## **Report.**

# **ESF** exploratory workshop

### Workshop on genomic approaches to microarray data analysis

Held in the Centro Nacional de Investigaciones Oncológicas (CNIO), Madrid, Spain, in 30-31 October 2003

http://bioinfo.cnio.es/meetings/ESFWorkshopArrays03/

Organised by: Joaquín Dopazo, Ramón Díaz-Uriarte Bioinformatics Unit, Centro Nacional de Investigaciones Oncológicas (CNIO), Spain Alvis Brazma European Bioinformatics Institute, UK

Executive summary

This workshop focused on microarray data analysis with special stress on the state-ofthe-art methodologies and the available solutions implemented as methods or software, already available. The main topics for discussion were organized as five different sessions: I) **Databases and tools**, where standards and implementations for microarray data storage were presented. II) **Information mining and automatic annotation methods** where text-free and ontology-based approaches were discussed. III) **Experiment design and normalization**, where the necessity of making a proper design of the experiment and applying the appropriate normalization procedure so as experiments be comparable, was discussed. IV) **Data analysis, clustering, gene selection,** where different analysis procedures and some important statistical remarks were made. And V) **Gene networks,** where different methods for gene networks reconstruction, and the future of the field was discussed.

Regarding the solutions, several tools already implemented were presented and discussed. About data storage, MAGE-ML and the standard MIAME were mentioned. The database ArrayExpress, at the EBI, MIAME compliant, was a public repository for data storage. The EBI has its own resource for microarray data analysis, the EP, which covers mainly clustering problems, as well as some aspects of motif discovery in co-expressed genes. The GEPAS, developed at the CNIO, covered more topics, apart from clustering, which include gene selection, supervised clustering and datamining. As an example of LIMS, and integrated database management system, the BASE initiative was shown.

The workshop was held at the CNIO, whose the facilities (Auditorium, canteen, projection facilities, etc) were offered at no cost. This has been the first ESF meeting

held in the institution and it was really successful in terms of interest, attendance and scientific quality of the presentations and the discussion.

Two companies sponsorized the event in addition to ESF: Silicon Graphics (SGI, the computer's manufacturer) and BioAlma S.A, the first Spanish bioinformatics company. SGI took care of the dinners of the speakers and the farewell banquet and BioAlma made the folders and the documentation. Both companies were interested in possible bioinformatic applications in the field of functional genomics.

### Scientific content

This workshop brought experts from the areas of functional genomics, bioinformatics and computer science to discuss advances, challenges and opportunities in DNA microarray data analysis.

DNA microarray technology emerges as an essential tool for studying biological processes at genomic level but, at the same time, poses new challenges on the side of the analysis and storage of the huge amounts of data produced. Relevant issues in data analysis are: data processing, including image analysis, and normalization procedures; clustering and multiple correlation techniques are key for understanding the differences between experimental conditions or clinical outcomes; automatic information mining techniques are essential to transfer biological knowledge to genes, when thousands of them are involved in the study; finally, inference of gene networks is crucial in the knowledge on how the biological systems work.

The above mentioned issues were summarised in four sessions, namely:

- I) **Databases and tools**, where standards and implementations for microarray data storage were presented. Also The two most important packages for gene expression data analysis available over the web (EBI's EP cluster and CNIO's GEPAS) were presented.
- II) Information mining and automatic annotation methods. In this session, the two main trends for automatic use of information in microarray experiments, text-free and ontology-based were discussed. Both presented advantages and pitfalls, but it was obvious that some automation is needed for converting microarray experiments into knowledge. The package FatiGO, the most popular statistical framework for the use of GO terms in microarray experiments was discussed.
- III) Experiment design and normalization Without a proper experiment design, some results can be, simple, unachievable. In addition, normalization, necessary for a proper comparison of experiments, needs still of some developments. Also, the BASE software for data management and storage was presented within this context. Some plans for the expansion of BASE to more specialized data analysis subjects was discussed.
- IV) **Data analysis, clustering, gene selection**. Two hot topics were discussed here: the inclusion of information on regulation (mainly putative co-regulation bases in sharing putative transcription factor binding sites) and the proper statistical evaluation of the results. To avoid microarray experiments be a "fishing expedition" multiple-testing procedures must be used.
- V) **Gene networks**. Another emerging topic is the derivation of transcriptional gene networks. Several approaches were presented. Despite the complexity of this issue, there is a growing interest, because systems-biology approaches to the knowledge of living organisms require of the comprehension of the interactions among their parts.

