Using metabolomics with neonatal blood spots to discover causes of childhood leukemia

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Center for Integrative Research on Childhood Leukemia and the Environment

CEB Center For Exposure Biology Known or suspected causes of childhood leukemia (mostly ALL)

- Genes (< 10% of risk)
- Exposures

 Associations with radiation, paternal smoking and some environmental chemicals

Early life exposures important

 Identical twins diagnosed as infants have very high concordance rates

Most ALLs diagnosed before age 5

Age at diagnosis of CL

- Approximately 2,500 new cases per/year among children <15 years in the US
- Highest rates in Whites, Hispanics, and males

Figure 4. Age-specific Incidence Rates of Acute Lymphocytic Leukemia (ALL) by Race/ethnicity and Acute Myeloid Leukemia (AML) All Races Combined, 2001-2010



Source: Surveillance, Epidemiology, and End Results (SEER) Program, 18 SEER Registries, National Cancer Institute.

Cancer Facts & Figures 2014: Special Addition, ACS

The blood exposome

EPIDEMIOLOGY

Environment and Disease Risks

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lthough the risks of developing chronic diseases are attributed to both genetic and environmental factors, 70 to 90% of disease risks are probably due to differences in environments (1-3). Yet, epidemiologists increasingly use genomewide association studies (GWAS) to investigate diseases, while relying on questionnaires to characterize "environmental exposures." This is because GWAS represent the only approach for exploring the totality of any risk factor (genes, in this case) associated with disease prevalence. Moreover, the value of costly genetic information is diminished when inaccurate and imprecise environmental data lead to biased inferences regarding gene-environment interactions (4). A more comprehensive and quantitative view of environmental expo-

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sure is needed if epidemiologists are to discover the major causes of chronic diseases.

An obstacle to identifying the most important environmental exposures is the fragmentation of epidemiological research along lines defined by different factors. When epidemiologists investigate environmental risks, they tend to concentrate on a particular category of exposures involving air and water pollution, occupation, diet and obesity, stress and behavior, or types of infection. This slicing of the disease pie along parochial lines leads to scientific separation and confuses the definition of "environmental exposures." In fact, all of these exposure categories can contribute to chronic diseases and should be investigated collectively rather than separately.

To develop a more cohesive view of environmental exposure, it is important to recognize that toxic effects are mediated through

aging, infections, life-style, stress, psychosocial factors, and preexisting diseases. The term "exposome" refers to the total-

> ity of environmental exposures from conception onwards, and has been proposed to be a

A new paradigm is needed to assess how a

lifetime of exposure to environmental factors affects the risk of developing chronic diseases. chemicals that alter critical molecules, cells, and physiological processes inside the body. Thus, it would be reasonable to consider the "environment" as the body's internal chemical environment and "exposures" as the amounts of biologically active chemicals in this internal environment. Under this view, exposures are not restricted to chemicals (toxicants) entering the body from air, environment water, or food, for example, but also include chemicals produced by inflammation, oxidative stress, lipid peroxidation, infections, gut flora, and other natural processes (5, 6) (see the figure). This internal chemical environment continually fluctuates during life due to changes in external and internal sources, External DRUG

RADIATION

61 POLLUTION

Internal

chemical

environment

Xenobiotics

Inflammation

Preexisting disease

Lipid peroxidation

Oxidative stress

Gut flora

EXPOSURES ARE CHEMICALS and the blood exposome includes all chemicals in the bodv.

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Chemical communication



Archived neonatal dried blood spots (ANBS) contain information about the fetal exposome



- Collected from 98% of newborns in the united states, 24-48 hours after birth
- Used to test for congenital disorders
- If stored, can be used in epidemiological studies
- Unique and important biospecimen for understanding causes of pediatric disease

Scheme for performing exposomics with ANBS



Untargeted metabolomics and adductomics

Yukiko Yano

LC-High resolution mass spectrometry



Lauren Petrick

Small molecules in ANBS (100 CL cases & matched controls)

Small-molecule features	ESI (-) mode
Detected	66,096
After filtering (fold change above background > 5)	8,852
Features with CV < 20%	3,919
Testable clusters	665

A glimpse of the fetal exposome







Microbial metabolites

Nucleotide Phosphate Sulphate MS2-matched feature

Tests of association with childhood leukemia (n =665 Features after filtering)



Courtney Schiffman Lauren Petrick Sandrine Dudoit Machine learning algorithms (lasso & random forests) selected the same 7 discriminating molecules

Findings

 Seven small molecules in ANBS predict childhood leukemia status in a learning sample
Molecular identities are being confirmed
Currently repeating analysis with a validation sample of ANBS (100 cases/100 controls)

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