflorescence length of the mature plants) were measured to study the basic physiological nature of the species. Plant height was found to be more in *O. sanctum* as compared to *O. basilicum* plants by 1.5 folds (Fig. 3a), remaining parameters such as inflorescence length and leaf length were recorded higher by 1.5–6.0 folds in *O. basilicum* as compared to *O. sanctum*. Total photosynthetic pigments content analysis in *O. basilicum* and *O. sanctum* at different developmental stages showed higher Chl a, Chl b, Chl (a + b) and carotenoid in mature plants of both species by 1.20–3.14 folds relative to seedlings. Further, these components were higher in *O. sanctum* in comparison to *O. basilicum* (Fig. 3c).

Comparative analysis of sugar metabolism in different developmental stages of both *Ocimum* species showed



**Fig. 3** Physiological studies during developmental stages of *Ocimum basilicum* and *O. sanctum*. **a** Physiological parameters of the glass house-grown seedling plants of *Ocimum* species. **b** Total sugar and reducing sugar content in seedling and mature tissues of *Ocimum* species. **c** Total photosynthetic pigment content in *Ocimum* developmen-

tal stages. **d** Estimation of acid (grey), alkaline (black) and neutral (white) Invertase enzyme activity of *Ocimum* species; Ob = *O. basilicum*; Os = *O. sanctum*, *O. basilicum* seedling (ObS), *O. basilicum* mature (ObM), *O. sanctum* seedling (OsS) and *O. sanctum* mature (OsM)

significant variance in total sugars, reducing sugars and invertase enzyme activity. Total sugar content was higher by 1.25 folds in *O. basilicum* seedling as compared to *O. sanctum* seedling while in case of mature plants, *O. sanctum* showed higher sugar content by 2.12 folds than *O. basilicum*. *O. basilicum* seedling showed comparatively higher total reducing sugars (0.37 folds) than *O. sanctum* seedling. On comparison of *O. basilicum* mature with the *O. sanctum* mature, for reducing sugar levels latter exhibited 2.18 folds increased levels (Fig. 3b). Invertase enzyme activity was found maximum in acidic medium followed by neutral and alkali medium. Comparatively invertase activity was higher (approximately 1.5 folds) in *O. basilicum* seedlings as well as mature plants in comparison to *O. sanctum* (Fig. 3d).

Comparative analysis of essential oil yield showed distinct variation (0.10%–0.54%) in *O. basilicum* and *O. sanctum* at seedling and mature stage of plants (Supplementary Fig. 2).

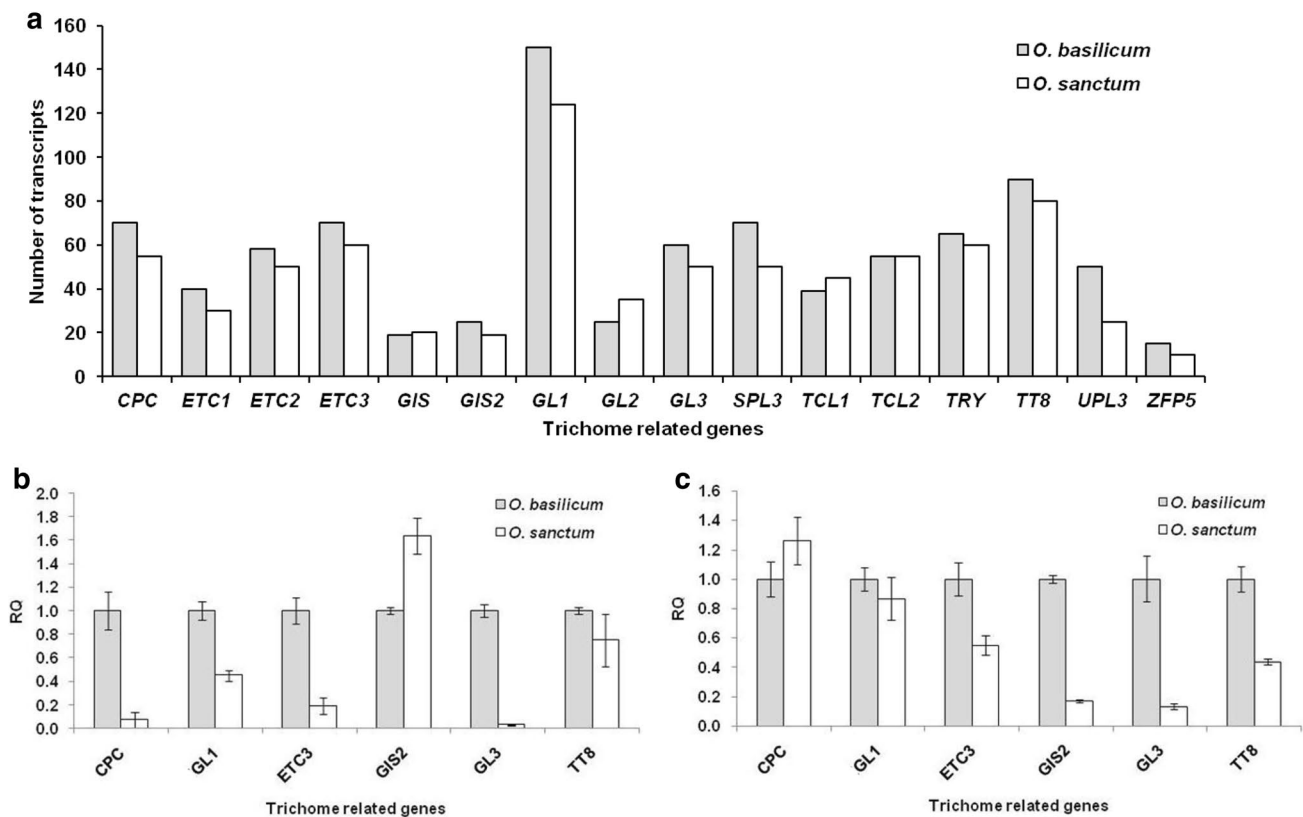
### Genes related to trichome development

