## AUTHOR QUERY FORM

	Journal: BIOMED	Please e-mail or fax your responses and any corrections to:	
		E-mail: corrections.esch@elsevier.tnq.co.in	
ELSEVIER	Article Number: 14	Fax: +31 2048 52789	

Dear Author,

Please check your proof carefully and mark all corrections at the appropriate place in the proof (e.g., by using on-screen annotation in the PDF file) or compile them in a separate list. Note: if you opt to annotate the file with software other than Adobe Reader then please also highlight the appropriate place in the PDF file. To ensure fast publication of your paper please return your corrections within 48 hours.

For correction or revision of any artwork, please consult http://www.elsevier.com/artworkinstructions.

Any queries or remarks that have arisen during the processing of your manuscript are listed below and highlighted by flags in the proof.

Location in article	Query / Remark: Click on the Q link to find the query's location in text Please insert your reply or correction at the corresponding line in the proof
Q1	Please define "cDNA" here.
Q2	Please define "mRNA" here.
Q3	Please supply manufacturer name, city, state, and country if necessary.
Q4	Please provide manufacturer city, state, and country if necessary.
Q5	Please supply ref(s) for this statement, then renumber all subsequent ref(s) as necessary.
Q6	Please supply manufacturer name, city, state, and country if necessary.
Q7	Please supply manufacturer name, city, state, and country if necessary.
Q8	Please supply manufacturer name, city, state, and country if necessary.
Q9	Please supply this reference, then renumber all subsequent references as necessary.
Q10	There appears to be some words missing here. Please review and amend as necessary.
Q11	Please update the reference [31].
Q12	Please supply manufacturer name, city, state, and country if necessary.
Q13	Please supply manufacturer name, city, state, and country if necessary.
Q14	Please supply manufacturer name, city, state, and country if necessary.
Q15	Please supply manufacturer name, city, state, and country if necessary.
Q16	Please supply manufacturer name, city, state, and country if necessary.
Q17	Please supply manufacturer name, city, state, and country if necessary.

Q18	Please define "KEGG" here.
Q19	Please supply manufacturer name, city, state, and country if necessary.
Q20	Please supply manufacturer name, city, state, and country if necessary.
Q21	Please supply manufacturer name, city, state, and country if necessary.
Q22	Please supply manufacturer name, city, state, and country if necessary.
Q23	Please define "GO" here.
Q24	Please supply manufacturer name, city, state, and country if necessary.
Q25	Please supply manufacturer name, city, state, and country if necessary.
Q26	Please confirm that given names and surnames have been identified correctly.

Thank you for your assistance.

## ARTICLE IN PRESS

BIOMEDICINE XXX (2012) 1-7

www.biomed-online.com

Available online at www.sciencedirect.com SciVerse ScienceDirect

## **Review** article

# DNA microarray analysis as a tool to investigate the therapeutic mechanisms and drug development of Chinese medicinal herbs

## <sub>l</sub>Chia-Cheng Lį<sup>a</sup>, <sub>l</sub>Hsin-Yi Lq<sup>a</sup>, <sub>l</sub>Chien-Yun Hsiang<sup>b,†</sup>, <sub>l</sub>Tin-Yun Hq<sup>a,\*,†</sup>

<sup>a</sup> Graduate Institute of Chinese Medicine, China Medical University, Taichung, Taiwan <sup>b</sup> Department of Microbiology, China Medical University, Taichung, Taiwan

### ARTICLE INFO

Article history: Received 9 November 2011 Received in revised form 13 December 2011 Accepted 7 February 2012 Available online xxx Keywords: DNA microarray gene expression profile

traditional Chinese medicine

### ABSTRACT

Chinese herbal medicines have been used for the treatment of various diseases for centuries. Although several herbal formulas and herbal components have shown therapeutic potential, the active components and the molecular mechanisms mediating the effects of said formulas remain to be discovered. Microarray analysis has become a widely used tool for the generation of gene expression data on a genome-wide scale. This paper discusses the application of whole genome expression profiling as a tool to investigate the molecular mechanisms governing the therapeutic effects of traditional Chinese medicine. This review also highlights how data derived from DNA microarray analysis can be used to screen for drug targets of various herbal drugs, to predict the therapeutic potential of herbal drugs, to analyze the safety of drugs in the preclinical stage of drug development, and to establish a modern definition of traditional Chinese medicine.

Copyright © 2012, China Medical University. Published by Elsevier Taiwan LLC. All rights reserved.

#### 1. Introduction

Systems biology serves as a translational platform between traditional Chinese medicine and modern science. In this study, we review the technology behind whole genome expression profiling and discuss the biomedical application of the technique to the study of Chinese medicinal herbs.

### 2. Technology behind genome expression profiling

#### 2.1. Development of whole genome expression profiling

In 1995, Schena and colleagues[1] at Stanford University in Palo Alto, CA, USA, published the first paper on the use of

\* Corresponding author. China Medical University, Number 91, Hsueh-shih Road, Taichung City 40402, Taiwan, ROC. E-mail address: cyhsiang@mail.cmu.edu.tw (T.-Y. Ho).

