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# Toxicogenomics: The Use of 'Omics' to Better Understand the Impact of Adverse Effects from Environmental Exposures on Human Health

Richard S. Paules, Ph.D.

Toxicogenomics Facilitator and Director, NIEHS Microarray Group National Center for Toxicogenomics, NIEHS, NIH, DHHS, U.S.A.

The mission of the National Center for Toxicogenomics of the National Institute of Environmental Health Sciences of the U.S. National Institutes of Health is to utilize genomic approaches to investigate environmental effects on the etiology and progression of injury and disease processes. Thus a key goal is to design and conduct seminal studies that provide definition to and stimulate development of the field of toxicogenomics, integrating global "omics" approaches into conventional studies of toxicity and disease processes. Toxicogenomics, as defined by the NCT, combines genetics, genome-wide mRNA expression analysis (transcriptomics), cell and tissue-wide protein expression analysis (proteomics), and metabolite profiling (metabolomics) with conventional biology, physiology, pathophysiology and toxicology in an effort to understand adverse affects of gene-environment interactions on human health. Core to the NCT research strategy is the concept of phenotypic anchoring in which studies are designed to relate specific alterations in gene expression to specific adverse effects of environmental stresses defined by conventional parameters of toxicity and pathology such as clinical chemistry, histopathology, etc. To accomplish this task, studies have been designed that utilize a variety of agents that elicit a similar adverse response at a variety of doses and a variety of times of treatment that would elicit the full range of biological responses to those agents. In addition, attempts have been made to incorporate exposures to related but non-adverse agents when possible and to analyze biological responses in additional tissues that do not seem to suffer the same adverse effect (non-target tissue). When analysis of the experimental results implicates a critical role of a particular biological process or a critical role of a particular gene in the response, additional experiments are designed to test those hypotheses concerning their roles. Studies therefore are designed both to gain insight into mechanisms of injury and disease initiation and progression, and to establish signatures of adverse effects, linking gene expression alterations to specific parameters of well-defined 한국독성학회

indices of injury and disease to develop putative biomarkers. One aspect of this is to develop biomarkers that are reflective of incipient injury or disease before the culmination of severe injury or disease in order to develop true "predictive toxicology" through the use of toxicogenomics. Our strategy to accomplish this is to build a compendium of signatures linked to environmentally important patho-biological endpoints. In order to learn more about processes involved in acute liver injury and to investigate the true power of genomics to provide insight into mechanisms of injury as well as to provide profiles of processes of injury, we selected a single agent to focus our research efforts initially. Acetaminophen (APAP) was selected as an appropriate model hepatotoxicant due to the well-defined adverse phenotypic endpoints in the liver following toxic exposures, the similarities in metabolism between rodent and human and the relevance of exposure to humans. Studies were designed to test several hypotheses including whether genomic analyses of the liver could reveal indicators of incipient injury before that injury was manifested in such a severe manner as to be detected by traditional indices of liver injury. We were able to demonstrate that gene expression analysis can yield signatures of incipient toxicity after exposure to sub-toxic doses of the toxicant of interest (Heinloth et al., Toxicol. Sci., 80:193ff, 2004). In this manner, the NCT program is striving to integrate conventional biology, genetics, pathology and toxicology with emerging "omics" technologies in order to develop useful insights and potential biomarkers to aid in improving human health.

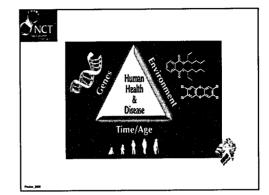




Toxicogenomics: The use of 'omics' to better understand the impact of adverse effects from environmental exposures on human health

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#### "Environment"

- · Industrial chemicals
- Agricultural chemicals
- Physical agents (e.g., UV, IR)
- By-products of combustion and industrial processes (e.g., dioxin)
- · Foods and nutrients
- Pharmaceuticals
- Lifestyle choices and substance abuse
- Social and economic factors
- Biological agents

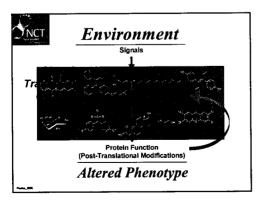
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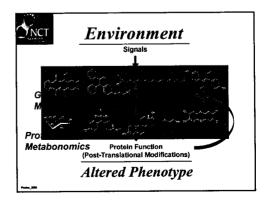