Trichomes on the leaf surfaces are thought to be morphological characteristic that are involved in essential oil sequestration in *Ocimum* species. Trichomes play crucial role for the

differential essential oil components in *O. basilicum* and *O. sanctum*. Transcriptomes of *O. basilicum* and *O. sanctum* were searched for the list of descriptions as for *A. thaliana* genes, approximately 120 genes are responsible for the trichome development [23]. BLASTx analysis of these genes showed 2087 transcripts matching in *O. basilicum* and 1333 in *O. sanctum* transcriptomes (Fig. 4a). 16 genes related to trichome development were identified, maximum number of transcripts were annotated for GLABROUS1 (GL1), and less transcripts annotated for Zinc finger protein 5 (ZFP5) in both the *Ocimum* species.

### Real time quantification analysis of genes related to trichome development

Six genes out of 16 were chosen for the relative quantification analysis; GIS2 was only gene which showed higher expression in seedlings stage of *O. sanctum* (Fig. 4b). CPC, GL1, ETC3, GL3 and, TT8 were relatively higher expressed in *O. basilicum* seedling as well as mature stages of plant development. CPC gene showed higher expression in *O. basilicum* seedlings (Fig. 4b), while it showed higher expression in case of *O. sanctum* mature plants (Fig. 4c). Mapping of genes related to trichome against the KEGG database was



**Fig. 4** Expression analysis of trichome related genes in *O. basilicum* and *O. sanctum*; **a** Transcript abundance and Real-time expression analysis in developmental stages of *Ocimum* species, **b** seedlings, **c** mature

also conducted (Supplementary Table 2). Majority of the genes isolated were unregulated according to FPKM values in *O. basilicum* and *O. sanctum*.

## Discussion

A co-ordination of a number of processes controlling the partitioning of plant primary and secondary metabolisms, such as photosynthesis, TCA cycle, glycolysis, transport and terpenoid (mono/sesqui/tri), phenylpropanoid metabolism remains unclear. Release of CO<sub>2</sub> is closely connected to the metabolic branching of the primary and secondary metabolism. Pyruvate acts as a substrate for various secondary metabolism pathways, despite being the major metabolite of the primary pathways [24–27]. Here, analysis of *O. basilicum* and *O. sanctum* transcriptome data and enrichment analysis of differential genes provided a broad distribution pattern of various transcripts belonging to different metabolic pathways either be primary or secondary metabolic pathways [6, 27].