<sup>†</sup> These authors contributed equally to this work.

2211-8020/\$ - see front matter Copyright © 2012, China Medical University. Published by Elsevier Taiwan LLC. All rights reserved. doi:10.1016/j.biomed.2012.02.002

Please cite this article in press as: Li C-C, et al., DNA microarray analysis as a tool to investigate the therapeutic mechanisms and drug development of Chinese medicinal herbs, (2012), doi:10.1016/j.biomed.2012.02.002

Q26



2

148

149

180

181

182

BIOMEDICINE XXX (2012) 1-7

ARTICLE IN PRESS

131 Q1 cDNA microarray probes printed in a two-dimensional grid 132 onto glass slides. They showed that their high-capacity 133 system could simultaneously monitor the expression of 134 many genes. Microarrays prepared by high-speed robotic 135 printing of complementary DNAs on glass are used for 136 measurements of quantitative expression of corresponding 137 genes. Because of the small format and the high density of 138 arrays, hybridization volumes of less than two microliters can 139 be used, enabling the detection of rare transcripts in probe 140 mixtures derived from two micrograms of total cellular 141 mRNA. Two-color fluorescence hybridization is then used to 142 Q2 143 simultaneously visualize differentially expressed genes. In 144 1996, Affymetrix began to market commercially available DNA 145 chips. Various microarray experimental platforms have been 146 developed since then. 147

#### 2.2. Commonly used microarray platforms

150 Three different types of microarray platforms are commonly 151 used: spotted cDNAs, spotted oligonucleotides, and Affyme-152 153 Q3 trix arrays [2].

154 Spotted cDNA arrays typically use sets of specific cDNA 155 plasmids in gridded liquid. The inserts of each clone are 156 typically amplified by polymerase chain reaction, and a few 157 pico liters are physically spotted onto glass slides by liquid-158 handling robots. Spotted cDNA arrays are only used in 159 academic centers because of their flexibility and relatively low 160 cost. 161

Spotted oligonucleotide arrays are also built on glass slides 162 by liquid-handling robots; however, the input solution 163 comprises synthetic oligonucleotide (often 60-70 mer) rather 164 165 than plasmids. Most of the process is automated, leading to 166 less sample mix-up and less sample dropout. Disadvantages 167 of spotted oligonucleotides include the relatively high cost of 168 synthesizing large numbers of large oligonucleotides and the 169 nonrenewable nature of the resource. Nonetheless, spotted 170 oligonucleotide arrays are still widely used. 171

Affymetrix GeneChips are factory designed and synthe-172 Q4 sized. Design is done using software to choose a series of 11- to 173 25-mer probes from the 3-foot end of each transcript or pre-174 dicted transcript in the genome. Synthesis of arrays is done 175 176 using light-activated chemistry and photolithography 177 methods. Spotted oligonucleotides and Affymetrix arrays have 178 superseded the use of spotted cDNAs. The manufacturers of 179

commonly used DNA microarray platforms are listed in Table 1.

#### 2.3. Limitations and standardization of microarray platforms

DNA microarrays enable researchers to simultaneously monitor the expression of thousands of genes. However, the current technology has several limitations. The major problems are sensitivity, accuracy, specificity, and reproducibility of microarray results. Studies have shown that, for relatively abundant transcripts, the existence and direction, but not the magnitude, of expression changes can be reliably detected. Q5 However, accurate measurements of absolute expression levels and the reliable detection of low abundance genes are difficult to achieve. The main problems seem to be the suboptimal design or choice of probes and some incorrect probe annotations. Marshall [3] compared the reliability of numerous array platforms, including the Affymetrix GeneChip, the Agilent array and the Amersham array systems, Q6 and found that more than one-half of the variability observed in the results was attributable to differences in the microarray platforms themselves. Efforts to standardize microarray data have been underway for some time and include the standardization of sample preparation, RNA isolation, cDNA synthesis, hybridization analysis, and quality control checkpoints to ensure reproducibility of data. For example, quality control criteria for RNA isolation include yield, purity, and integrity. An RNA integrity number greater than eight indicates that the RNA sample is suitable for cDNA synthesis. The criteria for cDNA labeling include concentration and incorporation efficiency. An incorporation efficiency of 15 labeled nucleotides per 1000 cDNA nucleotides indicates that cDNA labeling is suitable for hybridization. The gene expression profile obtained using standardized protocols can yield data that are consistent between laboratories and are intrinsically comparable [4].