The presentations covered several biological problems related to functional genomics and DNA microarray data analysis. They achieved a balance between the introduction of principles and methods and the discussion of applications. Moreover, they provided the audience with useful insights into the current state of the art, as well as emerging requirements. The meeting offered 21 presentations, 13 of them given by invited speakers.

#### Assessment of the results

This workshop has provided a broad vision of the field and promoted the exchange of experiences between researchers with different background. Experimental researchers have had the opportunity of learning from experts statisticians and bioinformaticians the state-of-the-art methodologies and, on the opposite, the first ones have transmitted to the second ones real problems and motivations for biomedical research.

One important factor for assessing the results of this event is the level and quality of discussion achieved during the workshop. Despite the multidisciplinary characteristics of the audience, participants actively expressed technical and conceptual concerns, discussed opportunities for improving solutions and shared expertise on different issues of interest for both system designers and users

This workshop has supported the consolidation of existing national and international collaborations by providing feedback and reviewing advances. It also represented an opportunity for the organisation of future meetings. Also it allowed some of the participants to discuss the development of new collaborations involving: Exchange of technical expertise, share of information resources and participation in existing projects. Furthermore, this meeting has significantly promoted potential interdisciplinary cooperation between bioscientists and computer scientists. Some of the participants would be interested in implementing activities such as research visits and exchanges. Options being considered include programmes such as the ESF travel fellowships, and funding provided by local or national organisations.

#### Final programme

#### Thursday, 30 October

9.00 <u>Registration</u>

9.15 <u>Welcome</u>

#### Session I. Databases and tools

**9.30** Alvis Brazma EBI-EMBL, UK Standards and public repository for microarray data ArrayExpress

*10.15* Javier Herrero Bioinformatics, CNIO, Spain. GEPAS, a package for DNA microarray data analysis

#### 11.00 Coffee break

#### Session II. Information mining and automatic annotation methods.

11.30 Jan Komorowski Uppsala University, The Linnaeus Centre for Bioinformatics, Sweden. Predicting Gene Ontology Biological Process From Temporal Gene Expression Patterns

*12.15* Alfonso Valencia, CNB-CSIC, Madrid Spain Text mining and expression data clustering

Oral communications

*13.00* Diego Araceli*13.15* Javier Tamames*13.30* Joaquín Dopazo

#### 14.00 Lunch

#### Session III. Experiment design and normalization

*15.30* Anja von Heydebreck, Max Planck Institute for Molecular Genetics, Berlin, Germany Error modeling, data transformation and robust normalization for microarray data

*16.15* Sandrine Dudoit Division of Biostatistics School of Public Health University of California, Berkeley, USA Resampling-based multiple testing procedures for identifying differentially expressed genes

*17.00* **Patrick Kemmeren.** Genomics Laboratory, UMC Utrecht The Netherlands. **Microarray data normalization** 

Oral communications

17.45 Javier de las Rivas

20.30 Dinner

Friday, 31 October

#### Session IV. Data analysis, clustering, gene selection

**9.30** Yves Moreau ESAT-SISTA/COSIC/DocArch, France Discovering cisregulatory modules

10.15 Mark van der Laan. Division of Biostatistics School of Public Health University of California, Berkeley, USA Cross-ValidatedDeletion/Substitution/Addition Algorithms in Regression