### Re-assembly and Re-annotation of transcriptomes for intra-species comparison

Previous studies have compared the transcriptomes of plants to date for the identification of expression pattern of genes, either across treatments [22, 23, 28, 29] or across single species ecotypes [27]. Due to the advent of the genomic resources and high throughput bioinformatics tools, comparative analyses of distant species transcriptome became possible [28]. Comparisons of species of same genus are rare, and they either use transcriptomic or genomic data of one of the species as a reference or of a related species [30, 31]. The following study re-analysed, re-assembled and re-annotated the transcriptomes of medicinally important species *O. basilicum* and *O. sanctum*. Earlier attempts for gene mining from the already reported transcriptomes have provided deeper insights into the pathway assignment, mapping, and gene discovery [16, 19, 21, 32]. Thus, this approach was useful in profiling novel aspects of secondary metabolism in MAPs [33, 16, 19, 23]. As genome of *O. sanctum* is available in the public domain and utilized in the study as the reference for making the genes full length. The genome of *O. basilicum* was merely used in this study as substrate to overlap the reads and assemble i.e. genome guided assembly [34]. The study uses the transcriptomes from the public domain and utilizes them as base for the mining of the genes related to the trichome development. A comprehensive comparative profile of the transcriptome of *O. basilicum* and *O. sanctum* were made, which provided high depth, quality and coverage. *O. basilicum* transcriptome accounted for more number of transcripts relative to *O. sanctum*. Only 12

and 9 sequences were left without analysis in case of *O. basilicum* and *O. sanctum* respectively. Assembly and annotated transcripts for nearly all the pathway genes of primary metabolic pathways and secondary metabolic pathways were obtained. The assembled transcripts were aligned with the protein sequences from the UniProt KB viridiplantae and mRNA sequences available for the different plant species at the nr database, which annotated the maximum transcripts and helped in isoform prediction. Maximum blast hits were obtained for the *O. sanctum* relative to *O. basilicum* when subjected to homology search with the plant databases. Annotation with uniprot database provided maximum hits with order lamiales, while significant hits were also observed with the member plants of family solanaceae, which may be due to the presence of large amount of data for the plants of this family in the databases. Evidence code distribution gives an idea about how many annotations were derived from automatic/computational annotations or from manually curated ones. Data curation showed that the transcripts from *O. basilicum* and *O. sanctum* were maximal aligned to the electronic annotation followed by the biological aspects. *Ocimum* species are known for their remarkable medicinal and aromatic properties [6, 10, 12], due to the presence of a varied mix of different metabolites. As an expansion of the previous study, In current work the global metabolism and secondary metabolism related pathways were analysed for *O. basilicum* and *O. sanctum* in comparative manner. Primary metabolites are linked to the secondary metabolites or it can be illustrated as majority of secondary metabolic pathways uses the product of primary metabolic pathways as their substrates [30, 34]. It was observed that photosynthesis, starch and signal transduction genes were showing more expression in *O. sanctum* relative to *O. basilicum* may be accounting for more metabolic activity in the former. High level of expression by glycolysis in *O. basilicum* may also imply to stress management. These results were in accordance to the previous studies on plants for regulation of genes involved in photosynthesis and chlorophyll biosynthesis [35, 36]. Further, more expression of pathway genes related to monoterpene, diterpene and flavonoid in *O. basilicum* relative to *O. sanctum*, may be leading to products of these pathways in former plant species. As revealed by our group previously that *O. basilicum* is phenylpropanoid rich species while sesquiterpenoids were found more in *O. sanctum* [6, 12, 13].

On enzyme classification basis, maximum numbers of transcripts were coded for hydrolases followed by transferases, and oxidoreductases in both the *Ocimum* species. More number of transferases in *O. sanctum* may be responsible for the formation of diverse and derivatives of metabolites including volatile esters [37–39]. Transferases are class of enzymes that enact the transfer of functional group from one molecule to another [38]. It has been



shown in earlier studies that *O. sanctum* essential oil pool comprises higher diversity of metabolites as compared to *O. basilicum* [6, 12]. Likewise, transcripts for hydrolases, oxidoreductases, isomerases, and ligases were more abundant in *O. sanctum*. This may be due to some specific functions, which further require in-depth investigation to explore their specific roles. The GO ontology repository was used for assigning the molecular function, biological role, and cellular component of the large number of genes [31]. Significant enhancement in annotated data was done by merging the annotations with interproscan analysis results. Maximum numbers of transcripts were assigned to the molecular function as shown by the GO assignments followed by the biological process and cellular component.

In the functional analysis of DE transcripts between the two parental species, up-regulated transcripts in the transcriptome of *O. sanctum* were enriched with more number of pathway functions associated with biosynthesis and metabolism (i.e. ‘Citrate cycle’, ‘cysteine and methionine’, ‘fatty acid’, ‘unsaturated fatty acids’, ‘proteolysis’ and ‘2-oxocarboxylic acid’) than *O. basilicum*. This may explain the better production of secondary metabolites, and better divergence of primary carbon flux to the secondary metabolism pathways. Network linking the primary metabolite pathway with the secondary metabolite were predicted with the help of enriched genes, which showed the interdependence of these pathways. We note, however, that up-regulated genes do not necessarily confer better performance or better production of secondary metabolites, and the true implications could only be established through future functional studies. Similar kind of differential expression studies on transcriptome are also conducted in the recent past [21, 40].