Use of identical microarray chips and identical protocols would minimize the efforts made by researchers to integrate expression data, thereby allowing for the information embedded in these data to be maximally explored. In 2004, the Microarray and Gene Expression Data (MGED) society wrote an open letter to scientific journals proposing standards for publication. The MGED society suggested that journals require

Manufacturer	Location	Website
Affymetrix	Santa Clara, CA, USA	www.affymetrix.com
Agilent Technologies	Santa Clara, CA, USA	www.agilent.com
Expression Analysis	Durham, NC, USA	www.expressionanalysis.com
Jivan Biologics	Larkspur, CA, USA	www.jivanbio.com
Marligen Biosciences	Ijamsville, MD, USA	www.marligen.com
NanoString Technologies	Seattle, WA, USA	www.nanostring.com
NimbleGen	Madison, WI, USA	www.nimblegen.com
Oxford Gene Technology	Oxford, UK	www.ogt.uk
PerkinElmer	Waltham, MA, USA	www.perkinelmer.com
Phalanx Biotech Group	Hsinchu, Taiwan	www.phalanxbiotech.com

Please cite this article in press as: Li C-C, et al., DNA microarray analysis as a tool to investigate the therapeutic mechanisms and drug development of Chinese medicinal herbs, (2012), doi:10.1016/j.biomed.2012.02.002

ARTICLE IN PRESS

3

### BIOMEDICINE XXX (2012) 1-7

submission of microarray data to one of two public repositories: Gene Expression Omnibus (GEO) or ArrayExpress. Moreover, they stated that authors should provide a checklist of variables and supply the checklist as supplementary information at the time of submission. Other members of the microarray community welcomed these steps, in particular Brazma and colleagues [5], who proposed the Minimum Information About a Microarray Experiment (MIAME), a guideline that describes the minimum information required to ensure that microarray data can be easily interpreted. The standardization of global gene expression data will make microarray data much more useful and accessible.

261

262

263

264

265

266

267

268

269

270

271

272

273

274

275

276

277

278

279

280

281

282

283

284

285

286

287

288

289

290

291

292

293

294

295

296

297

298

299

300

301

302

303

304

305

306

In summary, DNA microarray technology has evolved rapidly since its introduction in 1995. Although certain limitations of the current technology exist and have become more apparent during the past couple of years, the ability of microarrays to monitor the expression of thousands of genes simultaneously is unsurpassed [6].

# 3. Application of whole genome expression profiling to traditional Chinese medicine studies

Whole genome expression profiling can be applied to study the biomedical effects of Chinese medicinal herbs. Extracts prepared from medicinal plants and other natural sources contain a variety of molecules with potent biological activities. Unfortunately, it is often difficult to analyze the biologic activities of these extracts because of their complex nature and the possible interaction of their components. Genomewide expression monitoring with high-density microarrays provides a simple way to test the biochemical effects of herbs, thereby gaining insight into their potential beneficial effects and negative side effects. DNA microarray has been used to evaluate the toxicity of novel drug candidates and to identify disease targets for drug development. Additionally, the therapeutic efficacy of a given drug can be predicted on the basis of gene expression patterns *in vitro*.

# 3.1. Evaluation of biologic activity and mechanisms of Chinese herbs

307 Microarray data have been used to characterize the biologic 308 activities and mechanisms of action of herbal formulae or 309 herbal compounds. For example, PC-SPES is a dietary 310 supplement comprised of extracts from eight different herbs: Q7 311 Scutellaria baicalensis, Glycyrrhiza glabra, Ganoderma lucidum, 312 Isatis indigotica, Panax pseudo-ginseng, Dendranthema mor-313 ifolium, Rabdosia rebescens, and Serenoa repens. PC-SPES is also 314 used as an alternative therapy by patients with prostate 315 carcinoma [7–9]. The gene expression profile in cultured cells 316 that have been exposed to PC-SPES shows differential 317 expression of genes involved in modulating cell cycle, cell 318 319 structure, and androgen response, indicating that alteration of 320 some of those genes may be responsible for PC-SPES-321 mediated cytotoxicity [10]. Yukmijihwang-tang (YMJ), also 08 322 known as LiuWei Dihuang Wang, is composed of six different 323 medicinal herbs, including Rehmannis radix, Radix dioscoreae, 324 Fructus corni, Poria, Cortex moutan, and Radix alismatis. YMJ has 325 been widely used for centuries as an antiaging herbal formula in Asian countries [11]. Microarray data indicate that YMJ enhances memory retention by inducing several genes that are involved in protecting neuronal cells, enhancing cell proliferation, and stimulating neurite growth [12]. Pinelliae Rhizoma extract (PRe) is used to treat cough and asthma. However, the mechanism by which PRe exerts its effect on psychological disorders has not been studied. Kim and coworkers [13] used microarray to analyze the effect of PRe in mice exposed to psychological stress. They found that the expression of most genes that are altered in response to psychological stress is restored to normal levels in PRe-treated mice, with recovery rate of 81.5% for up-regulated genes and 85.2% for down-regulated genes. When the interaction network was analyzed, the recovery rate of the core node genes (46 up- and 29 down-regulated genes) in PRe-treated mice was over 95%, indicating that those genes may be the effective targets of PRe. Curcumin, a major chemical component of Curcuma longa, is used as a spice to give a specific flavor and yellow color to curry. It is also used as a cosmetic agent and in some medical preparations [14]. Curcumin displays anticarcinogenic properties in animals [15,16]. Microarraybased gene expression patterns indicate that, in addition to anticarcinogenic effects, curcumin may be an effective antimetastatic agent via the regulation of expression of certain genes [17]. Aristolochic acid (AA), the major constituent of Aristolochia species, is associated with nephritis and renal cancer [18–20]. Microarray and network analysis have shown that most AA-altered genes are connected with nuclear factor- $\kappa B$  (NF- $\kappa B$ ), suggesting that NF- $\kappa B$  plays a critical role in the pathogenesis of AA-induced renal diseases [21]. Extracts prepared from medicinal plants and other natural sources contain a variety of molecules with potent biological activities; the aforementioned studies suggest that genome-wide expression monitoring with high-density microarrays is an effective method for analyzing the biologic activities of those extracts.