11.00 Yoav Benjamini. Department of Statistics, Tel Aviv University, Israel: False discovery rate control in complex microarray studies

Oral communications

*11.45* Ramón Díaz-Uriarte*12.15* Anat Reiner*12.30* Giorgio Valentini

13.00 Lunch

Session V. Gene networks

15.00 Ron Shamir School of Computer Science, Tel Aviv University, Israel. Computational dissection of regulatory networks using gene expression and other high throughput data

*15.45* Yoseph Barash School of Computer Science & Engineering, Hebrew University, Israel. Probabilistic Models for Identifying Regulation Networks

*16.30* Thomas Schlitt, EMBL-EBI. UK Identification of functional relationships between genes based on the comparison of gene networks.

Oral communications

*17.15* Francesco Falciani*17.45* <u>Closing</u>

Final list of participants

See accompanying excel file

Statistical information on participants.

The following figures show statistical information on participants: gender, country of origin, main scientific activity or background and age structure.

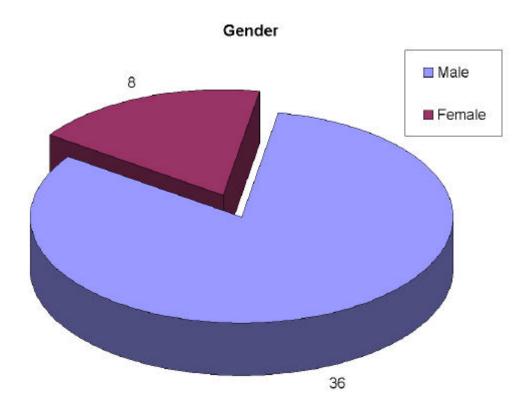
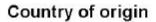


Figure 1. Statistical information on participants: Gender.



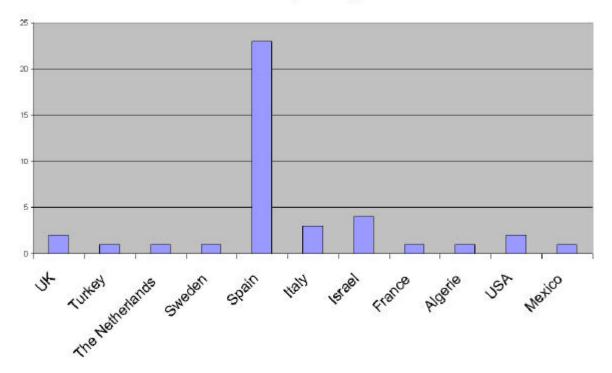


Figure 2. Statistical information on participants: Country of origin.

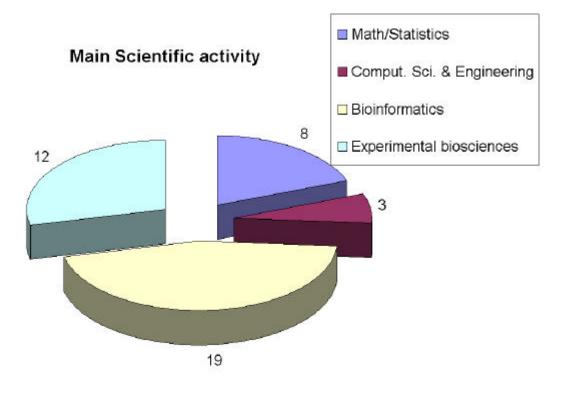


Figure 3. Statistical information on participants: Country of origin.

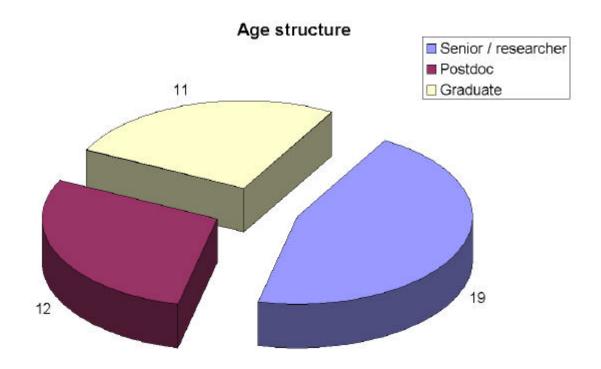


Figure 4. Statistical information on participants: Age structure.