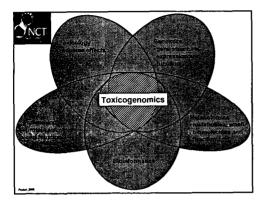
### Problems in Human Environmental Health Risk Assessment

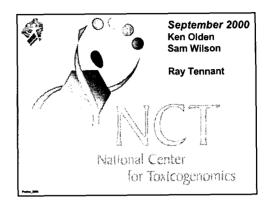
- · Susceptibility (one-size-fits-all)
- Extrapolation from animal models to human
- Exposure is now measured using indirect surrogates
- Intrinsic toxicity is not known for most of the chemical agents in the environment
- · Paucity of knowledge of mechanisms
- Use of <u>default assumptions</u>

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#### Research Opportunities for Toxicogenomics

- Genomic technologies provide an unprecedented opportunity to address highly intractable problems of toxicology and environmental health
- Assess the objective value of surrogate models for prediction of human health risk
- Identify biomarkers of incipient adverse effects
- Harness the results of diverse research efforts for the collective benefit
- · Provide a rational basis for risk assessment
- Facilitate the identification of specific susceptibility polymorphisms and relate them to environmental diseases



#### Research Challenges of Toxicogenomics

- · Difficulty in analysis of high density data
- Difficulty in integration of data obtained by different technologies
- Difficulty in linking "omics" data to specific adverse effects (phenotypic anchoring)
- Difficulty in translating statistical assessments into biological understanding
- Limitations of incomplete functional annotation of genome data bases
- Incomplete knowledge of functional pathways and networks, particularly trans-genome relationships
- Inadequate accessible data sources for informatic analysis



#### Fundamental Hypotheses

- Analyzing global gene expression changes will provide new insight into the mechanisms underlying adverse effects.
- Profiling global gene expression changes will provide signatures that will be highly correlative with and predictive of incipient adverse health effects from environmental stresses.

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## Main Objectives for the Development of Toxicogenomics

- Identify and understand mechanisms of toxicity - Discovery Toxicology
- Identification of biomarkers of toxicity
   Predictive Toxicology
- · Development of Knowledge-Base

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#### Main Objectives for the **Development of Toxicogenomics**

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#### Predictive Toxicogenomics Goals

- Develop Signature Patterns of Exposure from Toxicological Gene Expression Data Sets for use in Classifying Compounds
- Define Gene Expression Signatures Patterns of Toxicant-Induced Adverse Effects



#### Successful Application of Transcriptomics for Compound / Effect Classification

- Burczynski, ME, et al., (2000) Toxicological Sciences. 58(2):399-415.
- Bartoslewicz, M, et al., (2001) Environmental Health Perspectives. 109(1):71-4.
- Huang, Q, et al., (2001) Toxicological Sciences. 63(2):196-207.
- Hughes, TR, et al., (2000) Cell. 102(1):109-26.
- Hughes, TR, et al., (2001) Nature Biotechnology. 19(4):342-7. Harnadeh, HK, et al., (2002) Toxicologic Pathology. 30(4):470-82.
- nadeh, HK, et al., (2002) Toxicological Sciences. 67(2):232-40.
- Hamadeh, HK, et al., (2002) Toxicological Sciences, 67(2):219-31.
- Steiner, G. et al., (2004) Environmental Health Perspectives, 112(12):1236-48.
- Amin, RP, et al., (2004) Environmental Health Perspectives, 112(4):465-79.
- Heinloth, AN, et al., (2004) Toxicological Sciences. 80(1):193-202.
- Moggs, JG, et al., (2004) Environmental Health Perspectives. 112(16):1589-506.
- leonix (http://www.icon/roharm.com/)
- GeneLogic (http://www.genelogic.com/)

Hamadeh, et al., Gene expression analysis reveals chemical-specific profiles. Toxicological Sciences, 67, 219-231.

Peroxisome Proliferators

(Wyeth-14,643, Clofibrate, & Gemfibrozil)

Phenobarbital

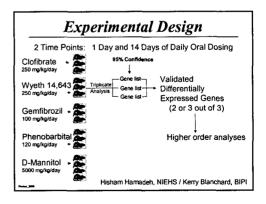
d-Mannitol

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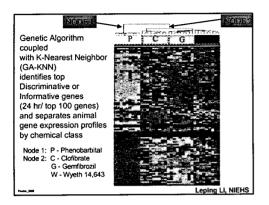
Hamadeh, et al., Prediction of compound high density gene signature using 2002. Toxicological expression profiling. Sciences, 67, 232-240.

