## Systems Medicine

MMG 835, SPRING 2016 Eukaryotic Molecular Genetics

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### Future of Genomics

THE INTERNATIONAL WEEKLY JUBBANAL OF SCIENCE

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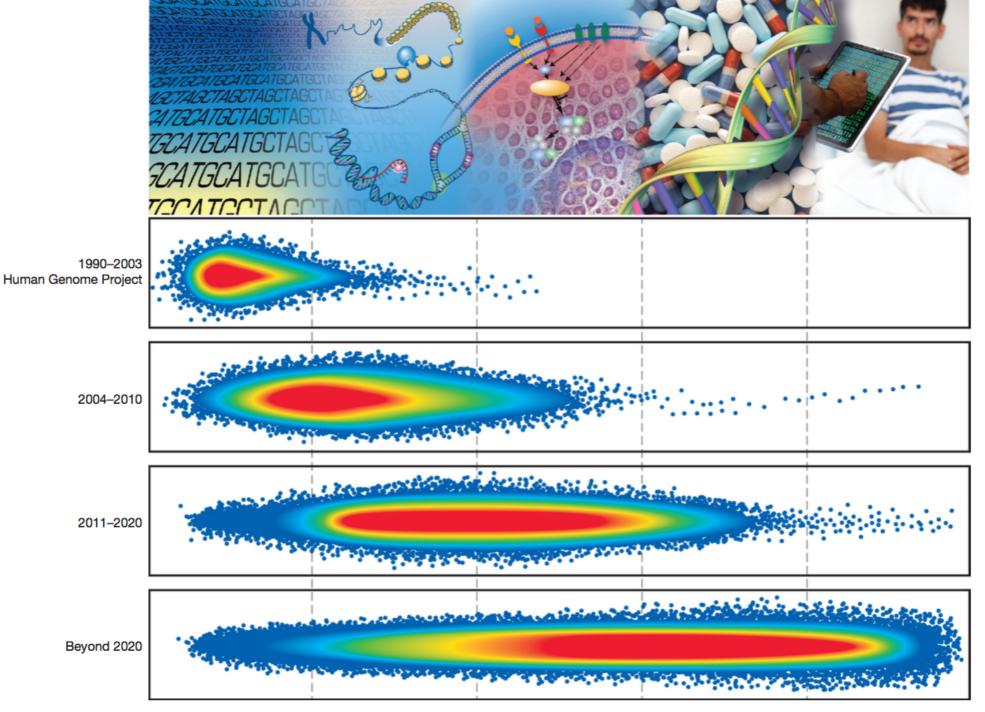
Reflections on the first tenyears of the human genomics age

WINDER

THE END OF THE BEGINNING
THE BEGINNING
THE END OF THE BEGINNING
THE

Understanding the structure of genomes

Understanding the biology of genomes Understanding the biology of disease Advancing the science of medicine Improving the effectiveness of healthcare



#### 2015: Precision Medicine

#### Initiative

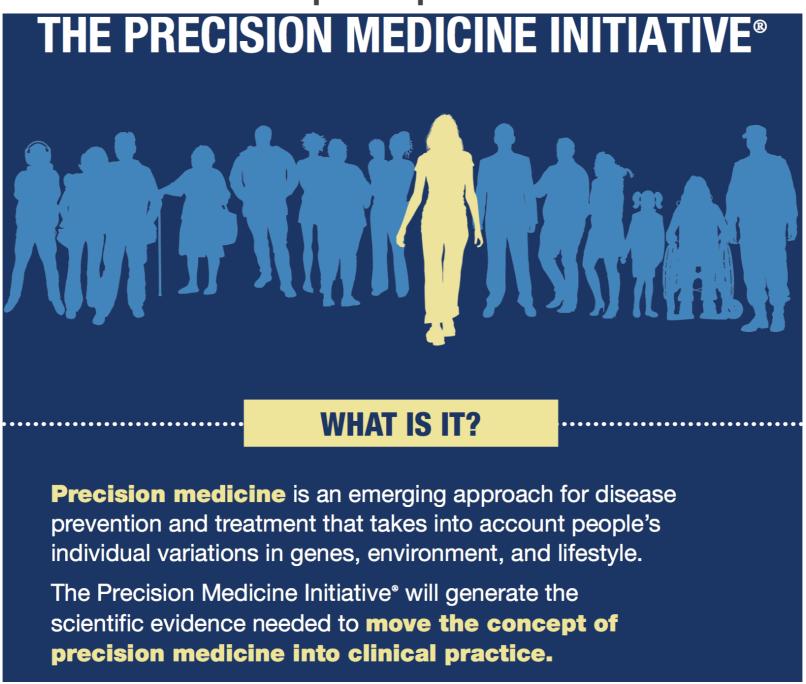
I want the country that eliminated polio and mapped the human genome to lead a new era of medicine — one that delivers the right treatment at the right time. In some patients with cystic fibrosis, this approach has reversed a disease once thought unstoppable. Tonight, I'm launching a new Precision Medicine Initiative to bring us closer to curing

diseases like cancer and diabetes — and to give all of us access to the personalized information we need to keep ourselves and our families healthier." *President Barak Obama, State of the Union, 2015* 



#### Precision Medicine Initiative

1 million participant research

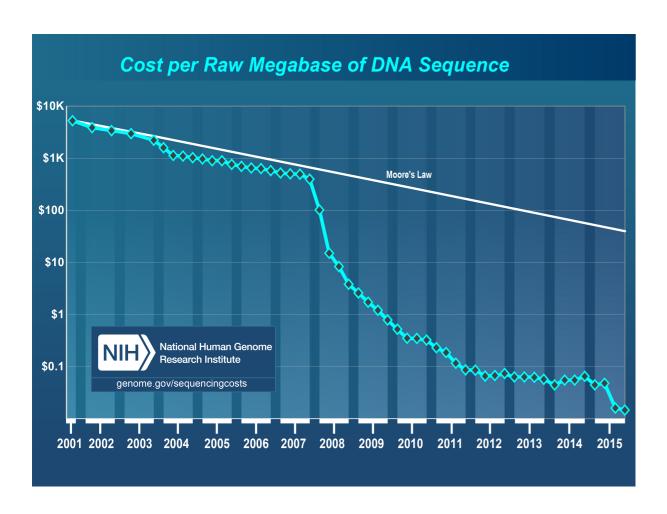


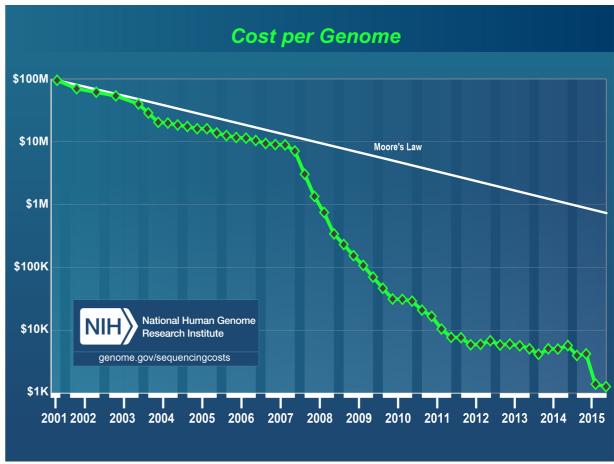
http://www.nih.gov/news-events/multimedia-nih-framework-points-way-forward-building-national-large-scale-research-cohort Credit: NIH

#### Precision Medicine Initiative

- Develop ways to <u>measure risk</u> for a range of diseases based on <u>environmental exposures</u>, <u>genetic factors</u> and <u>interactions</u> between the two;
- Identify the causes of individual differences in response to commonly used drugs (commonly referred to as <u>pharmacogenomics</u>);
- Discover <u>biological markers</u> that signal increased or decreased risk of developing common diseases;
- Use <u>mobile health</u> (<u>mHealth</u>) technologies to correlate activity, physiological measures and environmental exposures with health outcomes;
- Develop <u>new disease classifications</u> and relationships;
- **Empower study participants** with data and information to improve their own health; and
- Create a platform to enable trials of targeted therapies.