NAN		POSITION	INSTITUTION	DEPARTMENT	ADDRESS	CITY	COUNTRY	TELEPHONE	FAX	E-MAIL
Jesús	Aguilar-Ruiz	Research Scientist	University of Seville	Computer Science	ETS Ingeniería Informática	Seville	Spain	34 954 55 38 71	34 954 55 71 39	aguilar@lsi.us.es
			Universidad Autonóma de							
Andrés	Alonso-Fernández	Postdoc	Madrid	Dpto. Matémáticas	Campus de Cantoblanco	Madrid	Spain	34 91 396 76 44	34 91 397 48 89	andres.alonso@uam.es
					Melchor Fernández Almagro, 3 -					
Fátima	Al-Shahrour		CNIO	Bioinformática	28029 Madrid	Madrid	Spain	91 224 69 00	91 224 69 72	falshahrour@cnio.es
ANT Diego	Arcelli	Postdoc	Università di Ferrara	Functional Genomics Lab	Via Fossato di Mortara 64/b	Ferrara	Itoly	39 0532291714	39 0532291533	diego.arcelli@unife.it
ANT Mukesh	Bansal	Graduate Student	ITC-irst	ECTRL	Via Ghiaie 20/23 - 38100 Trento	Trento	Italy Italy	39-33.35.02.50.57	39 055229 1555	mukesh jitk@vahoo.com
Yoseph	Barash	Graduale Student	Hebrew University	Computer Science	91904 - Jerusalem	Jerusalem	Israel	+972-2-658.4881/6757	+072-2-5617723	hoan@cs.huji.ac.il
roseph	Darash		Thebrew Oniversity		European Bioinformatics Institute -	Jerusalem	131461	1312-2-030.400110131	1312-2-3011123	noan@cs.ndji.ac.ii
					Wellcome Trust Genome Campus -					
Alvis	Brazma		EMBL Outstation Hinxton		Hinxton, Cambridge CB10 1SD	Cambridge	υĸ	+44-(0)1223 494658	+44-(0)1223 494468	brazma@ebi.ac.uk
Yoav	Benjamini		Tel Aviv University	Department of Statistics		Tel Aviv	Israel			ybenja@post.tau.ac.il
Mario	Cardaba Arranz		CNE	CNE	Pza. Rosa Chacel, 4	Valladolid	Spain	620 547 622		mcardaba@isciii.es
					Melchor Fernández Almagro, 3 -					
Lucía	Conde		CNIO	Bioinformática	28029 Madrid	Madrid	Spain	91 224 69 00	91 224 69 72	lconde@cnio.es
Ana	Conesa	Postdoc	IVIA	Centro de Genómica	Carretera Moncada - Náquera	Valencia	Spain	34 96 342 40 00	34 96 342 40 01	estecrepusculo@hotmail.com
					Universidad de Salamanca - CSIC,					
			Centro de Investigación del		Campus de Miguel de Unamuno -			34 923 29 47 20 / 620		
Javier	de las Rivas		Cáncer CIC		37007 - Salamanca	Salamanca	Spain	29 17 37	34 923 29 47 43	jrivas@usal.es
- <i>(</i>	5/				Melchor Fernández Almagro, 3 -					
Ramón	Díaz		CNIO	Bioinformática	28029 Madrid	Madrid	Spain	91 224 69 00	91 224 69 72	rdiaz@cnio.es
la a su da	Deser		CNIO	Bioinformática	Melchor Fernández Almagro, 3 - 28029 Madrid	Madrid	Spain	91 224 69 00	91 224 69 72	idopazo@cnio.es
Joaquín	Dopazo		University of California at	Bioinionnatica	28029 Mauliu	waunu	Spain	91 224 09 00	91 224 09 72	Juopazo(@chio.es
Sandrine	Dudoit		Berkeley	Division of Biostatistics		California	USA			sandrine@stat.berkelev.edu
Gandrine	Dudon		University of Birmingham /	Division of Diostatistics		Camornia	007			sandrine@stat.berkeley.edu