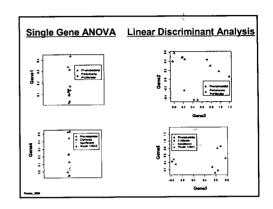
- · RNA samples derived from individual livers of chemically exposed rats were sent to NIEHS with identity blinded
- · Multiple bioinformatics tools were employed to classify compounds using previously derived data

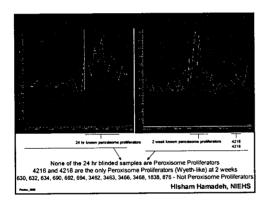
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| Sample | Prediction             | Time (days) |
|--------|------------------------|-------------|
| 616    | Phenobarbital-like     | 1           |
| 618    | PhenobarbitaHike       | 1           |
| 672    | PhenobarbitaHike       | 14          |
| 674    | PhenobarbitaHike       | 14          |
| 676    | PhenobarbitaHike       | 14          |
| 678    | PhenobarbitaHike, Weak | 14          |
| 688    | PhenobarbitaHike, Weak | 14          |
| 270    | Clofibrate/Wyeth-like  | 3           |
| 272    | Clofibrate/Wyeth-like  | 3           |
| 274    | Clofibrate/Wyeth-like  | 3           |
| 276    | Clofibrate/Wyeth-like  | 3           |
| 4216   | Wyeth-like             | 14          |
| 4218   | Wyeth-like             | 14          |

| Sample   | Prediction             | Actual                                       | Ti         | me (days)          |
|----------|------------------------|--|------------|--------------------|
| 616      | Phenobarbital-like     | High Dose Phenytoin                          | 1          | 1                  |
| 618      | Phenobarbital-like     | High Dose Phenytoin                          | 1          | 1                  |
| 672      | Phenobarbital-like     | High Dose Phenytoin                          | 1          | 14                 |
| 674      | PhenobarbitaHike       | High Dose Phenytoin                          | 1          | 14                 |
| 676      | Phenobarbital-like     | High Dose Phenytoin                          | 1          | 14                 |
| 678      | PhenobarbitaHike, Weak | High Dose Phenytoin                          | 1          | 14                 |
| 270      | Clofibrate/Wyeth-like  | High Dose DEHP                               | ✓          | 3                  |
| 272      | Clofibrate/Wyeth-like  | High Dose DEHP                               | ✓          | 3                  |
| 274      | Clofibrate/Wyeth-like  | High Dose DEHP                               | ✓          | 3                  |
| 276      | Clofibrate/Wyeth-like  | High Dose DEHP                               | 1          | 3                  |
| 4216     | Wyeth-like             | High Dose DEHP                               | 1          | 14                 |
| 4218     | Wyeth-like             | High Dose DEHP                               | 1          | 14                 |
| 688      | PhenobarbitaHike, Weak | High Dose Hexobarbital                       |            | 14                 |
| 0 Others | Not Phenobarbital-like | Hexobarbital, Low DEHP,<br>Controls Hisham H | √<br>amade | 1, 3, 14<br>h, NIE |

#### Limitations of Compound Classification

- Are all members of a "class" equivalent hazards?
- What to do with compounds that belong to more than one "class"?
- · What to do with novel compounds?
- · What to do with mixtures of compounds?

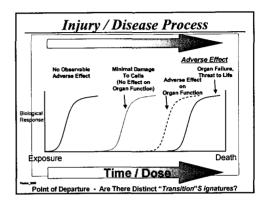
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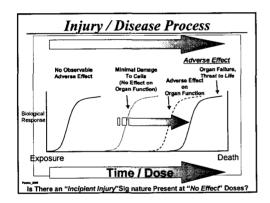


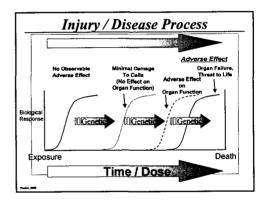
#### Predictive Toxicogenomics Goals

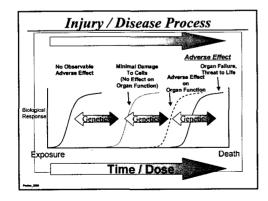
- Develop Signature Patterns of Exposure from Toxicological Gene Expression Data Sets for use in Classifying Compounds
- Define Gene Expression Signature Patterns of Toxicant-Induced Adverse Effects

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#### Phenotypic Anchoring of Expression Profiles

Hamadeh, et al., Methapyrilene toxicity: anchorage of pathologic observations to gene expression alterations. 2002. *Toxicologic Pathology* **30**, 470-482.