The primary metabolic pathways being basic pathways provided the ‘C’ source and energy to the plants for plant growth and development. Validation of the findings with the estimation of total photosynthetic content of *Ocimum* at different developmental stages showed that the *O. basilicum* exhibited lower chlorophyll content and carotenoids. In fact analyses at seedling stage of *O. sanctum* showed more amounts of photosynthetic pigments as to that of mature *O. basilicum*. Further to confirm, photosynthetic rate was also estimated of the leaf which was found decreased in case of *O. basilicum* seedlings and mature stage plants. Thus, *O. basilicum* exhibited elevated levels of primary metabolic and expectedly secondary metabolic expression as compared to *O. sanctum*. Such correlations were previously shown for plants possessing secondary metabolites [41, 42]. Various studies are conducted in medicinally important plants as well as *Arabidopsis* to show the effect of chemical stimulants on primary and secondary metabolic pathways [30, 34].

## Trichome development in *O. basilicum* and *O. sanctum*

Glandular trichomes are specialized structures or epidermal outgrowths with secretary head made of cells to store and sequester large quantities of volatile metabolites [6, 43]. To understand the relationship between essential oil content and trichomes; the morphology, density, and size of trichomes were discussed earlier [6]. Glandular trichomes classified as peltate and capitate trichomes as two major types are implicated in the biogenesis and sequestering of essential oil though mechanism is yet to be established [6]. In the present study, the genes involved in trichome development were studied to get deeper understanding of essential oil biosynthesis in glandular trichomes. In *Ocimum* species, transcripts for R2R3MYB, R3MYB, bHLH, and C2H2 were predominantly detected and expression pattern suggested that many of the transcripts related to trichome development were expressed higher in *O. basilicum*. Recent studies on *A. thaliana* suggested that trichome development processes were controlled by transcription factors majorly including basic helix-loop helix (bHLH) one of the largest family with 160 members in *Arabidopsis* consisting of 12 sub-groups, and R2R3MYB with 25 sub-groups consisting of 126 members in *Arabidopsis* [44]. C2H2 zinc finger type transcription factors with 176 members in *Arabidopsis* were also involved in the trichome formation on the stems, flower, and inflorescence tissues [13, 14]. Genes controlled by R3MYB TFs were CPC, ETC1, and ETC3 [17], while GL3, EGL3, TT8, GL2, and GIS were controlled by bHLH TFs and GIS2 by C2H2 TFs [13, 45].

Higher number of transcripts in *O. basilicum* may be responsible for better trichome development in the particular species. Studies were further confirmed by the qRT-expression analysis of transcripts which exhibited relatively less expression of these genes in *O. sanctum*. Relative higher expression of trichome related genes may be responsible for the higher levels of essential oil in the *O. basilicum* relative to that of *O. sanctum*. Hence, the study suggested that the trichomes related genes may be responsible for the overall essential oil content in plants while the specific component in the essential oil depended on the secondary metabolic pathway genes as studied earlier [6, 10].

## Materials and methods

### Sampling and RNA extraction

*O. basilicum* and *O. sanctum* plants were grown in the greenhouse at Central Institute of Medicinal and Aromatic Plants CSIR, Lucknow, India, during which all plants showed normal growth. Seedlings were collected for analysis from each

plant after one month and mature plants after three months of sowing. Sample leaf tissue were collected and frozen in liquid N<sub>2</sub> and stored at –80 °C until RNA extraction. Total RNA was extracted using the CTAB method as describe earlier [6]. Integrity of isolated RNA was assessed using the agarose gel electrophoresis. Quality and quantity assessment of RNA was done using the nanodrop, before proceeding for the cDNA synthesis. All the reactions were carried out in triplicate consisting of cDNA (~100 ng), syber green master mix and gene specific primer (5 picomole). Following PCR conditions: initial denaturation at 95 °C for 2 min, followed by 40 cycles of denaturation at 95 °C for 15 s, and annealing at 60 °C for 30 s was utilized. The relative expression level of each selected gene was normalized with the actin gene and detected by the 2<sup>-ΔΔC<sub>t</sub></sup> method.

### Assembly and redundancy reduction

*O. basilicum* project code (PRJNA240352), and *O. sanctum* project code (PRJNA238293), data downloaded from NCBI repositories using the FTP client. CLC genomics work bench [46] was utilized for assembly of the data. For conducting the differential expression of the two species, *O. sanctum* was considered as the parent species. In order to carry out the comparative transcriptome study, the individual transcriptome of both species were assembled. Quality of the assembled transcripts was assessed using the full-length coding sequences with taking *O. sanctum* genome as the reference. To make full length BLASTx search made with the viridiplantae protein database, of Uniprot, Ensemble/Swissprot criteria was set as [e-value ≤ 1e-30, max\_target\_seqs = 1].