ANT Francesc	o Falciani	Research Director	School of Biosciences	ImmunoGenomics	Edgbaston	Birmingham	UK	44 (0) 121 414 30387		f.falciani@bham.ac.uk
					Melchor Fernández Almagro, 3 -	Binnightan	0.1	(0) 121 111 00001		
Javier	Galán		CNIO		28029 Madrid	Madrid	Spain	34 91 224 69 00		jgalan@cnio.es
					Melchor Fernández Almagro, 3 -					
Juan Fer	nando García	Research Scientist	CNIO	Lymphomas Unit	28029 Madrid	Madrid	Spain	34 91 224 69 08	34 91 224 69 23	jfgarcia@cnio.es
					Melchor Fernández Almagro, 3 -					
Javier	Herrero		CNIO	Bioinformatics Unit	28029 Madrid	Madrid	Spain	+34 91 224 69 00	+34 91 224 69 72	jherrero@cnio.es
				Department of Computer		Donostia-				
				Science and Intelligent		San				
NT Iñaki	Inza	Postdoc	University of the Basque Country		P.O. Box 649 - 20080 Donostia	Sebastián	Spain	34 943 01 50 26	34 943 21 93 06	ccpincai@si.ehu.es
Patrick	Kemmeren		UMC Utrecht	Genomics Lab	Postbus 85060 - 3508 AB	Utrecht	The Netherlands	+31-30-2538959	+31-30-2539035	P.P.C.W.kemmeren@med.uu.nl
			Uppsala University and The	The Line of the factor						
1	14	D'au de a	Swedish University of	The Linnaeus Centre for	BMC, Box 598 - Husargatan 3 - SE-	1.1	OWEDEN	. 40 40 474 00 00	. 40 40 474 00 00	
Jan	Komorowski	Director	Agricultural Sciences	Bioinformatics	751 24 Uppsala Melchor Fernández Almagro, 3 -	Uppsala	SWEDEN	+46 18 471 66 92	+46 18 471 66 98	Jan.Komorowski@lcb.uu.se
Luis	Lombardía	Research Scientist	CNIO	Genomic Analysis Unit	28029 Madrid	Madrid	Spain	34 91 224 69 00	34 91 224 69 72	llombardia@cnio.es
Luis	Lombardia	Research Scientist	CINIO	Department of	28029 Madrid	waunu	Spain	34 91 224 09 00	34 91 224 09 72	<u>nombardia@cmo.es</u>
			Centro Nacional de	Immunology and	Campus Universidad Autónoma de					
Luis	López Fernández		Biotecnología	Oncology	Madrid	Madrid	Spain	34 91 585 49 18	34 91 585 45 06	llfdez@cnb.uam.es
José Ran			Diotecnologia	Checkey	Pilar de Zaragoza, 47 - 6º A	Madrid	Spain	667 95 99 11	04 01 000 40 00	jr macias@terra.es
0000110					Melchor Fernández Almagro, 3 -	maana	opun			in madiad le tomation
Alvaro	Mateos Gil		CNIO	Bioinformática	28029 Madrid	Madrid	Spain	34 91 224 69 00	91 224 69 72	amateos@cnio.es
					Melchor Fernández Almagro, 3 -					
Pedro Pa	blo Medina Vico	Graduate Student	CNIO	Cáncer de Pulmón	28029 Madrid	Madrid	Spain	34 91 224 69 00		pmedina@cnio.es
			University of Sciences and			1	1	1	1	
Hanafi	Menouar		Technology			Oran	Algeria		213.41.39.84.35	hanafi951@yahoo.com
Yves	Moreau		ESAT-SISTA/COSIC/DocArch				France			moreau@esat.kuleuven.ac.be
Juan Car	los Oliveros		Alma Bioinformática							oliveros@almabioinfo.com
				Centro Nacional de						
Marina	Pollán	Research Scientist	Instituto de Salud Carlos III	Epidemiología	Sinesio Delgado, 6 - 28029 Madrid	Madrid	Spain	34 91 822 26 35	34 91 387 78 15	mpollan@isciii.es