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Heinloth, et al., Gene expression profiling of rat livers reveals indicators of potential adverse effects. 2004. Toxicological Sciences, 80, 193-202.

NIEHS ToxPath Team

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#### Prototype: ACETAMINOPHEN

- · Human and rodent hepatotoxicant well-studied mechanism
- · Significant human exposure
- · Human dose range from pharmacological to lethal dose
- 56,000 Emergency room admissions (FDA; 2002)
- · > 500 life-threatening exposures with 100 fatalities per year
- · Clinical chemistry poor prognosticator of survival
- · Rodents and humans metabolize acetaminophen similarly

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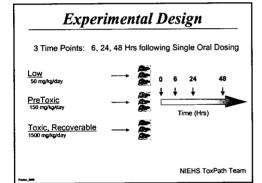


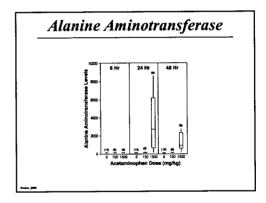
#### Prototype: ACETAMINOPHEN

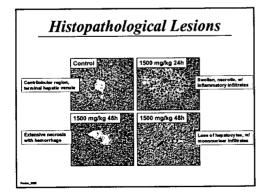
#### Hypotheses

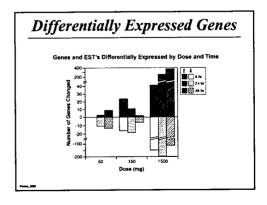
- A gene expression signature can be identified that will allow for discrimination between mild and severe liver injury from APAP exposure in rats.
  - 1.1. A gene expression signature can be identified that reveals incipient liver injury that manifests itself only at higher doses and/or at later times.
- A gene expression signature can be identified in rat blood (similar or dissimilar to that in liver) that will allow for discrimination between mild and severe liver injury from APAP exposure.
- A gene expression signature can be identified in human blood that will be similar to that identified in rat blood that will allow discrimination between mild injury, severe injury and irreversible liver failure following APAP intoxication.

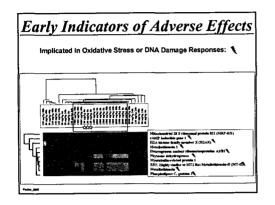
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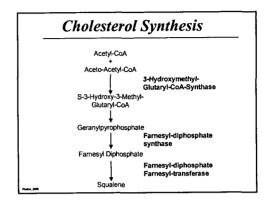