# 3.2. Establishing a modern definition of traditional Chinese medicine

Chinese herbal formulas consist of several herbal components. However, the mechanisms of action of most Chinese herbal formulas and the relationship between formulae and their components remain to be elucidated. The putative mechanism of San-Huang-Xie-Xin-Tang (SHXXT) and the relationship between SHXXT and its herbal components were analyzed in our laboratory using a microarray technique [22]. Gene-set enrichment analysis indicated that SHXXT and its components displayed a unique anti-proliferation pattern involving p53 and DNA damage signaling pathways in HepG2 cells. Network analysis showed that SHXXT-affected genes were regulated by p53. In addition, clustering analysis showed that Rhizoma coptis, the principal herb in SHXXT, shared a similar gene expression profile with SHXXT. These findings indicate that R coptis is the principal herb in the herbal combination SHXXT (Fig. 1). To the best of our knowledge, this was the first study to reveal the relationship between a traditional Chinese medicine formula and its herbal components using microarray and bioinformatics approaches.

Please cite this article in press as: Li C-C, et al., DNA microarray analysis as a tool to investigate the therapeutic mechanisms and drug development of Chinese medicinal herbs, (2012), doi:10.1016/j.biomed.2012.02.002

391

395

397

398

399

400

401

402

404

405

406

407

408

409

411

412

413

415

416

418

419

420

421

422

423

425

426

427

428

429

430

431

432

433

434

435

436

ARTICLE IN PRESS

BIOMEDICINE XXX (2012) 1-7



Fig. 1 – Network analysis of SHXXT-regulated genes. We selected the target genes that are regulated by p53 from http://rulai.cshl.edu/cgi-bin/TRED/tred.cgi?process= 414 Q20 searchTFGeneForm. To estimate the overall regulatory effect of SHXXT on these target genes, we used the 'geneSetTest' function implemented in the R program of 417 <sub>Q21</sub> the Limma package to compare the absolute t-statistic values for these target genes with those for all genes. These target genes were then combined with the differentially expressed genes, which belonged to the Gene Ontology (GO) category 'regulation of biological process,' to investigate their relationship with p53. We used the  $424 \ {}^{\mathrm{Q22}}$ MetaCore Analytical suite to construct the interaction networks between p53-downstream genes and part of the differentially expressed genes. The fold changes in gene expression in SHXXT-, Rheum officinale-, Coptis chinensis-, and Radix scutellariae-treated cells, respectively, are shown at the bottom. SHXXT = San-Huang-Xie-Xin-Tang.

#### 3.3. Evaluation of drug safety

437 Many natural products, including polyphenols, terpenes, 438 alkaloids, flavonoids, and phenolics, are potential thera-439 peutic agents [23]. Previous studies have shown that 440 phytochemicals affect the expression levels of genes 441 involved in drug metabolism [24]. To evaluate whether 442 phytochemicals affect drug metabolism, we analyzed the 443 expression levels of genes encoding phase I and II drug 444 metabolism enzymes in cells exposed to anthraquinone 445 compounds. Phase I drug metabolism genes encode alcohol 446 dehydrogenases, aldehyde dehydrogenases, and cytochrome 447 P450 families, while phase II drug metabolism genes encode 448 449 glutathione S-transferases, sulfotransferase, and UDP glu-450 curonosyltransferase (UGT) families. We found that genes 451 involved in phase II drug metabolism were down regulated 452 during anthraquinone compound treatment (Table 2). These 453 data suggest that anthraquinone compounds may slow 454 down the excretion of drugs, thereby increasing the half-life 455 of drugs [25].

Table 2 – Analysis of expression levels of genes associated with drug metabolism. <sup>a</sup>			
Gene symbol	$\log_2 ratio$	Standard deviation	
UGT1A10	-0.23	1.89	
UGT2A1	-0.28	1.15	
UGT2B11	-1.70	5.42	
UGT2B15	-0.85	0.69	
UGT2B4	-0.34	0.29	
UGT2B7	-0.94	0.79	

a Results were obtained from three independent assays. A total of 219 genes associated with drug metabolism were selected from 'The Pharmacogenetics and Pharmacogenomics Knowledge Base' website (https://www.pharmgkb.org/index.jsp). Among these genes, we analyzed the expression levels of phase I drug metabolism genes, including alcohol dehydrogenases, aldehyde dehydrogenases, and cytochrome P450 genes, and phase II drug metabolism genes, including glutathione S-transferases, sulfotransferase, and UGT genes. The log<sub>2</sub> ratio and standard deviation of UGT genes are shown.

