

Review Article

FUNCTIONAL ANALYSIS OF MEDICINAL PLANTS USING SYSTEMS BIOLOGY APPROACHES

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ABSTRACT

Plant derived medicine is an important source of life saving drugs, but the genome information of most important medicinal plants is still unavailable. The need of the hour is to identify more functional genes and enzymes that control secondary metabolite production in medicinal plants, develop new methods for systematics, engineer resistance to number of biotic and abiotic stresses, and develop new conservation strategies, more genomics, proteomics and metabolomics information needs to be produced. In this review, a brief overview of various omic technologies and its applications to medicinal and aromatic plants are discussed.

Keywords: Medicinal Plants, Omic Approaches, Transcriptomics, Metabolomics, Genomics and Epigenomics, Bioinformatics.

INTRODUCTION

To understand the biological and other metabolic processes of medicinal plants it is essential to study these plants using a combination of omic approaches. In order to analyse the data generated from such studies in bioinformatics and other associated tools are essential [1]. Use of all omic data combined with chemometric analysis tools like bioinformatics is termed as systems biology. Systems biology helps in complete understanding of a system or a physiological state by integrating different "omics" data sources for the analysis of networks and regulation. The ultimate aim is to how the system responds as a whole to a particular physiological state [2].

Transcriptomics

Transcriptome can be described as the set of all RNA molecules, including mRNA, tRNA, rRNA, and non-coding RNA produced by a single cell or a group of cells in response to physiological stimuli. Transcriptomics therefore, is the study of global analysis of gene expression profile at the mRNA level. Transcriptomic technologies generally involve genome wide gene expression methods like cDNA-AFLP, SAGE, DNA microarray and oligo-microarray. Currently however, the most popular transcriptomics method is oligo-microarray because it offers the advantage of complete genome coverage. Microarray is also one of the most popular tools and can be used to measure gene expression changes of medicinal plants which could be later related to metabolite expression levels using systems biology. Different organs of the same plant, the same organ at different development stages, *in vitro* cultured plants or cells are used as a source for extraction of DNA/RNA for analysis. Transcriptomic studies on medicinal plants include measuring metabolite levels at different geographic locations, natural growth environments, or cultivation conditions. However, scientific investigations using high throughput gene expression profiles to study gene expression changes in medicinal plants are very rare. One of the most interesting investigations used cDNA microarray to examine the gene expression profiles of hairy root of *Salvia miltiorrhiza* Bunge at different stages [3]. Such experiments aim to identify genes that are in charge of regulating production of secondary metabolites with medicinal value. Many authors have reported using transcriptome approaches for identifying specific gene functions from medicinal plants.

Examples include Identification of Ethylene responsive element binding protein genes for *S. miltiorrhiza* [4]. In addition DNA microarray can also be used for systematic authentication of medicinal plants by using 5S ribosomal RNA genes [5] or 18S rRNA genes across

closely related species. Microarray experiments use whole genome sequence information for a specific organism. However, the whole genome of any single medicinal plant has been sequenced with the exception of *Azadirachta indica*. In order to bridge this lacuna transcriptome information through generating expression sequence tags (ESTs) is the choice of many scientific groups around the world. ESTs from several medicinal plants such as *Panax quinquefolius* L. [6, 7], *Huperziaserrata* (Thunb. ex Murray) Trev [8], *P. notoginseng* (Burk.) [7], *Rehmanniaglutinosa* Libosch [6], and *Catharanthus roseus* (L.) G. Don [9] are available. Recently developed next generation sequencing technologies, such as illumina, 454, and solid approaches have revolutionized the EST generation. Millions of EST sequences of Northern bobwhite (*Colinus virginianus* L.) and red earthworm have been generated from the 454 platform. Assembled unique sequences are used to design oligo-microarrays [10].

Metabolomics

Metabolomics is the science of profiling all the metabolites produced in an organism. More than 50, 000 metabolites have been characterized from medicinal and aromatic plants. Metabolomics is an extremely useful, due to the fact that one of the main objectives of studying medicinal plants is to find active compounds, which, in fact, are metabolites. Therefore, fast development of metabolomics technology provides us a valuable opportunity to advance the studies of medicinal plants. One advantage of conducting metabolomics is that genomics information is not needed. Metabolomics can be used to compare metabolite quantitative changes in medicinal materials between different organisms, ages, origins, organs, developmental stages, environmental cultivation and culture conditions, and processing methods. It can help us understand the metabolic pathways for the production of these bioactive compounds generate metabolic fingerprinting of medicinal plants for the authentication and quality control, classify medicinal plants, and establish a quantitative version of chemotaxonomic analysis to advance our knowledge of the evolutionary relationship of medicinal plants. In addition recent advances in metabolomics have enabled rapid identification and quantification of as yet unknown metabolites [11]. Rapid identification of existing compounds, and generating new knowledge of the pharmacological and toxic effects of the plant under study and the chemical ecological aspects of the metabolite in specific is dealt with very efficiently using different metabolomic tools. MS and NMR methods are the backbone of any metabolic fingerprinting study and they have been successfully employed to evaluate the quality of herbal material and phyto pharmaceutical [12]. Some of the examples of, metabolomic profiling include differentiation of 12 *Cannabis sativa* cultivars [13, 14] and

determination of the quantity of gingolic acids from Ginkgo leaves and in six commercial Ginkgo products [14]. Metabolic profiling of *Angelica cutiloba* (Sieb. & Zucc.) Kitag. roots, has been carried out using gas chromatography-time-of-flight-mass spectrometry which enabled quantification of a number of metabolites in a tissue specific manner in addition multivariate pattern recognition could also be established based on the taxonomy of the metabolites identified [15]. Comparative metabolomics strategy coupled with cell and gene-based assays was used for species classification and anti-inflammatory bioactivity validation of medicinal *Echinacea* species, i.e. *Echinacea purpurea* (L.) Moench, *E. pallida* Nutt., and *E. angustifolia* DC [16]. More metabolic profiling have been conducted in the medicine (*Medicago truncatula*) which is also a model organism for legume biology [17-19]. Popular methods used to perform metabolomic experiments are mass spectrometry (MS) and nuclear magnetic resonance (NMR). More focus on lipid compounds has been noticed and study of all lipids in a particular physiological state is called lipidomic technology is a valuable high through put method that can potentially be used to identify novel biomarkers and also for quantification of lipids and other related metabolites [20].