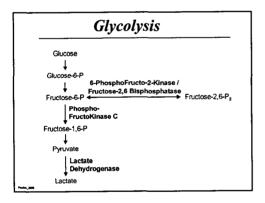


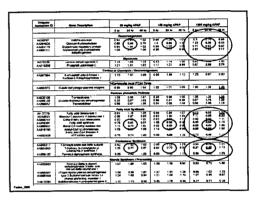


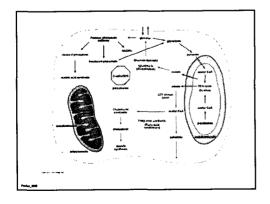


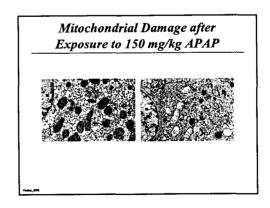


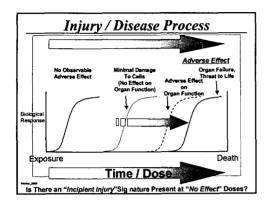


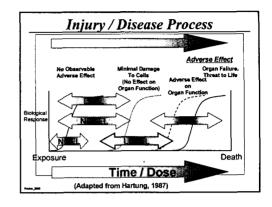


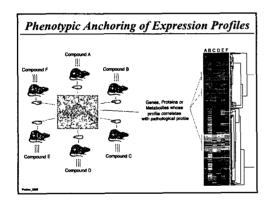


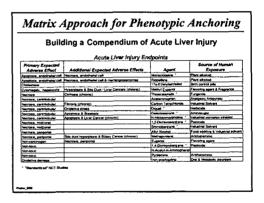




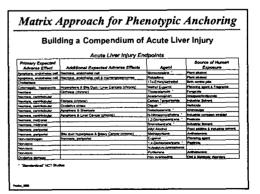






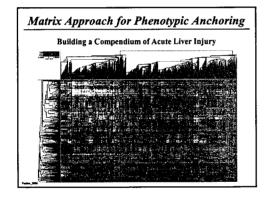


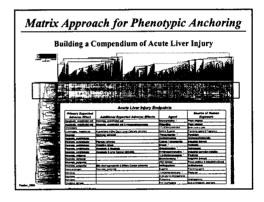
| Agent           | Source of Human<br>Exposure  |
|-----------------|--|
|                 | LAPORUTE   |
|                 | Plant alkaloid   |
|                 | Plant alkaloid   |
|                 | Birth control pills  |
|                 | Flavorina sours & Francisco  |
|                 | Fungecide  |
|                 | Analgesic Anapyrelic   |
|                 | Industrial Solvers   |
|                 | Merbicide  |
|                 | Americangus  |
|                 | insustrial comparism inhibitor   |
| Horoberzene '   | Perscide   |
| pergera         | Industrial Solveri   |
|                 | Food additive & industrial solve   |
| yrtene .        | Anthersmore  |
| of .            | Flavoring agent  |
| Horobergane '   | Pasticida  |
| vi-m-Ammonhensi |  |
|                 |  |
|                 | Anthesemnic  |
|                 | Eugenol Interrole Terrole Terrole Service Serv |

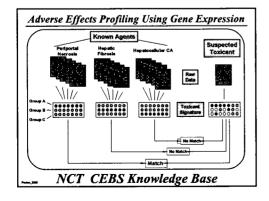


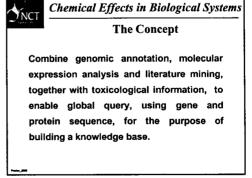
| Building a Compendium of Acute Liver Injury  Acute Liver Injury Endpoints |  |                        |                                   |
|---|--|------------------------|-----------------------------------|
| Primary Expected<br>Adverse Effect  | Additional Expected Adverse Effects                | Agent                  | Source of Human<br>Exposure       |
| Apoptosis, emigripalisi cell  | Nacrosia, andornana cell                           | Monecrataire           | Plant alkaloid                    |
|   | hisomeis, andotheliai cell & Hernangiosarcorres    | Riddelline             | Plant ellustrid                   |
| Cholestesia   |  | 17a-Epinylestradiol    | Beth oprirol pite                 |
| Cytomecely, hepetocyte  | Pryperplease & Bile Duct / Liver Concern (chronic) | Methyl Eugenal         | Flevoring agent & Fregrence       |
| Necmain   | Cirrhonia (chronic)                                | Thioscotemide *        | Fungicide                         |
| Necrosia, pereriobular  |  | Aceterorophen          | Analgesic Antipyretic             |
| Necroes, certriobuler   | Fibroris (chronic)                                 | Carbon Tetrachloride   | Industrial Solvent                |
| Necrous, pentriobular   | Oxidelive stress                                   | Orami *                | Herbickie                         |
| Necrosu certriobular  | Acortonia & Stantonia                              | Galacteanning *        | Amenoeuger                        |
| Necrosia, cereriobular  | Apoptosis & Liver Carroer (chrome)                 | 24-Nitrosomorpholing 1 | Industrial corregion inhibitor    |
| Necrosu, midzonal   |  | 1.2-Okthoroberzene *   | Pesticide                         |
| Necrosis, midzonal  |  | Bromobenzene '         | Industrial Solvers                |
| Necrosis perportal  |  | Allyl Alcohol          | Food additive & industrial polygo |
| Necrosis, periportal  | Bile duct hyperpherie & Billiany Cancer (chronic)  | Methopyriene           | Anthehenenc                       |
| Non-cercinogen  | Necross, periportal                                | Eugenol                | Flavoring agent                   |
| Non-toxic   |  | 1,4-Dichlorohenzene *  | Pentcide                          |
| Non-toxic   |  | N.Acetyl.m.Ammophenol  |                                   |
| Non-toxic   |  | Pyrilaming             | Arethmenec                        |
| Oxidetive demede  |  | Iron overloading .     | Diet & Metabolic disorders        |