#### 3.4. Prediction of the therapeutic potential of medicinal herbs

Vanillin has been shown to inhibit mutagenesis and to suppress the invasion and migration of cancer cells [26]. In our previous studies, microarray data and gene ontology investigation indicated that vanillin affected clusters of genes involved in the cell cycle and apoptosis. Network analysis indicated that Fos might play a central role in the regulation of the gene expression network. Results from reporter assay and Western blot further indicated that vanillin inhibited Fosrelated transcription factor activator protein 1 (AP-1) activity via an extracellular signal-regulated kinase pathway. Our data suggest that vanillin exhibits anticancer potential by regulating cell cycle and apoptosis and that its regulation may involve the suppression of AP-1 (Fig. 2) [27,28].

AA belongs to a family of compounds found in the Aristolochiaceae family of plants. Aristolochia species in particular have been used for centuries in Asia for medicinal purposes. Although AA is bioactivated in both the kidney and liver, it only induces diseases and tumors in kidney and urinary tract in human and rodents [18]. To elucidate why AA displays such tissue-specific carcinogenicity, Chen and colleagues [29] examined gene expression profiles in kidney and liver of rats treated with carcinogenic doses of AA. They found that the biologic processes related to defense response, apoptosis, and immune responses were significantly altered by AA exposure in kidney but not in liver. These findings may explain why AA induces tumors in the kidney but not in the liver [29].

Ginkgo biloba extract EGb 761 is wildly used to treat neurologic disorders [30,31]. In a previous study, we tested the effects of EGb761 on the transcriptional profile of mouse genes. A KEGG pathway analysis showed that EGb761 affected og the neuroactive ligand-receptor interaction pathway in brain. A total of 53 genes were significantly affected, and EGb761 upregulated a subgroup of dopamine receptors, especially dopamine receptor 1a. Immunohistochemical staining confirmed the microarray data. The finding that G biloba

519

520

Please cite this article in press as: Li C-C, et al., DNA microarray analysis as a tool to investigate the therapeutic mechanisms and drug development of Chinese medicinal herbs, (2012), doi:10.1016/j.biomed.2012.02.002

BIOMEDICINE XXX (2012) 1-7

Q23

Q24

Q25



Fig. 2 – Ontology analysis of vanillin-affected genes. vanillin-affected genes were analyzed by GO on the Gene Ontology Tree Machine website (http://bioinfo.vanderbilt. edu/gotm/), a web-based and tree-based data-mining environment for gene sets. We used the WebGestalt tool to test significant GO terms, and the significant GO terms are shown.

treatment resulted in increased expression of dopamine receptor 1 in brain may explain why EGb761 is an effective treatment of neurologic disorders such as Parkinson disease (Table 3) [32].

### 3.5. New drug development

Whole genome expression profiling has also been used for the development of new drug [33–36]. Large-scale gene expression analyses of toxin-treated cells and animals have yielded information on the toxic potential of novel drug candidates [37–41]. In addition, gene expression profiles have been applied to identify the disease targets for drug development [42]. Moreover, the therapeutic efficacy of drugs can be predicted on the basis of gene expression signatures in vitro [43,44].

A number of studies have shown that DNA microarray data have potential utility in drug discovery and drug target validation [44,45]. For example, Lamb and others [46] analyzed the expression profiles of 164 small molecules with DNA microarray. By comparing the genomic signatures of drug candidates or the disease state to this resource, the authors found that it was possible to identify potential mechanisms of action, confirm previous applications of known drugs, and identify additional potential uses for known drugs [46]. Their results demonstrate that the establishment of a huge gene expression database would be useful for finding connections among small molecules that share similar mechanisms of action and that are involved in similar physiologic processes, thereby allowing for the development of disease-fighting drugs.

Several studies have indicated similarities between gene expression profiles and therapeutic activities [46-48]. In addition, genome-wide expression monitoring with highdensity microarrays provides a simple way to test biochemical effects of herbs, thereby gaining insights into their potential beneficial effects and negative adverse events [30]. In a recent study, we applied DNA microarray to analyze biologic events, predict the therapeutic potential of drugs, and evaluate the safety of herbal formulas [49]. For seven consecutive days, mice were administrated orally with 15 of the most widely used Chinese herbal formulae listed in the Taiwan National Health Insurance Database, and the gene expression profiles in liver or kidney were analyzed by DNA microarray. Our data showed that most formulas altered metabolic pathways, such as the pathways governing glutathione metabolism and oxidative phosphorylation, and regulatory pathways, such as that regulate antigen processing and presentation and insulin-like growth factor signaling. By comparing the gene 010 expression signatures of formulas with those of disease states or drugs, we found that response of mice to formula might be associated with disease state in said mice, such as metabolic or cardiovascular diseases. Moreover, most formulas altered the expression levels of cytochrome P450, glutathione Stransferase, and UGT genes, suggesting that caution should be paid to possible drug interactions of these formulas. Furthermore, the similarities in gene expression profiles between formulas and toxic chemicals were low in kidney, suggesting