#### LIST OF PARTICIPANTS ESF WORKSHOP ON GENOMIC APPROACHES TO MICROARRAY DATA ANALYSIS

	NAME	SURNAME	POSITION	INSTITUTION	DEPARTMENT	ADDRESS	СІТҮ	COUNTRY	TELEPHONE	FAX	E-MAIL
					Yoav Benjamini's						
GRANT	Anat	Reiner	Graduate Student	Tel-Aviv University	Statistics in Genetics Lab	69978	Tel-Aviv	Israel	972-3-640 53 86	972-3-640 93 57	anatr@post.tau.ac.il
				Facultat de Medicina i Ciències	Unitat de Recerca de	Universitat Rovira i Virgili - c/ San					
	Juliana	Salazar		de Salut	Lípids	Llorenç, 21 - 43201 Reus	Reus	Spain	977.75.93.18	977.75.93.22	jusb@fmcs.urv.es
						Melchor Fernández Almagro, 3 -					
	Javier	Santoyo		CNIO			Madrid	Spain	91 224 69 00	91 224 69 72	jsantoyo@cnio.es
						Wellcome Trust Genome Campus -					
	Tomas	Schlitt		EMBL-EBI Hinxton		CB10 1SD Cambridge		UK	+44-1223-494651		schlitt@ebi.ac.uk
GRANT	Osman	Sezerman		Sabanci University	Computational Biology	Sabanci University MDBF 34956	Istanbul	Turkey	90-216-483 95 13	90-216-483 95 50	ugur@sabanciuniv.edu
	Ron	Shamir		School of Computer Science		Tel Aviv University - 69978 Tel Aviv	Tel Aviv	Israel	+972-3-640-5383	+972-3-640-5384	rshamir@tau.ac.il
	Javier	Tamames		Alma Bioinformática							tamames@almabioinfo.com
	Amada	Torres	Graduate Student	IMSS-Mexico	Central de Instrumentos	Av. Cuauhtemoc, 3 30	Mexico D.F.	Mexico			torresa19@terra.com.mx
	Alfonso	Valencia		CNB-CSIC		Campus Universidad Autónoma de Madrid	Madrid	Spain	+34 91 5854570	+34 91 585 4506	valencia@cnb.uam.es
					DSI - Computer Science			•			
GRANT	Giorgio	Valentini	Postdoc	University of Milan	Dept.	Via Comelico 39	Milano	Italy	39 02 50 31 62 55	39 02 50 31 63 73	valentini@dsi.unimi.it
	¥			University of California at							
				Berkeley - School of Public							
	Mark	Van Der Laan		Health	Division of Biostatistics		California	USA			laan@stat.berkeley.edu
						Melchor Fernández Almagro, 3 -					
	Juan Manuel	Vaquerizas		CNIO	Bioinformática	28029 Madrid	Madrid	Spain	91 224 69 00	91 224 69 72	ivaquerizas@cnio.es
					Computational Molecular	l	L				
	Ms. Anja	Von Heydebreck		Molecular Genetics	Biology (Abt. Vingron)	Ihnestr. 73 - 14195 Berlin	Berlin	Germany	+49-30-8413-1168	+49-30-8413-1152	Anja.Heydebreck@molgen.mpg.de]