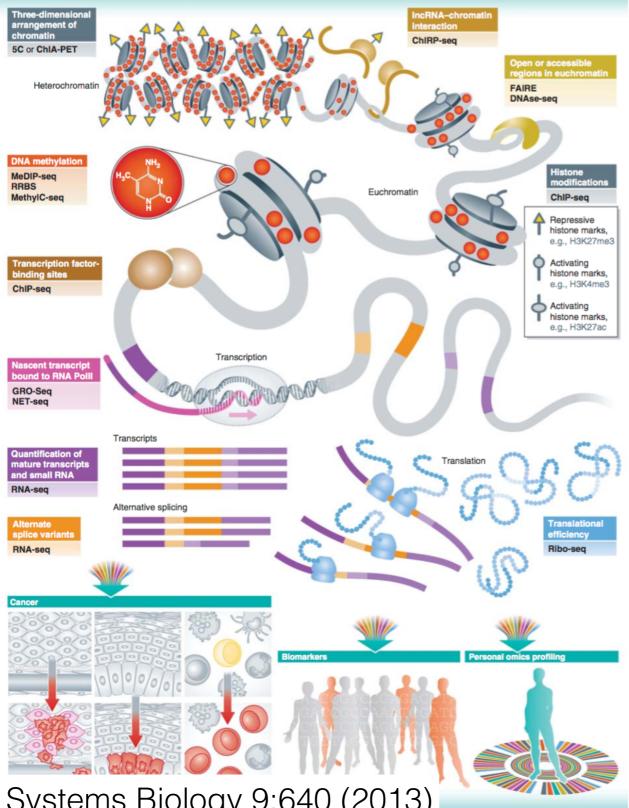
## Cost of Sequencing





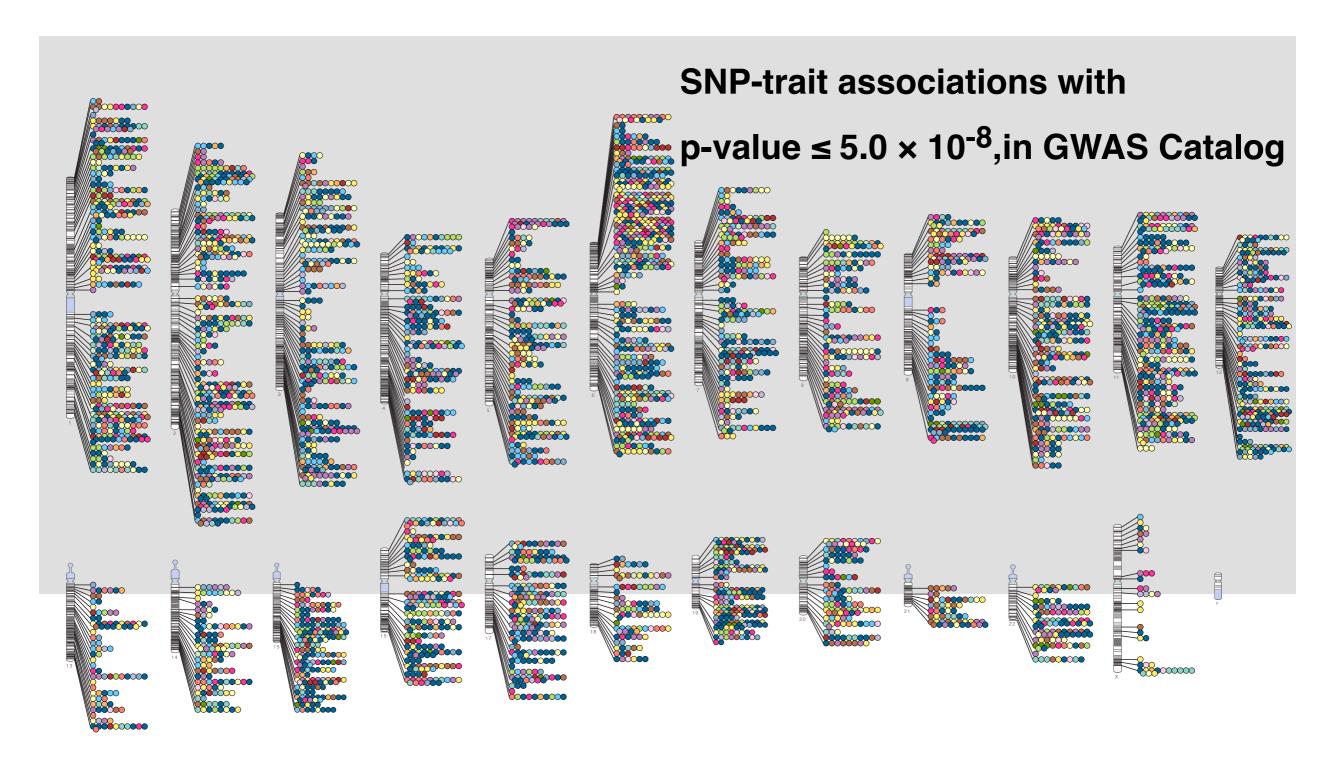
Wetterstrand KA. DNA Sequencing Costs: Data from the NHGRI Genome Sequencing Program (GSP) Available at: www.genome.gov/sequencingcosts. Accessed 3/25/16.

Complete Genome Information



Song & Snyder, Molecular Systems Biology 9:640 (2013)

#### GWAS



]http://www.ebi.ac.uk/gwas/diagram (4/2016)

### GWAS

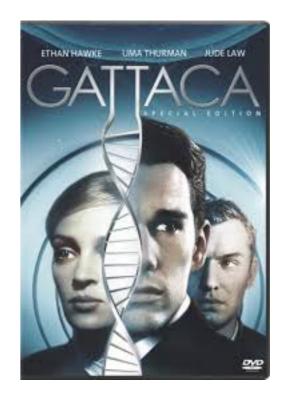
Digestive system disease 422
Cardiovascular disease 170
Metabolic disease 142
Immune system disease 454
Nervous system disease 423
Liver enzyme measurement 65
Lipid or lipoprotein measurement
Inflammatory marker measurement 35

Hematological measurement	302
Body weights and measures	388
Cardiovascular measurement	217
Other measurement	1486
Response to drug	113
Biological process	111
Cancer	402
Other disease	315
Other trait	208

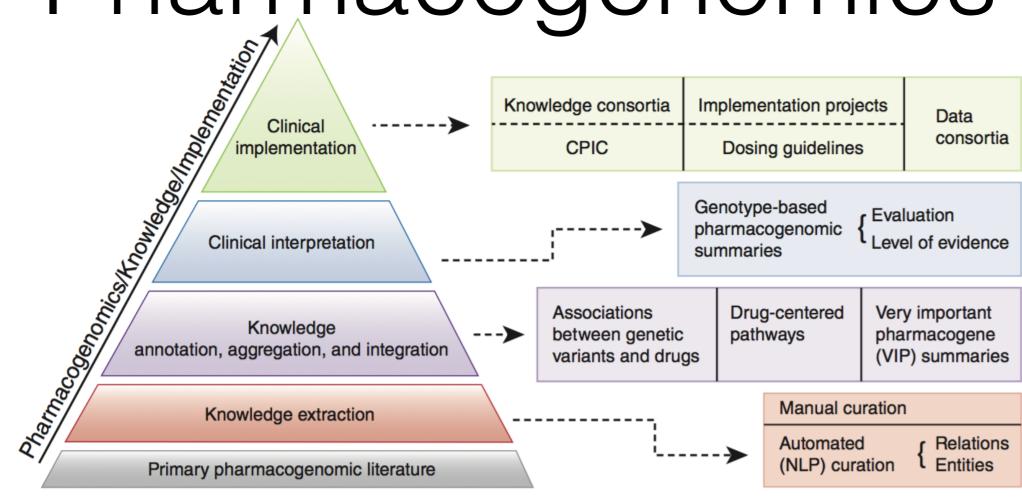
## Genetic Screening

- · When?
- Pre-conception
- Pre-natal testing
- Newborns
- Predictive Diagnostic screening (before symptoms?)
- Predisposition Screening
- What for?
- Disease risk
- Carriers
- Diagnosis
- Treatment
- Pharmacogenomics

- Patient rights to know
- Genetic Counseling
- Family Considerations
- Confusion
- Changing Information
- What is actionable?
- Who owns the data?



- Protection of Subjects
- Discrimination
- Genetic Information Nondiscrimination Act (GINA, 2009)
- Personal Information
- Who owns the data?



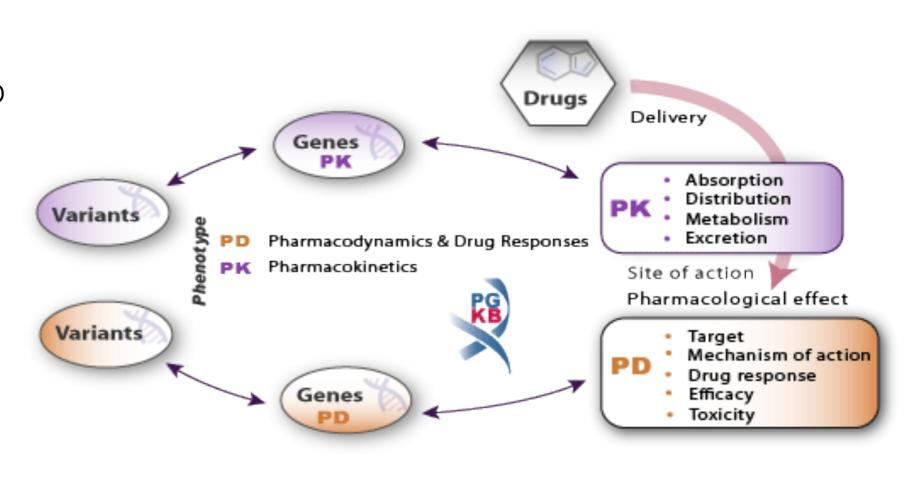
- Pharmacogene = a gene involved in the response to a drug
- Pharmacogenetics = the study of genetic influence on drug response, typically one or only a few genes involved
- Pharmacogenomics = the study of how genomic variation influences drug response, looking at variation across the genome