Table 3 – Neuro EGb761-affecteo	pactive ligand-receptor in d genes in the brain and	nteraction of kidney.ª	
	Observed (total)	p value	
Brain	53 (237)	$\textbf{4.13}\times\textbf{10}^{6}$	
Kidney	0 (237)	0.536	
a Fluorescent RN. using a MessageA were hybridized t array. After an ove targets were wash Axon 4000 scann was analyzed by each spot was cor with a signal-to-m trol probes were normalized by the normalization [50 t-statistics using Gene Expression expressed gapes	A targets were prepared from MP aRNA kit and Cy5 dye. o Mouse OneArray Whole G rnight hybridization at 50 °C, ned away and the slides were. The Cy5 fluorescent into genepix 4.1 software. The rected by subtracting backgr oise ratio of less than 0 as w filtered. Spots that passed R program in the Limma pace I. The <i>p</i> value of each gene the Differential Expression Pattern Analysis Suite [51].	m 5 µg of total RNA Fluorescent targets enome DNA micro- nonspecific binding re scanned with an ensity of each spot signal intensity of round signals. Spots vell as those of con- these criteria were exage using quantile e was calculated by (T-Rex) tool in the These differentially	Q12 Q13 Q14 Q15 Q16 Q16
pathway [52]. Pat	hway enrichment analysis	was performed on	Q1
the WebGestalt w login.php) by the the <i>p</i> value of th ligand-receptor in	ebsite (http://bioinfo.vander hypergeometric test, which e over-represented pathway teraction pathway is shown.	bilt.edu/webgestalt/ is used to evaluate s. The neuroactive	Q19

Please cite this article in press as: Li C-C, et al., DNA microarray analysis as a tool to investigate the therapeutic mechanisms and drug development of Chinese medicinal herbs, (2012), doi:10.1016/j.biomed.2012.02.002

## ARTICLE IN PRESS

716

717

718

719

720

721

722

723

724

725

726

727

728

729

730

731

732

733

734

735

736

737

738

739

740

741

742

743

744

745

746

747

748

749

750

751

752

753

754

755

756

757

758

759

760

761

762

763

764

765

766

767

768

769

770

771

772

773

774

775

776

777

778

779

780

### BIOMEDICINE XXX (2012) 1-7



## Fig. 3 — Paradigm for the application of whole genome expression profiling as a tool for therapeutic prediction, drug development, and safety evaluation of Chinese herbal medicines.

that these formulas might not induce nephrotoxicity in mice. This transcriptomic platform will not only help researchers understand the therapeutic mechanisms associated with herbal formulas and gene interactions, but will also help researchers develop novel disease-fighting drugs (Fig. 3).

### 4. Conclusion

Whole genome expression profiling can provide a basis for investigating the molecular mechanisms governing the therapeutic effects of Chinese herbal medicines and can be used to elucidate the biology of disease progression, identify potential therapeutic targets, and facilitate the development of traditional Chinese medicine—derived biopharmaceutical products.

## Acknowledgments

We thank the National Research Program for Genomic Medicine, National Science Council, the Committee on Chinese Medicine and Pharmacy at the Department of Health, and the China Medical University for support of our own work described in this review.

701<sub>Q11</sub> REFERENCES

- [1] Schena M, Shalon D, Davis RW, Brown PO. Quantitative monitoring of gene expression patterns with
- a complementary DNA microarray. Science 1995;270:467–70.
  [2] Dufva M. Introduction to microarray technology. Methods Mol Biol 2009;529:1–22.
- [3] Marshall E. Getting the noise out of gene arrays. Science 2004;306:630-1.
- [4] Kauffmann A, Huber W. Microarray data quality control improves the detection of differentially expressed genes. Genomics 2010;95:138–42.
- [5] Brazma A, Hingamp P, Quackenbush J, Sherlock G, Spellman P, Stoeckert C, et al. Minimum information about

a microarray experiment (MIAME)-toward standards for microarray data. Nat Genet 2001;29:365–71.

