





## Functionalizing the Cancer Genome

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Disclosure

AVEO Pharmaceuticals: co-founder and advisor Metamark Genetics: founder, director and advisor Eden; Epizyme; Agios: Consultants; GSK: Sponsored Research; Merck; sanofi-aventis: Corporate alliance partnerships

## Major Goals in Cancer Medicine

- Prevention
- Detection
- Intervention

### **Genome Science**





### **Personalized Medicine**



### **Impacting on Cancer Medicine**



Chin et al "Cancer Genomics: from discovery science to personalized medicine" Nature Medicine in press

## **Potential of Cancer Genomics**

- Enable prevention
  - Understanding the underlying etiology  $\rightarrow$  strategy
- Facilitate early detection õ
  - Identify risk alleles / genomic events for screening
  - Early events may be detectable in serum or by imaging
- Guide evidence-based interventionõ
  - Stratify high vs low risk patients to treat or not
  - Identify new therapeutic targets for drug discovery
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  - Define combination / co-extinction strategies

### Personalized Cancer Medicine



NCAB Sept 8, 2010

## **TCGA Phase II**



Kenna Shaw, NCI

## **TCGA Phase II Projects**

THE CANCER GENOME ATLAS

| Brain         | GBM and low-grade gliomas   |  |  |  |  |
|---------------|---|--|--|--|--|
| Breast        | Ductal & lobular breast adenocarcinomas                                     |  |  |  |  |
| Stomach       | Intestinal-type gastric adenocarcinoma                                      |  |  |  |  |
| Liver         | Hepatocellular carcinoma  |  |  |  |  |
| Intestine     | Colon and rectal adenocarcinomas  |  |  |  |  |
| Gynecologic   | Serous ovarian adenocarcinoma; endometrial and cervical squamous carcinomas |  |  |  |  |
| Prostate      | Prostate adenocarcinoma   |  |  |  |  |
| Bladder       | Non-papillary bladder cancer  |  |  |  |  |
| Head and Neck | Squamous cell and thyroid papillary carcinomas                              |  |  |  |  |
| Hematopoietic | Acute myeloid leukemia  |  |  |  |  |
| Skin          | Metastatic cutaneous melanoma   |  |  |  |  |
| Lung          | Non-small cell lung cancer, adenocarcinoma and squamous subtypes            |  |  |  |  |
| Kidney        | Renal clear cell and renal papillary carcinomas                             |  |  |  |  |
| Pancreas      | Pancreatic adenocarcinoma   |  |  |  |  |

### **Active Tumor Projects**

#### Timeline to Completion of Comprehensive Analysis for Each Tumor Project



### **Massively Parallel Sequencing**

The Cancer Genome Atlas 🌐





### Scale of Growth is unprecedented





The Cancer Genome Atlas 🌐

### **TCGA Phase II Research Network**

The Cancer Genome Atlas 💮



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#### Summary of TCGA Tumor Data Ingested into Broad GDAC Pipeline 01/14/2011 Run

| TumorType | Biosp ecim en | Any_Level_1 | Clinical | CNA  | Methylation | mRNA | miR | MAF |
|-----------|---------------|-------------|----------|------|-------------|------|-----|-----|
| BRCA      | 346           | 186         | 244      | 265  | 186         | 280  | 0   | 0   |
| COAD      | 203           | 151         | 130      | 137  | 167         | 155  | 0   | 64  |
| GBM       | 508           | 448         | 490      | 466  | 288         | 444  | 415 | 169 |
| HNSC      | 39            | 0           | 0        | 0    | 0           | 0    | 0   | 0   |
| KIRC      | 355           | 39          | 19       | 254  | 219         | 41   | 0   | 0   |
| KIRP      | 48            | 39          | 0        | 16   | 36          | 41   | 0   | 0   |
| LAML      | 202           | 0           | 0        | 0    | 188         | 0    | 0   | 0   |
| LGG       | 30            | 0           | 0        | 0    | 0           | 0    | 0   | 0   |
| LUAD      | 128           | 21          | 11       | 56   | 128         | 33   | 0   | 0   |
| LUSC      | 160           | 116         | 42       | 117  | 133         | 116  | 0   | 0   |
| ov        | 584           | 570         | 532      | 519  | 425         | 519  | 566 | 384 |
| READ      | 79            | 52          | 72       | 51   | 69          | 69   | 0   | 12  |
| STAD      | 82            | 35          | 0        | 81   | 82          | 0    | 0   | 0   |
| UCEC      | 145           | 24          | 0        | 114  | 70          | 0    | 0   | 0   |
| Totals    | 2909          | 1681        | 1540     | 2076 | 1991        | 1698 | 981 | 629 |