#### https://www.pharmgkb.org/page/overview

#### PharmGKB offers different information

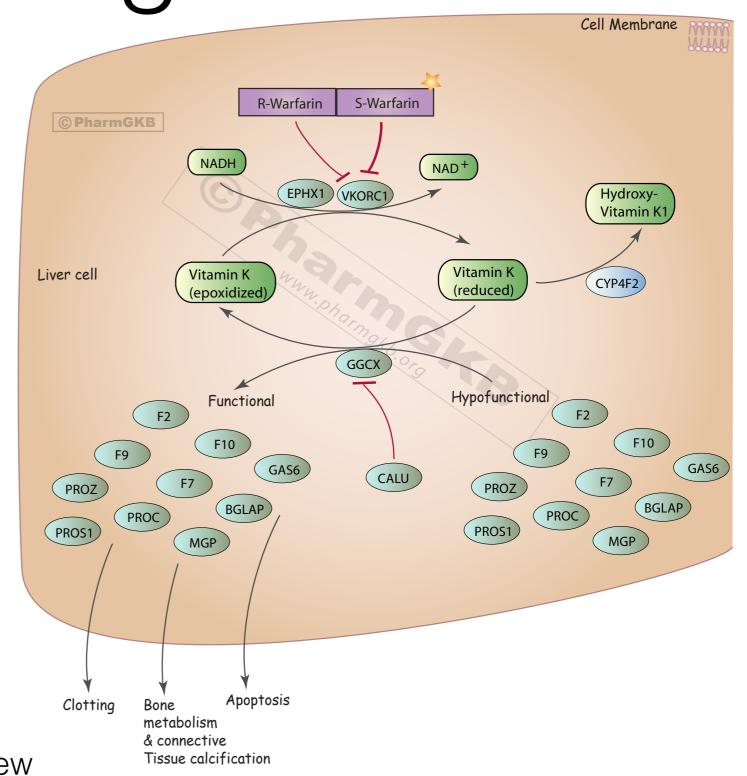
- Variant Annotations (Research-level annotations of individual publications describing the relationship between genetic variants and drugs; these are created on a paper-by-paper basis)
- · Drug-Centered Pathway
- Very Important Pharmacogene Summaries
- Clinical Annotations (Genotype-based pharmacogenomic relationships summarizing all variant annotations regarding the same genetic variant-drug association)
- Pharmacogenomics-Based Drug-Dosing Guidelines
   Drug Labels with Pharmacogenomic Information

- pharmacokinetic (PK) pathways
  - what the body does to the drug
    - absorption
    - distribution
    - metabolism
    - elimination
- pharmacodynamic (PD) pathways
  - what the drug does to the body



Warfarin Pharmacodynamics

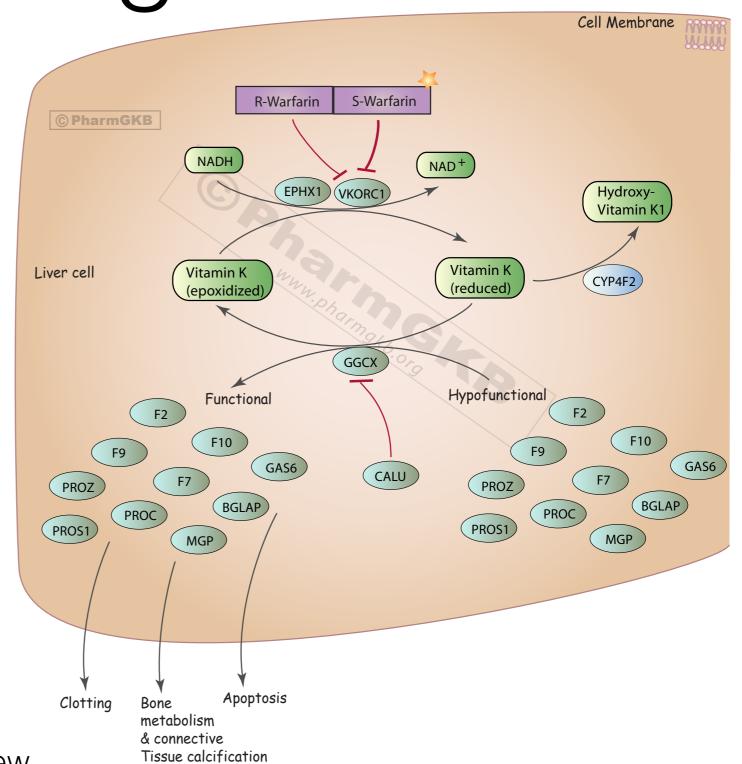
- Widely used anticoagulant drug
- Highly effective at antagonising the vitamin K dependent clotting pathway
- Used for a wide range of diseases and conditions
  - Atrial fibrillation
  - Heart valve replacement.



https://www.pharmgkb.org/page/overview

Warfarin Pharmacodynamics

- Narrow therapeutic window and
- Wide inter-individual variability
- Under-anticoagulation can result in thrombosis
- Over-anticoagulation can result in dangerous bleeding episodes.
- Dosing
  - determined empirically
  - often based on age
  - underlying condition
  - genetics



https://www.pharmgkb.org/page/overview

**PATHWAY** 

Warfarin Pathway, Pharmacodynamics

Overview Components Related Pathways Related Publications Downloads

#### **Entities in the Pathway**

**Genes** (15)

BGLAP, CALU, CYP4F2, EPHX1, F10, F2, F7, F9, GAS6, GGCX, MGP, PROC, PROS1, PROZ, VKORC1

#### **Relationships in the Pathway**

Arrow From	Arrow To	Controllers	PMID
BGLAP, MGP	BGLAP, MGP	GGCX	<u>16270630</u> , <u>16493479</u>
GAS6	GAS6	<u>GGCX</u>	<u>16270630</u> , <u>16493479</u>
<u>GGCX</u>	GGCX	CALU	<u>15075329</u> , <u>16493479</u>
NADH	NAD+	EPHX1, VKORC1	
Vitamin K (epoxidized)	Vitamin K (reduced)	EPHX1, VKORC1	<u>14765194</u> , <u>15358623</u> , <u>15900282</u> , <u>16270630</u> , <u>16493479</u>
Vitamin K (reduced)	Hydroxy-Vitamin K1	CYP4F2	<u>17341693</u> , <u>18250228</u> , <u>19297519</u>
Vitamin K (reduced)	Vitamin K (epoxidized)	<u>GGCX</u>	<u>15900282</u> , <u>16270630</u> , <u>16493479</u>
VKORC1	VKORC1	warfarin	<u>15358623</u> , <u>16270630</u> , <u>16493479</u>
<u>F10, F2, F7, F9, PROC, PROS1, PROZ</u>	<u>F10, F2, F7, F9, PROC, PROS1, PROZ</u>	GGCX	<u>16270630</u> , <u>16493479</u>

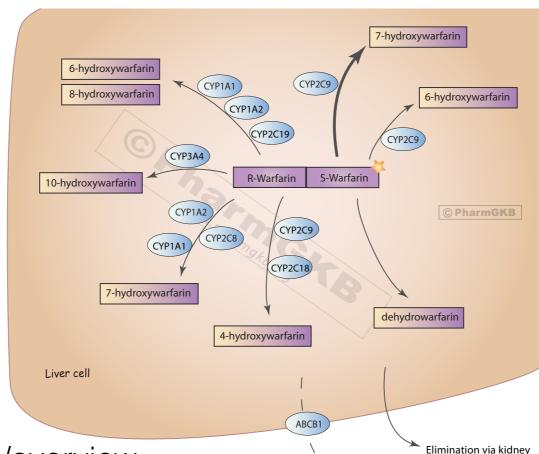
Download data in TSV format . Other formats are available on the Downloads/LinkOuts tab.

#### https://www.pharmgkb.org/page/overview

active farin Pathway, Pharmacodynamics



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https://www.pharmgkb.org/page/overview

**PATHWAY** 

#### Warfarin Pathway, Pharmacodynamics

Related Publications

Reference

Pathway analysis of genome-wide data improves warfarin dose prediction. BMC genomics. 2013. Daneshjou Roxana, Tatonetti Nicholas P, Karczewski Konrad J, Sagreiya Hersh, Bourgeois Stephane, Drozda Katarzyna, Burmester James K, Tsunoda Tatsuhiko, Nakamura Yusuke, Kubo Michiaki, Tector Matthew, Limdi Nita A, Cavallari Larisa H, Perera Minoli, Johnson Julie A, Klein Teri E, Altman Russ B. Publications

Development of a pharmacogenetic-guided warfarin dosing algorithm for Puerto Rican patients. Pharmacogenomics. 2012. Ramos Alga S, Seip Richard L, Rivera-Miranda Giselle, Felici-Giovanini Marcos E, Garcia-Berdecia Rafael, Alejandro-Cowan Yirelia, Kocherla Mohan, Cruz ladelisse, Feliu Juan F, Cadilla Carmen L, Renta Jessica Y, Gorowski Krystyna, Vergara Cunegundo, Ruaño Gualberto, Duconge Jorge.



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## We bring the world of genetics to you.