Proteomics

Proteomics is the information of a whole proteome. It also refers to the complete complement of proteins including the modifications that proteins undergo in a particular physiological state. Some of the post-translational modifications that are studied include methylation, acetylation, glycosylation, oxidation, and nitrosylation [21]. Most of the published proteomics data of medicinal plants are most obtained from *Medicago* the focus of these studies is on the protein expression and phosphorylation changes at various conditions [22-26]. The foremost reason for less number of publications in proteomics is the lack annotation of protein and gene sequence information on medicinal plants. However, recent improvements in technologies like tandem mass spectrometry which enable *de novo* sequencing of proteins more reports on the full complement of proteins is expected to rise in the near future.

Genomics and Epigenomics

Genomics is the study of an organism's whole genome. Genome refers to all of the DNA sequences in an organism. So far, there are very few genomes of medicinal plants that have been fully sequenced. A recent draft of *Neem* (*Azadirachta indica*) has been published [27]. The *Azadirachta indica* (*neem*) tree is a source of a wide number of natural products, including the potent biopesticide *azadirachtin*. In spite of its widespread applications in agriculture and medicine, the molecular aspects of the biosynthesis of *neem* terpenoids remain largely unexplored. The current report describes the draft genome and four transcriptomes of *A. indica* and attempts to contextualise the sequence information in terms of its molecular phylogeny, transcript expression and terpenoid biosynthesis pathways. *A. indica* is the first member of the family *Meliaceae* to be sequenced using next generation sequencing approach. The genome and transcriptomes of *A. indica* were sequenced using multiple sequencing platforms and libraries. The *A. indica* genome is AT-rich, bears little repetitive DNA elements and comprises about 20,000 genes. Molecular phylogenetic analyses grouped *A. indica* together with *Citrus sinensis* from the *Rutaceae* family validating its conventional taxonomic classification. Comparative transcript expression analysis showed either exclusive or enhanced expression of known genes involved in *neem* terpenoid biosynthesis pathways compared to other sequences in angiosperms. Genome and transcriptome analyses in *A. indica* led to the identification of repeat elements, nucleotide composition and expression profiles of genes in various organs [27]. However, the number of publications associated with identification and authentication of medicinal plants at the DNA level has increased exponentially. DNA-based techniques that do not require whole genome information like PCR, RFLP, AFLP, RAPD, and sequencing are employed to resolve ambiguities in plant identification and discrimination [27; 29;30;31]. Since a number of medicinal plants fall under the endangered species, category it is essential to select one or more model medicinal plants to sequence their entire genomes which will profoundly enhance the research of medicinal plants. Epigenomics is the whole genome level study of

epigenetic elements. Epigenomics is important for us to understand the mechanisms of gene expression changes in medicinal plants.

"Omics" Data Analyses

Omic technologies usually produce huge data sets that require statistical tools and several software tools for analysis. Most of the statistical tools are based on clustering algorithms which can be used to cluster genes that have similar behaviours and identified in a microarray experiment the genes in the same cluster should have similar functions. Such algorithms can be utilized to predict secondary metabolites or pathways that are involved in similar biological activities. Clustering algorithms can be subdivided into unsupervised and supervised algorithms. Other algorithms such as classification algorithms can be employed to classification, authentication and quality control. In addition, it can be utilized to evolution and systematics of the medicinal plant. Classification algorithms can help in identifying a list of efficient markets to precisely distinguish different restorative materials using data from chemical composition, quantity and morphology. There are many feature selection methods including support vector machine recursive feature elimination (SVM-RFE), chi-square, info gain, gain ratio, relief, wrapper, and CSF. Generally used for classification algorithms include decision tree [48], random forest (RF), Naïve Bayes (NB), simple logistic (SL), RBF Neural Nets, MLP neural nets and support vector machines (SVMs). These algorithms use microarray data and can be used for classification and clustering of genes, proteins and metabolites into an integrated map. Many such algorithms can be integrated by writing software application tools which are user friendly. Such tools with a user friendly graphical user interface help biologists and other application scientists in classifying data based on different functional categories [32].

CONCLUSION

Integrating transcriptomics, proteomics and metabolomics data can help us to predict gene function particularly for genes involved in complicated pathways that can produce bioactive constituents. Through integrated metabolite and transcript profiling, a biosynthetic mechanism for *hispidol* in *Medicago truncatula*, cell cultures was characterized [33]. The major challenge for systems biologists is to construct a transcriptional regulatory network and overlay that of a metabolite and post-translational modification map by using reverse engineering algorithms. By collaborating with computer scientists, an ensemble learning approach to reverse engineering transcriptional regulatory networks from time-series gene expression data has to be developed which can then be used with gene ontology mapping methods to analyse genomic, proteomics and metabolomic data in tandem. Such an integrated approach will enable discovery of novel biomarkers based on functional and epigenomic data. The data thus generated can be overlaid on heat maps to predict patterns of gene expression, protein modifications and metabolite profiles. Such integration will enable us to take a decision on the nature and structure of genetic interventions necessary for production of desired metabolites.

CONFLICT OF INTERESTS

Declared None

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