### Status of TCGA Analysis Pipeline (Jan 14, 2010 Run)

Mike Noble; Doug Voet



### Complete catalogues will be generated

# **Complete Compendia** THE CANCER GENOME ATLAS ICGC What does it take?



#### Cancer Cell Article

The Cancer Genome Atlas 🕀

### Integrated Genomic Analysis Identifies Clinically Relevant Subtypes of Glioblastoma Characterized by Abnormalities in *PDGFRA*, *IDH1*, *EGFR*, and *NF1*

Roel G.W. Verhaak,<sup>1,2,17</sup> Katherine A. Hoadley,<sup>3,4,17</sup> Elizabeth Purdom,<sup>7</sup> Victoria Wang,<sup>8</sup> Yuan Qi,<sup>4,5</sup> Matthew D. Wilkerson,<sup>4,5</sup> C. Ryan Miller,<sup>4,6</sup> Li Ding,<sup>9</sup> Todd Golub,<sup>1,10</sup> Jill P. Mesirov,<sup>1</sup> Gabriele Alexe,<sup>1</sup> Michael Lawrence,<sup>1,2</sup> Michael O'Kelly,<sup>1,2</sup> Pablo Tamayo,<sup>1</sup> Barbara A. Weir,<sup>1,2</sup> Stacey Gabriel,<sup>1</sup> Wendy Winckler,<sup>1,2</sup> Supriya Gupta,<sup>1</sup> Lakshmi Jakkula,<sup>11</sup> Heidi S. Feiler,<sup>11</sup> J. Graeme Hodgson,<sup>12</sup> C. David James,<sup>12</sup> Jann N. Sarkaria,<sup>13</sup> Cameron Brennan,<sup>14</sup> Ari Kahn,<sup>15</sup> Paul T. Spellman,<sup>11</sup> Richard K. Wilson,<sup>9</sup> Terence P. Speed,<sup>7,16</sup> Joe W. Gray,<sup>11</sup> Matthew Meyerson,<sup>1,2</sup> Gad Getz,<sup>1</sup> Charles M. Perou,<sup>3,4,8</sup> D. Neil Hayes,<sup>4,5,\*</sup> and The Cancer Genome Atlas Research Network



## What is driving the molecular difference among subtypes?



The most significant difference is observed between PN and MS subtypes

## **CLR-** Context Likelihood of Relatedness

- Faith et al, PLoS Biology, 2007
- Extension of relevance networks
- Based on Mutual Information scores



## Define miRNA-mRNA regulatory network

## microRNA expression matched samples mRNA expression 194 TCGA Glioblastoma data 534 miRNA, 19692 mRNAs



→ 29610 edges: 252 miRNA and 7373 mRNAs

# A subset of the miRNAs show strong correlations with subtype signature genes



17 miRNA with strong correlations with the proneural and mesenchyaml signature genes

# miR34a as a candidate determinant of PN molecular subtype

- Integration with copy number reveals miR34a resides in region of loss
- miR34a is low in PN subtype GBM
- PN signature is enriched for miR34a edges defined by CLR