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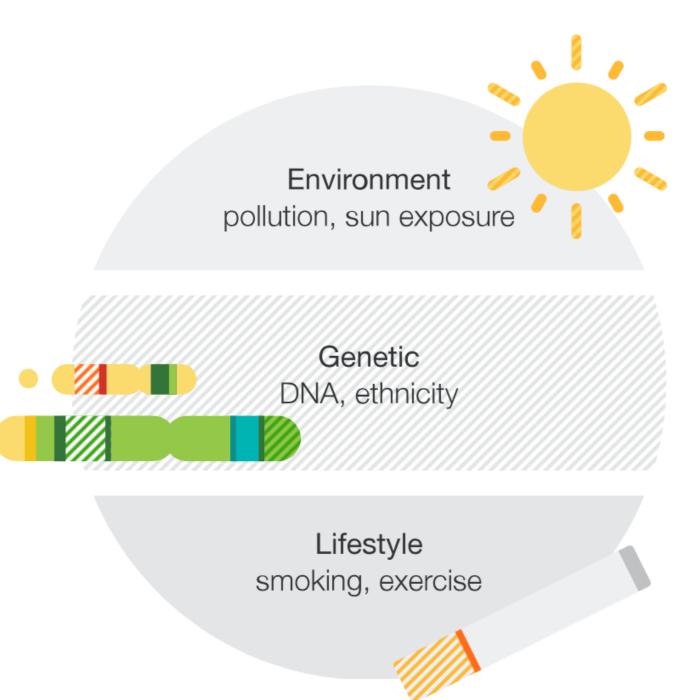
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- Our scientists and medical experts use a rigorous process to develop the reports
- ✓ Your personalized reports are based on well-established scientific and medical research



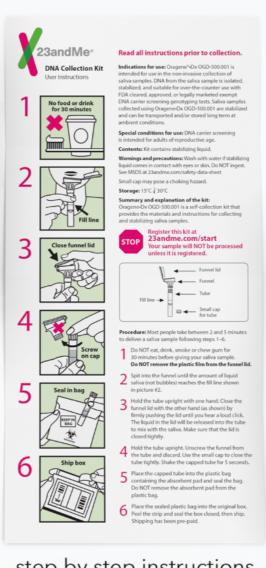


Why genetics is only part of the story.

When it comes to your health and traits, DNA is only part of the story. Other variables come into play, including non-genetic factors, such as your environment and lifestyle.

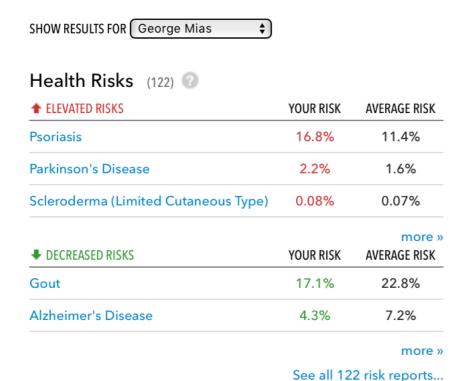
#### What is in the kit?







step by step instructions



SEE NEW AND RECENTLY UPDATED REPORTS »

RESULT
Variant Present
Variant Present
Variant Absent
Variant Absent
Variant Absent

Traits (63)	
REPORT	RESULT
Alcohol Flush Reaction	Does Not Flush
Bitter Taste Perception	Unlikely to Taste
Blond Hair	<1% Chance
Earwax Type	Wet
Eye Color	Likely Brown
	See all 63 traits

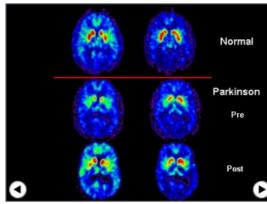
Drug Response (25)			
REPORT	RESULT		
Proton Pump Inhibitor (PPI) Metabolism (CYP2C19-related)	Rapid		
Warfarin (Coumadin®) Sensitivity	Increased		
Phenytoin Sensitivity (Epilepsy Drug)	Increased		
Sulfonylurea Metabolism	Greatly reduced		
Abacavir Hypersensitivity	Typical		

See all 25 drug response...

See all 53 carrier status...

Parkinson's disease is a disorder of the brain's motor system caused by a loss of dopamine-producing brain cells. Approximately one and a half million Americans have the disease, and about 50,000 new patients are diagnosed each year. The main symptoms are trembling in the hands, arms, legs, jaw, and face; stiffness of the limbs and trunk; slowed movement; and impaired balance and coordination. Symptoms of Parkinson's disease usually come on gradually and affect people over the age of 50, although there are rare forms that progress more quickly and strike at a younger age. Though very little is known about the genetics of Parkinson's, mutations in a gene known as LRRK2 have been found to greatly increase a person's likelihood of developing the condition.

The following results are based on \*\*\*\* Established Research for 10 reported markers, updated April 26th, 2012.



1 of 2. Decreased dopamine activity in the brains of people with Parkinson's disease can be seen on a PET

Your Results

Show information for George Mias assuming European thnicity and an age range of 30-79

# George Mias 2.2 out of 100

men of European ethnicity who share George Mias's genotype will develop Parkinson's Disease between the ages of



men of European ethnicity will develop Parkinson's Disease between the ages

#### What does the Odds Calculator show me?

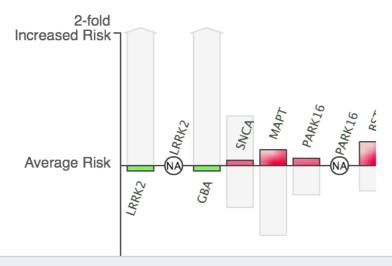
Use the ethnicity and age range selectors above to see the estimated incidence of Parkinson's Disease due to genetics for men with George Mias's genotype. The 23andMe Odds Calculator assumes that a person is free of the condition at the lower age in the range. You can use the name selector above to see the estimated incidence of Parkinson's Disease for the genotypes of other people in your account.

The 23andMe Odds Calculator only takes into account effects of markers with known associations that are also on our genotyping chip. Keep in mind that aside from genetics, environment and lifestyle may also contribute to one's risk for Parkinson's Disease.

Understanding Your Results

27 % Attributable to Genetics The heritability of Parkinson's is relatively low but a recent study estimated it to be about 27% in European populations. This means that environment generally plays a larger role than genetics in determining a person's risk for the disease. However, a small fraction of Parkinson's cases are attributed to rare mutations in a small number of genes, including the G2019S mutation in LRRK2, which is included in this report. People with the LRRK2 G2019S mutation have a much higher than average risk of developing Parkinson's disease during their lifetimes. This report also discusses other genetic factors that are associated with higher risk for PD in European and Asian populations. (sources)

#### **Marker Effects**



#### What does this chart show?

The chart shows the approximate effects of the selected person's genotype at the 10 reported markers. Higher, red bars indicate increased risk from the average, while lower, green bars indicate decreased risk from the average. The light gray bars show the maximum possible effects for the possible genotypes at the marker.

Mouse over individual bars to view additional information about each marker. Click on a bar to view detailed information about that marker below. You can read more about all markers in the technical report.

LRRK2 Marker: rs34637584

Mutations in the LRRK2 gene are one of the most common known genetic causes of Parkinson's disease (PD).

More than 50 variants are known in the LRRK2 gene. Several of these have been associated with PD. This variant reported by 23andMe, rs34637584, also known as the G2019S mutation, is the best-studied LRRK2 SNP related to Parkinson's in individuals with European ancestry.

Parkinson's is a fairly rare disease. The average person has a 1-2% chance of developing the disease during his or her lifetime. The chance that a person with the G2019S mutation will develop Parkinson's is much higher than average and increases with age. One recent study found that people with the G2019S mutation have a 28% chance of developing Parkinson's by the age of 59, 51% by the age of 69 and 74% by the age of 79. However, estimates of PD risk due to the G2019S mutation vary greatly. While it is well established that the mutation's effect is very strong, there is no consensus about its exact magnitude.

Of all people with Parkinson's, few have the G2019S mutation, but it is present at high levels in patients from some ethnic groups. Up to 40% of people with PD who are of Arab-Berber ancestry and 20% of Ashkenazi Jewish people with PD have this mutation.

Scientists do not know why only some people with the G2019S mutation get PD. There may be unknown effects due to other genes or environmental factors.

#### Citations

Schapira (2006). "The importance of LRRK2 mutations in Parkinson disease." Arch Neurol 63(9):1225-8.

Klein et al. (2007). "Deciphering the role of heterozygous mutations in genes associated with parkinsonism." Lancet Neurol 6(7):652-62.

Healy et al. (2008). "Phenotype, genotype, and worldwide genetic penetrance of LRRK2-associated Parkinson's disease: a case-control study." Lancet Neurol 7(7):583-90.