- [6] Draghici S, Khatri P, Eklund AC, Szallasi Z. Reliability and reproducibility issues in DNA microarray measurements. Trends Genet 2006;22:101–9.
- [7] Kubota T, Hisatake J, Hisatake Y, Said JW, Chen SS, Holden S, et al. PC-SPES: a unique inhibitor of proliferation of prostate cancer cells in vitro and in vivo. Prostate 2000;42:163–71.
- [8] Small EJ, Frohlich MW, Bok R, Shinohara K, Grossfeld G, Rozenblat Z, et al. Prospective trial of the herbal supplement PC-SPES in patients with progressive prostate cancer. J Clin Oncol 2000;18:3595–603.
- [9] Olaku O, White JD. Herbal therapy use by cancer patients: a literature review on case reports. Eur J Cancer 2011;47(4): 508-14.
- [10] Bonham M, Arnold H, Montgomery B, Nelson PS. Molecular effects of the herbal compound PC-SPES: identification of activity pathways in prostate carcinoma. Cancer Res 2002;62: 3920–4.
- [11] Hsieh MT, Cheng SJ, Lin LW, Wang WH, Wu CR. The ameliorating effects of acute and chronic administration of LiuWei Dihuang Wang on learning performance in rodents. Biol Pharm Bull 2003;26:156–61.
- [12] Rho S, Kang M, Choi B, Sim D, Lee J, Lee E, et al. Effects of Yukmijihwang-tang derivatives (YMJd), a memory enhancing herbal extract, on the gene-expression profile in the rat hippocampus. Biol Pharm Bull 2005;28:87–93.
- [13] Kim BY, Cho SJ, Kim HW, Kim SY, Lim SH, Kim KO, et al. Genome wide expression analysis of the effect of Pinelliae Rhizoma extract on psychological stress. Phytother Res 2010;24:384–92.
- [14] Govindarajan VS. Turmeric: chemistry, technology and quality. Crit Rev Food Sci Nutr 1980;12:199–301.
- [15] Huang MT, Smart RC, Wong CQ, Conney AH. Inhibitory effect of curcumin, chlorogenic acid and ferulic acid on tumor promotion in mouse skin by 12-O-tetradecanoylphorbol-13acetate. Cancer Res 1988;48:5941–6.
- [16] Das L, Vinayak M. Anti-carcinogenic action of curcumin by activation of antioxidant defence system and inhibition of NF-κB signalling in lymphoma-bearing mice. Biosci Rep 2012; 32:161–70.
- [17] Chen HW, Yu SL, Chen JJW, Li HN, Lin YC, Yao PL, et al. Antiinvasive gene expression profile of curcumin in lung adenocarcinoma based on a high throughput microarray analysis. Mol Pharmacol 2004;65:99–110.
- [18] Lai MN, Lai JN, Chen PC, Tseng WL, Chen YY, Hwang JS, et al. Increased risks of chronic kidney disease associated with prescribed Chinese herbal products suspected to contain aristolochic acid. Nephrology 2009;14:227–34.
- [19] Stengel B. Chronic kidney disease and cancer: a troubling connection. J Nephrol 2010;23(3):253–62.
- [20] Pfohl-Leszkowicz A. Ochratoxin A and aristolochic acid involvement in nephropathies and associated urothelial tract tumours. Arh Hig Rada Toksikol 2009;60(4):465–83.
- [21] Chen YY, Chiang SY, Wu HC, Kao ST, Hsiang CY, Ho TY, et al. Microarray analysis reveals the inhibition of nuclear factorκB signaling by aristolochic acid in normal human kidney (HK-2) cells. Acta Pharmacol Sin 2010;31:227–36.
- [22] Cheng WY, Wu SL, Hsiang CY, Li CC, Lai TY, Lo HY, et al. Relationship between San-Huang-Xie-Xin-Tang and its herbal components on the gene expression profiles in HepG2 cells. Am J Chin Med 2008;36:783–97.
- [23] Aggarwal BB, Shishodia S. Molecular targets of dietary agents for prevention and therapy of cancer. Biochem Pharmacol 2006;71:1397–421.
- [24] Chan E, Tan M, Xin J, Sudarsanam S, Johnson DE. Interactions between traditional Chinese medicines and Western therapeutics. Curr Opin Drug Discov Devel 2010;13: 50–65.

Please cite this article in press as: Li C-C, et al., DNA microarray analysis as a tool to investigate the therapeutic mechanisms and drug development of Chinese medicinal herbs, (2012), doi:10.1016/j.biomed.2012.02.002

651

702 703

694

695

696

697

698

699

700

704

705

706

707

708

709

710

711

712

713

714

### BIOMEDICINE XXX (2012) 1-7

[25] Cheng WY, Lien JC, Hsiang CY, Wu SL, Li CC, Lo HY, et al. Comprehensive evaluation of a novel nuclear factor-KB inhibitor, quinoclamine, by transcriptomic analysis. Br J Pharmacol 2009;157:746-56.