| Building a Compendium of Acute Liver Injury  Acute Liver Injury Endpoints |  |   |  |
|---|--|---|--|
| Primary Expected<br>Adverse Effect  | Additional Expected Adverse Effects                | Agent   | Source of Human<br>Exposure            |
| Apostosis, endothelial cell   | Heoroete, endothelial call                         | Managerataling *  | Part states                            |
| Apostosia, endothelial cell   | Necrosis, endothelbi cell & Hernangiosarcomas      | Risdelline  | Plant alkeloid                         |
| Cholestone  |  | 17a-Ethnytestradiol   | Barth control piles                    |
| Cytomegaly, Negelocyte  | Hyperplesis & Bile Duct / Liver Concers (christic) | Methyl Eugenol  | Flavoring agent & Fragrance            |
| Hecroele  | Cirrhoeis (chronic)                                | Thiosoftwelde *   | Fungcise                               |
| Necroels, centrilobuler   |  | Acataminophen   | Analgesit/Antipyretic                  |
| Necrosis, centrilobuler   | Fibrosia (chronic)                                 | Carbon Tetrachioride  | trobustral Solvers                     |
| Necrosis, certriobular  | Culture street                                     | Olever .  | Herbicide                              |
| Necroels, contributation  | Apoptoels & Streetcete                             | Galactometra "  | Aminoeugar                             |
| Necrosia, custrilobular   | Agoptoes & Liver Cancer (chronic)                  | N-Nitrosomorpholine *   | industrial companies inhibitor         |
| Necrosis, midzonel  |  | 1,2-Dichlorobenzene   | Peuticide                              |
| Necrosis, midzonal  |  | Gremobertene '  | Industrial Schart                      |
| Necrosis, perspertal  |  | Altri Alcohol   | Food adolbre & Insustral servers       |
| Necrosie, periportal  | Bile duct hyperplease & Billery Cancer (chronic)   | Methopythere  | Anthersminis                           |
| Non-carcinogen  | Necrosis, periportal                               | Eugenol   | Flavoring agent                        |
| Non-teris   |  | 1.4 Dichlorobergene *   | Perticide                              |
|   |  | N Acetyl m Ammopherol   |  |
|   |  | Pyritamine  | Artificiationness                      |
| Non-toxic   |  |   |  |
| Necrole, perportal<br>Necrole, perportal<br>Non-ceromogen<br>Non-lovic    |  | Methapytiene Eugenol 1.4 Dichlorobergene N-Acetyl m-Amergahenol | Anthersment Fleroring sperii Pesticide |











#### **Conclusions**

- Genome-based technologies provide an unprecedented opportunity to explore the biological complexity underlying adverse effects.
- > While the opportunities are great, so are the challenges of being able to explore high density data.
- Progress will occur slowly and incrementally; a solid foundation for high quality data assimilation and analysis must be established.
- > The opportunity now exists for creating an information base which compiles the results of diverse individual studies into a compendium of chemical effects in biological systems that can be a resource for the scientific community.



#### NCT

- · Ray Tennant, NCT Director
- Mike Waters, Assist. Dir. CEBS

#### **NMG**

#### Current Jeff Tucker

- Jennifer Collins Danica Ducharme
- Rick Fannin Sherry Grissom Stella Sieber Todd Auman Kevin Gerrish
- Alexandra Heinloth
- Pierre Bushel Jeff Chou Jianying Li "Jonathan Miller

#### <u>Past</u>

- Cindy Afshari Hisham Hamade Emile Nuwaysir Rupesh Amin Lee Bennett
- J. Carl Barrett

# Boehringer-Ingelheim Ray Stoll Kerry Blanchard Supriya Jayadev

#### NCT ToxPath

Alexandra Heinloth Gary Boorman Mike Cunningham Julie Foley Rick Irwin Leping Li Alex Merrick Paul Nettesheim

Nigel Walker

SAS Institute · Russ Wolfinger

Molecular Mining
Steve Misener