Gene or Region	SNP	Genotype	Adjusted Odds Ratio
LRRK2	rs34637584	GG	0.98
LRRK2	rs34778348	GG	NA (not applicable)
GBA	i4000415	TT	0.99
SNCA	rs356220	СТ	1.02
MAPT	rs393152	AA	1.09
PARK16	rs947211	GG	1.04
PARK16	rs823156	AA	NA (not applicable)
BST1	rs4698412	AA	1.13
DGKQ	rs11248060	CC	0.94
STK39	rs2390669	AC	1.15

Detected the following variants: 2789+5G>A

		D.1.1.01		
23andMe Name		DNA Change	Genotype	Result
i3000001	DeltaF508	CTT to –	CTT,CTT	Has one mutation in the CFTR gene linked to cystic
i4000292	Deltal507	ATC to –	ATC,ATC	fibrosis. A person with one of these mutations typically does not have cystic fibrosis, but may pass the mutation
i4000294	G85E	G to A	GG	to offspring. May still have other mutations in the CFTR
i4000296	R334W	C to T	CC	gene (not reported here).
i4000297	R347P/H	G to C,A	GG	Variants detected: 2789+5G>A
i4000291	A455E	C to A	CC	
i4000299	V520F	G to T	GG	
i4000300	G542X	G to T	GG	
i4000301	S549N	G to A	GG	
i4000305	G551D	G to A	GG	
i4000306	R553X	C to T	CC	Cystic Fibrosis
i4000307	R560T	G to C	GG	
i4000308	R1162X	C to T	CC	Cystic fibrosis (CF) is caused by mutations in a gene called CFTR. This gene codes
i4000309	W1282X	G to A	GG	for a protein that helps move salt and water through cells. Mutations in CFTR
i4000311	N1303K	C to G	CC	result in the build-up of thickened mucus and other secretions that can damage the lungs, pancreas, and other organs. The disease is inherited in a recessive
i4000313	394delTT	TT to –	TT,TT	manner, meaning that a person must inherit a mutated copy of the CFTR gene
i4000314	621+1G>T	G to T	GG	from both parents in order to develop the disease. Cystic fibrosis is most common
i4000315	711+1G>T	G to T	GG	in populations with European or Jewish ancestry, where about one out of every 25
i4000316	1078delT	T to –	T,T	to 30 people carries a CFTR mutation.
i4000317	1717-1G>A	G to A	GG	The fellowing would are been done that the first blished Been with few 27 years and
i4000318	1898+1G>A	G to A	GG	The following results are based on **** Established Research for 26 reported markers, updated May 29th, 2014.
i4000320	2789+5G>A	G to A	AG	markers, updated May 27th, 2014.
i4000321	3120+1G>A	G to A	GG	
i4000322	3659delC	C to –	C,C	
i4000324	3905insT	– to T	-,-	

23andme.com (Older style reports pre FDA)

C to T

CC

3849+10kbC>T

i4000325

Warfarin (Coumadin®) Sensitivity

Warfarin is an anticoagulant (also known as a blood thinner). It is used to treat and prevent blood clots. Blood clots can block blood flow and cause a heart attack or stroke.

SNP	Genotype	Combination	Result
rs1799853	СТ	CYP2C9*2/*3, VKORC1 -1673/3673 AG	Likely to be more sensitive to warfarin based on genetics.
rs1057910	AC		Genetic information may only be useful when
rs9923231	CT		determining an initial dose of warfarin. Many other factors also influence warfarin sensitivity. If you are taking
			warfarin, keep taking it as directed by your doctor.

#### Sulfonylurea Metabolism

Sulfonylurea drugs are commonly used to treat type 2 diabetes, a disease that affects about 350 million people worldwide. Genetic as well as non-genetic factors can influence how a person responds to these drugs. This report covers two genetic variants associated with the ability to clear to sulfonylurea drugs from the body. Decreased drug clearance can result in better chances for successful treatment but may also increase the risk of side effects.

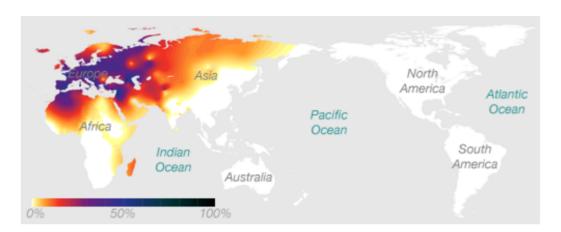
The following results are based on \*\*\* Established Research for 2 reported markers.

SNP	Genotype	Combination	Result
rs1799853 rs1057910	CT AC	CYP2C9 *2/*3	Greatly reduced ability to clear sulfonylurea drugs from the body. Clearance may affect treatment effectiveness,
131037710	70		likelihood of side effects, and optimal dose.

#### MATERNAL LINE: H

Overview History Haplogroup Tree Community

Locations of haplogroup H before the widespread migrations of the past few hundred years.



H originated in the Near East and then expanded after the peak of the Ice Age into Europe, where it is the most prevalent haplogroup today. It is present in about half of the Scandinavian population and is also common along the continent's Atlantic coast.

PATERNAL LINE: E1B1B1A2\*

Overview History Haplogroup Tree Community

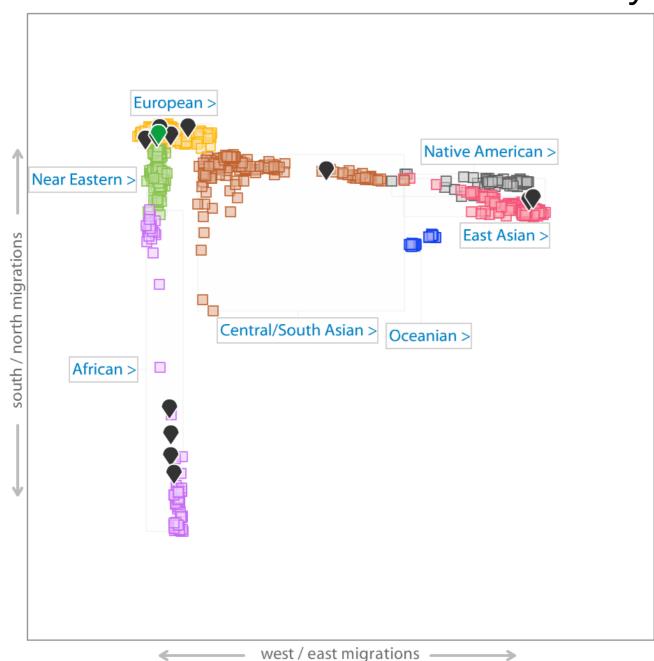
#### E1b1b1a2\* is a subgroup of E1b1b1a

Locations of haplogroup E1b1b1a before the widespread migrations of the past few hundred years.



E1b1b1a is most common in northern Africa and southern Europe. It arose about 23,000 years ago in eastern Africa and spread into the Mediterranean region after the Ice Age. E1b1b1a, a subgroup of E1b1b, expanded out of the Near East 8,000 years ago into northern Africa and southern Europe. Today it is one of the most common haplogroups in those regions.

Global Similarity



World

#### **DNA** Relatives



**Got Neanderthal DNA?** 

An estimated 2.6% of your DNA is from Neanderthals.

George Mias (you)