### Functional annotation and similarity search

Sequences assembled were subjected to the BLAST search with mRNA and protein sequences of different plant species (<https://www.ncbi.nlm.nih.gov/blast/cgi/>), of both the transcriptomes. These CLC assembled transcripts were analysed by various bioinformatics tools, for their effective assignment and functional analysis. Different modules of Blast2GO were followed to functionally annotate both transcriptomes. Annotated files of transcriptome of *O. basilicum* and *O. sanctum* were analysed separately for the secondary metabolic and global pathway analysis. KEGG analysis was performed in order to retrieve pathway maps, for each species. Parallel to this, the transcriptomes were also subjected to a local BLAST search against the previously isolated genes from the public databases for various pathways to make full length. Full-length pathway gene transcripts were assembled and mapped to respective genes submitted in non-redundant databases. Enzyme mapping was performed by the blast2go module for the

distribution of enzyme classes in the *Ocimum* species. The expressions of transcripts belonging to metabolic pathways were evaluated using the FPKM values for each transcript coding for specific gene as described earlier [33, 31].

### Differential expression and functional enrichment

To quantify the expression abundance of each transcript, the Blast2Go module was used, employing Kallisto [47] to generate normalized abundance estimates across transcripts of the both transcriptomes. To identify the differentially expressed (DE) transcripts, EdgeR was used, following the false discovery rate (FDR) of ≤ 0.001 and a log<sub>2</sub> fold-change (logFC) of ≥ 2 [48]. Microsoft excel was used to generate the heat maps for the DE transcripts and clustering was done using the heat mapper [49]. Differentially expressed genes were subjected to the *A. thaliana* and *O. sativa* to get the enriched Kyoto Encyclopedia of Genes and Genomes (KEGG) and Gene Ontology (GO) terms [e-value ≤ 1e-5], using the KOBAS server (<http://kobas.cbi.pku.edu.cn>). AmiGO ([amigo.geneontology.org](http://amigo.geneontology.org)) was used getting the GO terms definitions for the differentially expressed transcripts. Cytoscape (<https://cytoscape.org/>) was used for making the network plot of the DE transcripts.

### Identification of trichome related genes

To determine the molecular factors behind the variations in the trichomes of the *Ocimum* species, genes related to the trichome were isolated namely *caprice* (*CPC*), *enhancer of triptychon caprice* (*ETC*), *glabrous inflorescence stems* (*GIS*), *glabrous* (*GL*), *squamosa promoter binding like* (*SPL*), *trichomeless* (*TCL*), *triptychon* (*TRY*), *transparent testa* (*TT*), *ubiquitin-protein ligase* (*UPL*) and *zinc finger protein* (*ZFP*). First, *A. thaliana* TAIR10 proteins with functional descriptions were extracted from the database. Trichome related genes identified from the both the transcriptomes were then queried against these trichome-related protein sequences using BLASTx [e-value ≤ 1e-3], and significant matches were recorded.

### Estimation of total photosynthetic pigments content

Total photosynthetic pigments content such as total chlorophyll (Chl *a* & *b*), chlorophyll *a* (Chl *a*), chlorophyll *b* (Chl *b*), and carotenoids were estimated from fresh leaves of seedlings and mature plants of the both *Ocimum* species using earlier reported method [26].

## Estimation of total sugar, reducing sugar, and invertase enzyme activity

Sugar level and invertase enzyme activity were estimated in seedlings and mature plants of both *Ocimum* species as reported earlier [39].

## Conclusions

In the present work, comparative study of transcriptomes of *O. basilicum* and *O. sanctum* was performed with respect to overall global metabolic pathways as well as secondary metabolic pathways in relation to secondary metabolite phytochemicals and trichome development. Genes for the metabolism and for phytoconstituents were differentially regulated in *O. basilicum* and *O. sanctum*. Trichome related genes were putatively involved in the regulation of essential oil in the trichomes. Further studies in continuation will help in delineating the exact mechanism of trichome development and essential oil regulation in integration with overall metabolism in *Ocimum* species.

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## Compliance with ethical standards

**Conflict of interest** Authors declare no conflict of interest; all the co-authors are well aware of the publication of this work. Research not involved Human participants and/or Animals.

**Research involving human and animal rights** Research not involved Human participants and/or Animals.

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