## miR34a is tumor suppressive in human GBM models *in vivo*





## How does miR34a regulate the **PN/MS** transcriptomic signatures? miRNA TF 3qUTR Luciferase reporter . direct regulation of PDGFRa and DLL1 by miR34a Modulation of miR34a regulates PDGFRa and DLL1 (as well as Notch downstream targets) in human astrocytes and GBM cells → Relevance? TARGET GENES (CLR Edges)

#### Chromosomal and genetic aberrations involved in the genesis of glioblastoma.



Furnari F B et al. Genes Dev. 2007;21:2683-2710

CSH PRESS

# TCGA GBM cohort shows enrichment of NOTCH in Classical and PN subtypes

## p53 and Pten loss in neural progenitor cells results in malignant gliomas



42/57 (73%) p53L/L Pten L/+ mice:
Acute neurological symptoms
28 Grade III; 14 Grade IV
astrocytic morphology (95%)
diffuse & proliferative
necrosis
glioma markers

Zheng (DePinho), Nature 2008





## Pdgfra overexpression is a hallmark of mouse PN GBMs



<sup>(</sup>Zheng et al., Nature 2008)

- miR34a modulates Pdgfra expression
- Pdgfra is functionally epistatic to miR34a

## miR34a-low GEMM tumors show Notch activation in vivo

 miR34a modulates Notch activity and its downstream target gene expression

## miR34a is a determinant of PN molecular phenotype in GBM

- Integrative genomic data set enables
  - network modeling to generate testable hypothesis
  - development of framework for understanding complex cancer genomics data
- miR34a defines a subset of GBM with concurrent PDGFRa and Notch activation



Drug and biomarker discovery and development Genomics-informed clinical trials Regulatory and commercial challenges

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Early-staged patients make up the majority of US cancer diagnoses



doi:10.1038/nature09677

## SMAD4-dependent barrier constrains prostate cancer growth and metastatic progression

Zhihu Ding<sup>1,2,3,4</sup>, Chang-Jiun Wu<sup>1,2,3,4</sup>\*, Gerald C. Chu<sup>1,2,5</sup>\*, Yonghong Xiao<sup>1,2</sup>, Dennis Ho<sup>1,2,3,4</sup>, Jingfang Zhang<sup>6</sup>, Samuel R. Perry<sup>1,2</sup>, Emma S. Labrot<sup>1,2</sup>, Xiaoqiu Wu<sup>2,7</sup>, Rosina Lis<sup>2,7</sup>, Yujin Hoshida<sup>8,9</sup>, David Hiller<sup>10</sup>, Baoli Hu<sup>1,2</sup>, Shan Jiang<sup>1,2</sup>, Hongwu Zheng<sup>1,2,3,4</sup>, Alexander H. Stegh<sup>1,2,3,4</sup>, Kenneth L. Scott<sup>1,2,3,4</sup>, Sabina Signoretti<sup>11</sup>, Nabeel Bardeesy<sup>12</sup>, Y. Alan Wang<sup>1,2</sup>, David E. Hill<sup>3,13</sup>, Todd R. Golub<sup>8,9</sup>, Meir J. Stampfer<sup>15,16,17</sup>, Wing H. Wong<sup>10</sup>, Massimo Loda<sup>2,5,7</sup>, Lorelei Mucci<sup>15,17</sup>, Lynda Chin<sup>1,2,3,4,14</sup> & Ronald A. DePinho<sup>1,2,3,4</sup>

#### In Physicianc Health Cohort (n=405)

- <sup>77</sup> 4-marker outperforms Gleason in predicting lethal disease
  - " Gleason-only C Index = 0.774;
  - 4-marker only C Index = 0.829

#### <sup>"</sup> Carries molecular information not captured by clinical parameters

<sup>"</sup> 4-marker + Gleason C Index =0.882, p = 0.015 for improvement

# Metastatic potential of a primary tumor can be determined early on in evolution





Adapted from: Rethinking Screening for Breast and Prostate Cancer. JAMA, 2009

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