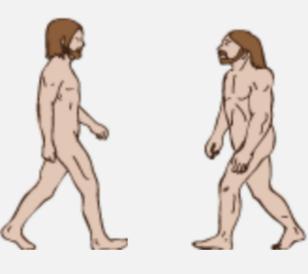
Average European user



36th percentile

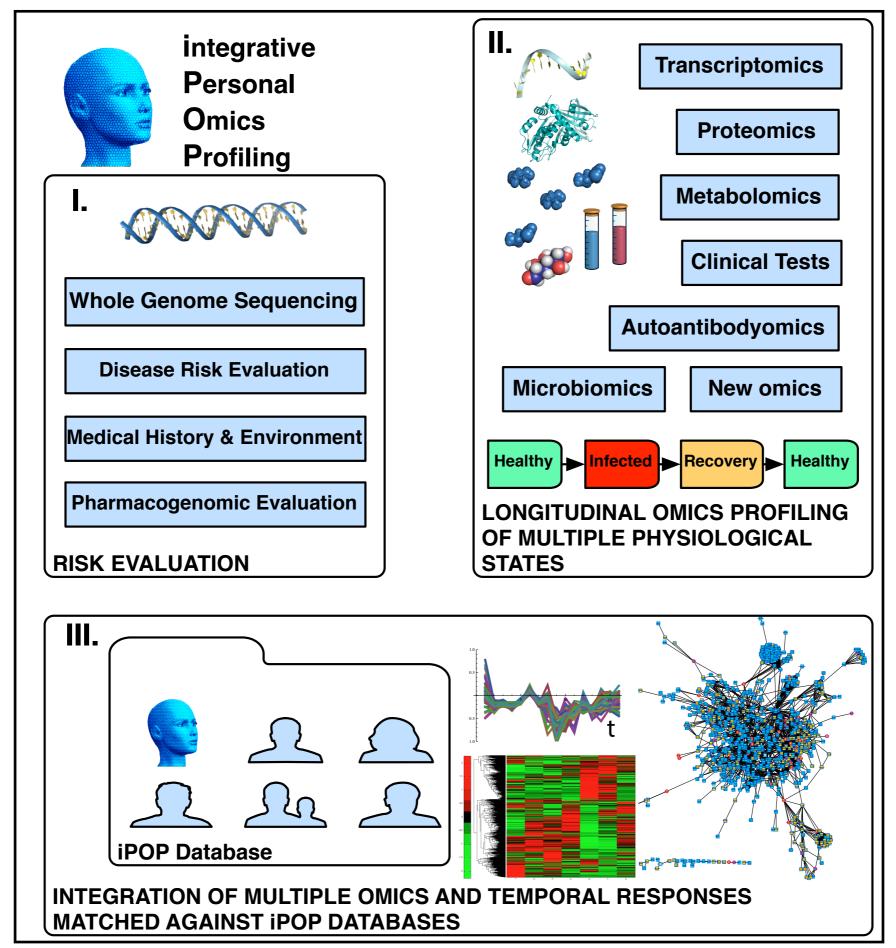
#### **MODERN HUMANS**

Higher brow Narrower shoulders Slightly taller



#### **NEANDERTHALS**

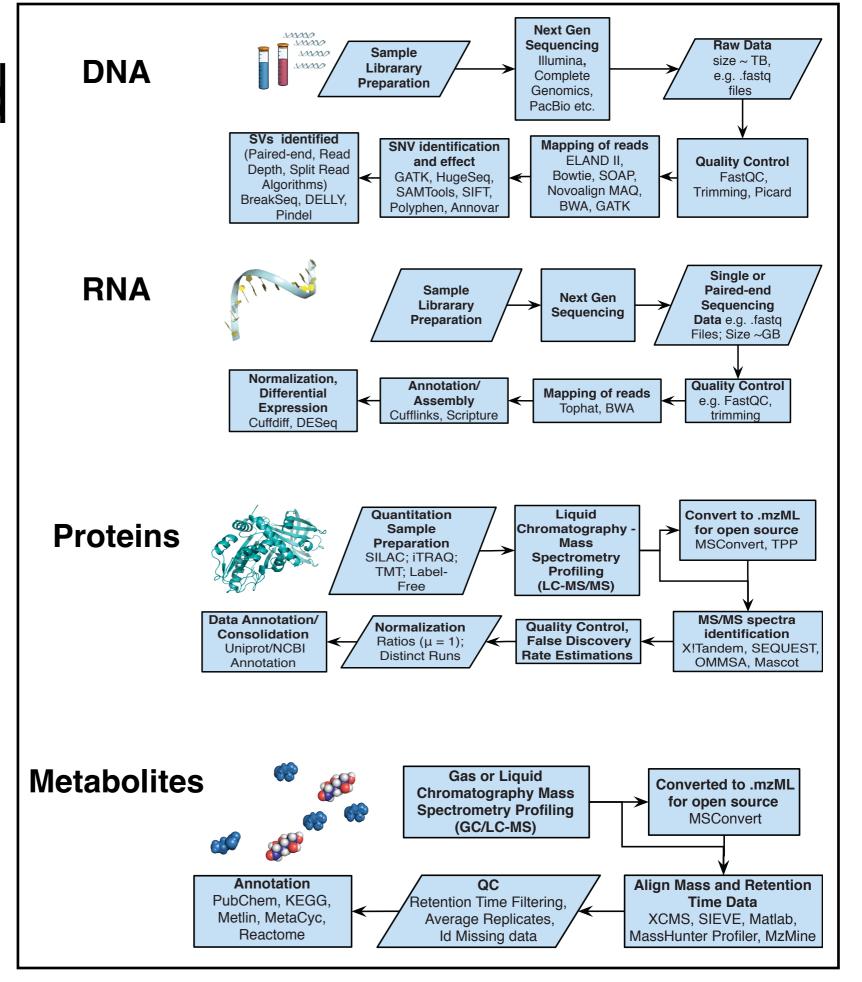
Heavy eyebrow ridge
Long, low, bigger skull
Prominent nose with developed nasal
chambers for cold-air protection



Mias & Snyder, Quantitative Biology (1)1 p72 (2013)

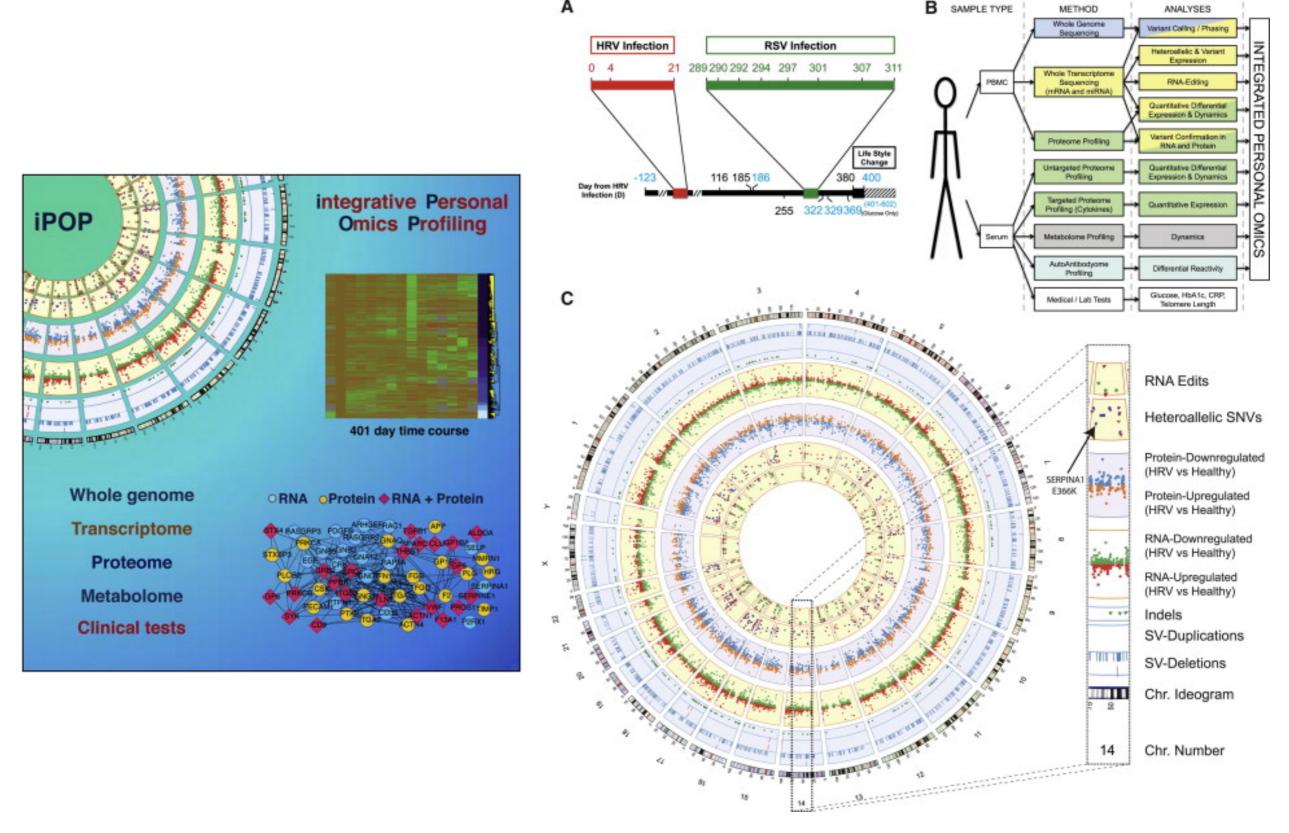
# Personalized Medicine

- Personalized
  - Determine risks
  - Monitor
  - Integrate



Mias and Snyder, Quantitative Biology 1(1) p. 71 (2013).

#### Integrative Personal Omics Profiling (iPOP)



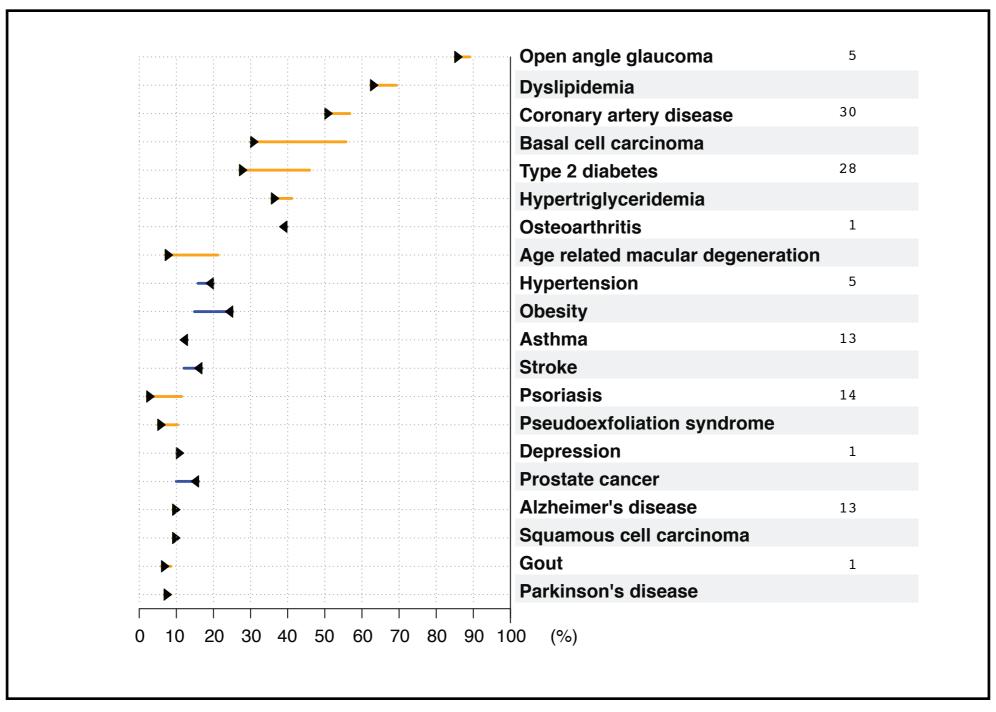
Chen\*, Mias\*, Li-Pook-Than\*, Jiang\* et al Cell 148,1293 (2012).