781

782

783

784

785

786

787

788

789

790

791

792

793

794

795

796

797

798

799

800

801

802

803

804

805

806

807

808

809

810

811

812 813

814

815

816

817

818

819

820

821

822

823

824

825

826

827

828

829

- [26] Lirdprapamongkol K, Sakurai H, Kawasaki N, Choo MK, Saitoh Y, Aozuka Y, et al. Vanillin suppresses in vitro invasion and in vivo metastasis of mouse breast cancer cells. Eur J Pharm Sci 2005;25:57-65.
- [27] Cheng WY, Hsiang CY, Bau DT, Chen JC, Shen WS, Li CC, et al. Microarray analysis of vanillin-regulated gene expression profile in human hepatocarcinoma cells. Pharmacol Res 2007;56:474-82.
- [28] Liang JA, Wu SL, Lo HY, Hsiang CY, Ho TY. Vanillin inhibits matrix metalloproteinase-9 expression through downregulation of nuclear factor-*k*B signaling pathway in human hepatocellular carcinoma cells. Mol Pharmacol 2009;75: 151-7.
- [29] Chen T, Guo L, Zhang L, Shi L, Fang H, Sun Y, et al. Gene expression profiles distinguish the carcinogenic effects of aristolochic acid in target (kidney) and non-target (liver) tissues in rats. BMC Bioinformatics 2006;7. S20.
- [30] Watanabe CM, Wolffram S, Ader P, Rimbach G, Packer L, Maguire JJ, et al. The in vivo neuromodulatory effects of the herbal medicine ginkgo biloba. Proc Natl Acad Sci USA 2001; 98:6577-80.
- [31] Zhang Z, Peng D, Zhu H, Wang X. Experimental evidence of Ginkgo biloba extract EGB as a neuroprotective agent in ischemia stroke rats. Brain Res Bull, in press.
- [32] Su SY, Hsieh CL, Wu SL, Cheng WY, Li CC, Lo HY, et al. Transcriptomic analysis of EGb 761-regulated neuroactive receptor pathway in vivo. J Ethnopharmacol 2009;123:68-73.
- [33] Clarke PA, te Poele R, Wooster R, Workman P. Gene expression microarray analysis in cancer biology, pharmacology, and drug development: progress and potential. Biochem Pharmacol 2001;62:1311-36.
- [34] Sato H, Ishida S, Toda K, Matsuda R, Hayashi Y, Shigetaka M, et al. New approaches to mechanism analysis for drug discovery using DNA microarray data combined with KeyMolnet. Curr Drug Discov Technol 2005;2:89-98.
- [35] Wang S, Cheng Q. Microarray analysis in drug discovery and clinical applications. Methods Mol Biol 2006;316:49-65.
- [36] Gomase VS, Tagore S, Kale KV. Microarray: an approach for current drug targets. Curr Drug Metab 2008;9:221-31.
  - Thomas RS, Rank DR, Penn SG, Zastrow GM, Hayes KR, [37] Pande K, et al. Identification of toxicologically predictive gene sets using cDNA microarrays. Mol Pharmacol 2001;60: 1189-94
- [38] Ganter B, Tugendreich S, Pearson CI, Ayanoglu E, Baumhueter S, Bostian KA, et al. Development of a large-scale

chemogenomics database to improve drug candidate selection and to understand mechanisms of chemical toxicity and action. J Biotechnol 2005;119:219-44.

- [39] Liguori MJ, Anderson MG, Bukofzer S, McKim J, Pregenzer JF, Retief J, et al. Microarray analysis in human hepatocytes suggests a mechanism for hepatotoxicity induced by trovafloxacin. Hepatology 2005;41:177-86.
- [40] Afshari CA, Nuwaysir EF, Barrett JC. Application of complementary DNA microarray technology to carcinogen identification, toxicology, and drug safety evaluation. Cancer Res 1999;59:4759-60.
- [41] Yengi LG. Systems biology in drug safety and metabolism: integration of microarray, real-time PCR and enzyme approaches. Pharmacogenomics 2005;6:185-92.
- [42] Whitfield ML, George LK, Grant GD, Perou CM. Common markers of proliferation. Nat Rev Cancer 2006;6:99-106.
- [43] Scherf U, Ross DT, Waltham M, Smith LH, Lee JK, Tanabe L, et al. A gene expression database for the molecular pharmacology of cancer. Nat Genet 2000;24:236-44.
- [44] Gunther EC, Stone DJ, Gerwien RW, Bento P, Heyes MP. Prediction of clinical drug efficacy by classification of druginduced genomic expression profiles in vitro. Proc Natl Acad Sci U S A 2003;100:9608-13.
- [45] Thomas RS, Penn SG, Holden K, Bradfield CA, Rank DR. Sequence variation and phylogenetic history of the mouse Ahr gene. Pharmacogenetics 2002;12:151-63.
- [46] Lamb J, Crawford ED, Peck D, Modell JW, Blat IC, Wrobel MJ, et al. The Connectivity Map: using gene-expression signatures to connect small molecules, genes, and disease. Science 2006;313:1929-35.
- [47] Lam CW, Lau KC, Tong SF. Microarrays for personalized genomic medicine. Adv Clin Chem 2010;52:1-18.
- [48] Smalley JL, Gant TW, Zhang SD. Application of connectivity mapping in predictive toxicology based on gene-expression similarity. Toxicology 2010;268:143-6.
- Cheng HM, Li CC, Chen CY, Lo HY, Cheng WY, Lee CH, [49] et al. Application of bioactivity database of Chinese herbal medicine on the therapeutic prediction, drug development, and safety evaluation. J Ethnopharmacol 2010:132:429-37.
- [50] Smyth GK, Speed T. Normalization of cDNA microarray data. Methods 2003;31:265-73.
- [51] Montaner D, Tárraga J, Huerta-Cepas J, Burguet J, Vaquerizas JM, Conde L, et al. Next station in microarray data analysis: GEPAS. Nucleic Acids Res 2006;34:W486-91.
- [52] Zhang B, Schmoyer D, Kirov S, Snoddy J. GOTree Machine (GOTM): a web-based platform for interpreting sets of interesting genes using Gene Ontology hierarchies. BMC Bioinformatics 2004;5:16-23.

Please cite this article in press as: Li C-C, et al., DNA microarray analysis as a tool to investigate the therapeutic mechanisms and drug development of Chinese medicinal herbs, (2012), doi:10.1016/j.biomed.2012.02.002

7