### I. Genome Sequencing

- Whole Genome Sequencing
  - Illumina (120-fold coverage)
  - Complete Genomics (150-fold coverage)
  - Exome Sequencing (Nimblegen, Agilent and Illumina) (80-100-fold coverage)
- Variants identified
  - ~ 3.3 x 10<sup>6</sup> Single Nucleotide Variants (SNVs)
  - ~ 2 x 10<sup>5</sup> Small insertions and deletions (InDels)
  - Structural variants (SVs > 1Kb changes)

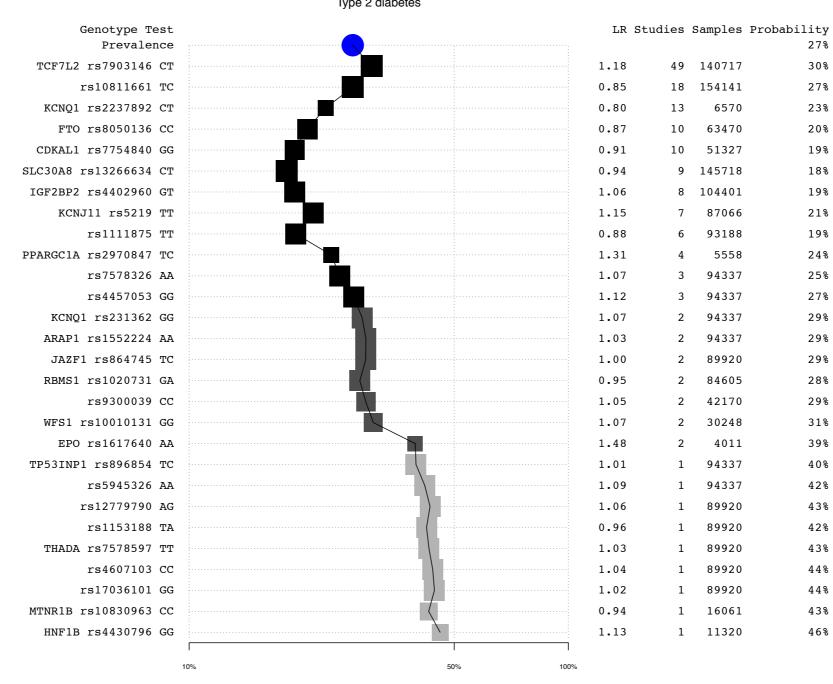
Chen\*, Mias\*, Li-Pook-Than\*, Jiang\* et al Cell 148,1293 (2012).

## I. Genome Sequencing



Rong Chen, Atul Butte

# I. Genome Sequencing



Sum over likelihood ratios for disease risk - probabilistic VariMed curated database

Rong Chen, Atul Butte

Ashley et al. Lancet 375, 1525-1535 (2010)

### Data Timeline:

Day 0

Days 289-292

HRV onset

HRV onset

Day 0

Days 289-290

Days 289-292

RSV onset

### Data Timeline:

Day 0

Days 289-292

HRV onset

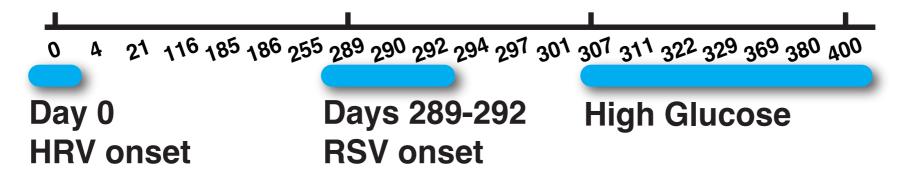
HRV onset

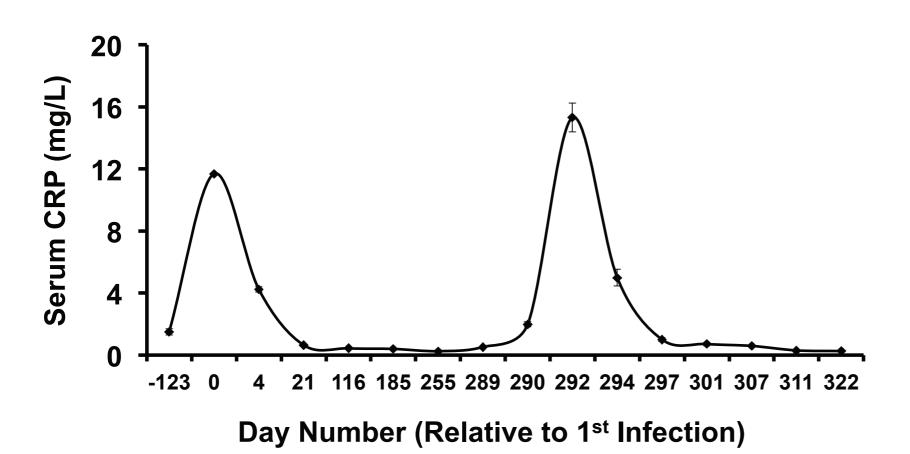
Day 1 10 185 186 255 289 290 292 294 297 301 307 311 322 329 369 380 400

RSV onset

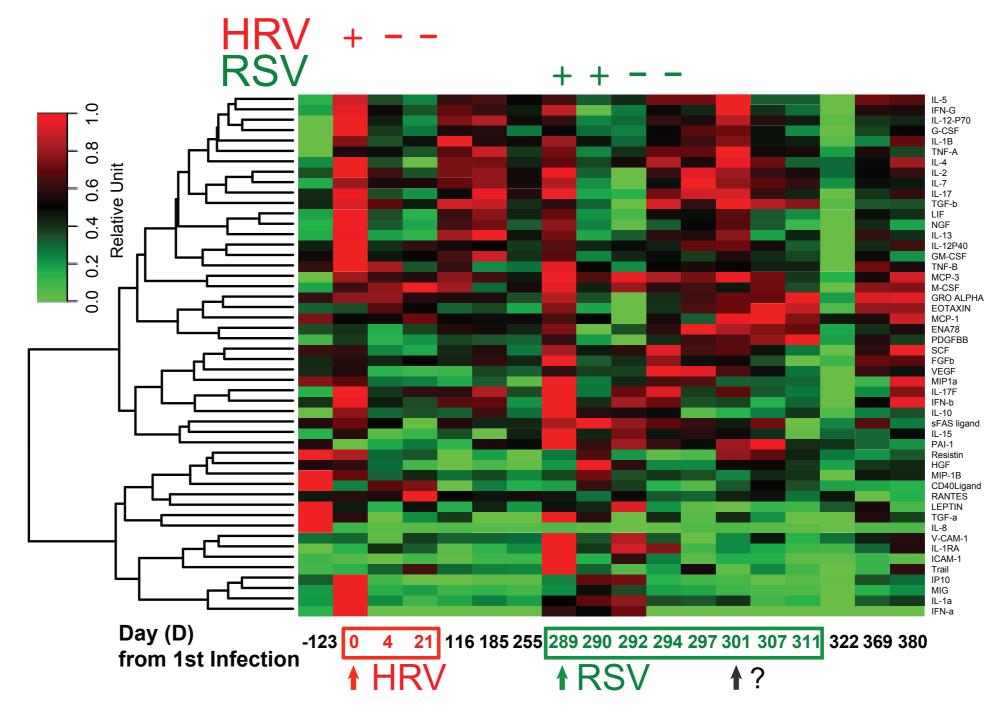
- ▶ Timeline Events
  - Human Rhinovirus (HRV)
  - Respiratory Syncytial Virus (RSV)
  - High Glucose (Type II Diabetes as per physician)

# Data Timeline: Infections



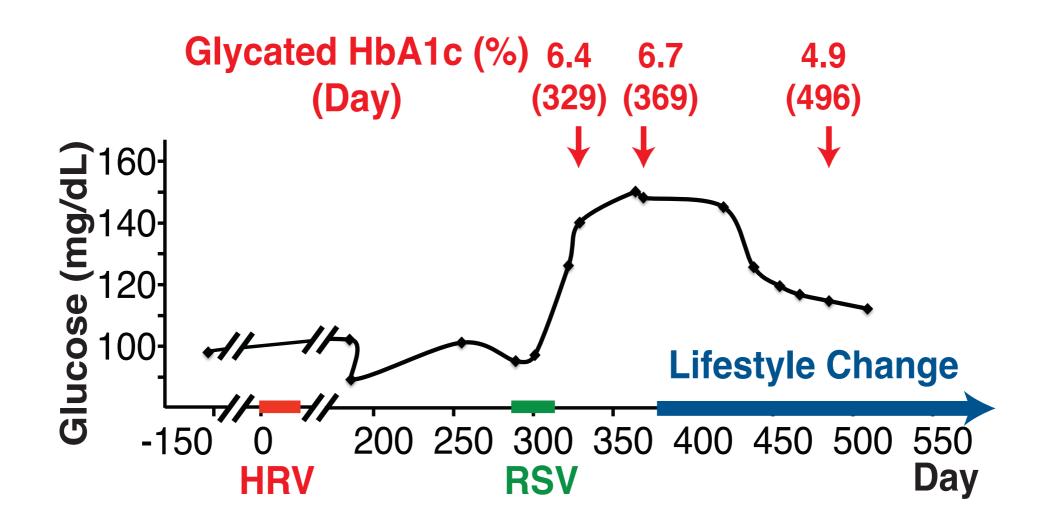


# Data Timeline: Cytokines



Stanford Human Immune Monitoring Center

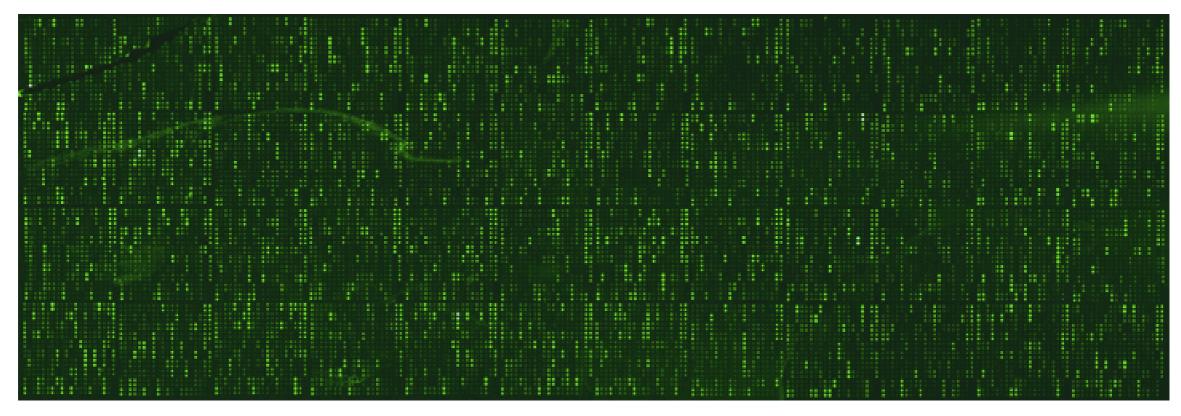
#### Data Timeline: Glucose Levels



## Data Timeline: Autoantibody-ome

ProtoArrays (Invitrogen)

532 nm channel example



# Data Timeline: Autoantibody-ome

Higher in Test Subject Vs. Healthy Group (40pts)

- ARRDC3 arrestin domain containing 3
- EIF3E eukaryotic translation initiation factor 3
- PAQR4 progestin and adipoQ receptor family member I
- DOK6 docking protein 6 (insulin receptor docking)
- GOSR1 golgi SNAP receptor complex member 1
- BTK Bruton agammaglobulinemia tyrosine kinase
- ASPA aspartoacylase

**Blue** intersect with RNA expression

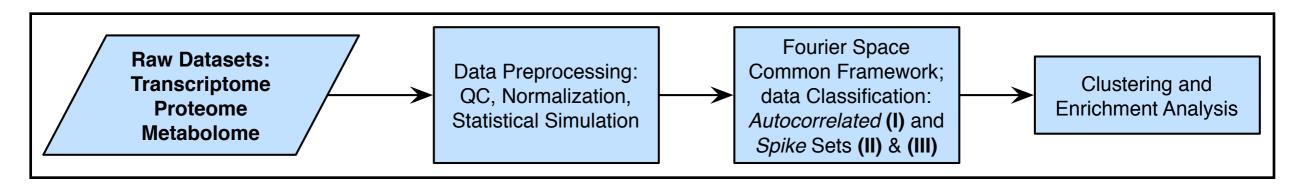
Yellow insulin related

Red observed in insulin-resistant groups, Winer et al. Nat Med. 17 p610 (2011).

Chen\*, Mias\*, Li-Pook-Than\*, Jiang\* et al Cell 148,1293 (2012). Mias & Snyder, Quantitative Biology 1(1) p. 71 (2013).

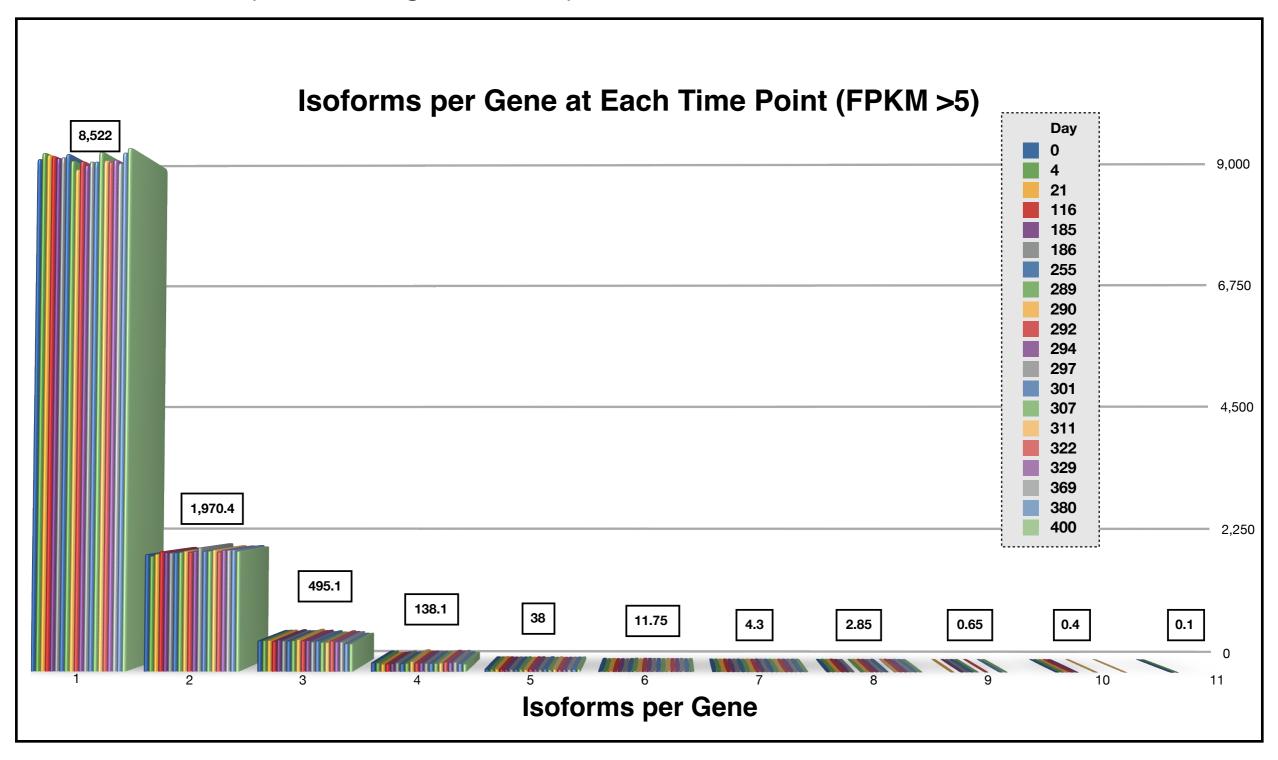
Integration of Dynamic Omics

- Transcriptome Proteome Metabolome
- 1. Preprocessing
- 2. Common Classification Scheme
  - i. Overall trends (autocorrelation)
  - ii. Spikes at specific timepoints
- 3. Clustering and Enrichment Analysis



- 1. Preprocessing
- 2. Common Classification Scheme
  - i. Overall trends (autocorrelation)
  - ii. Spikes (maxima) at specific timepoints
  - iii. Spikes (minima)
- 3. Clustering and Enrichment Analysis

(1) Data Preprocessing: Transcriptome

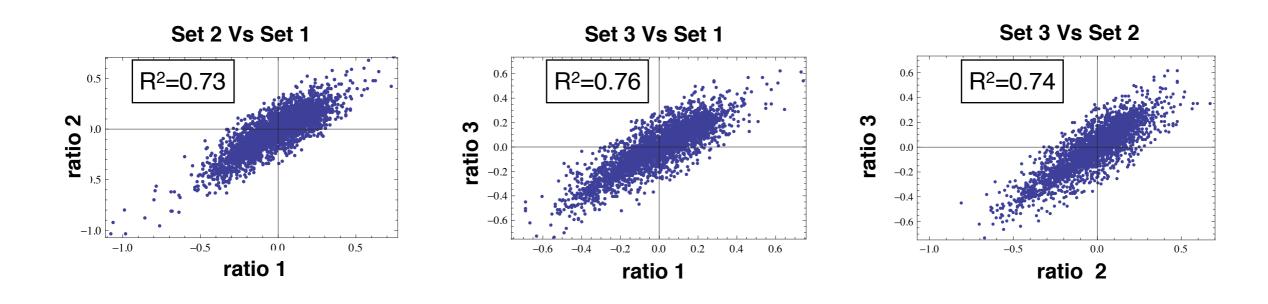


(1) Data Preprocessing: Proteome

Tracking Different Timepoints with Chemical Labeling (TMT 6plex)

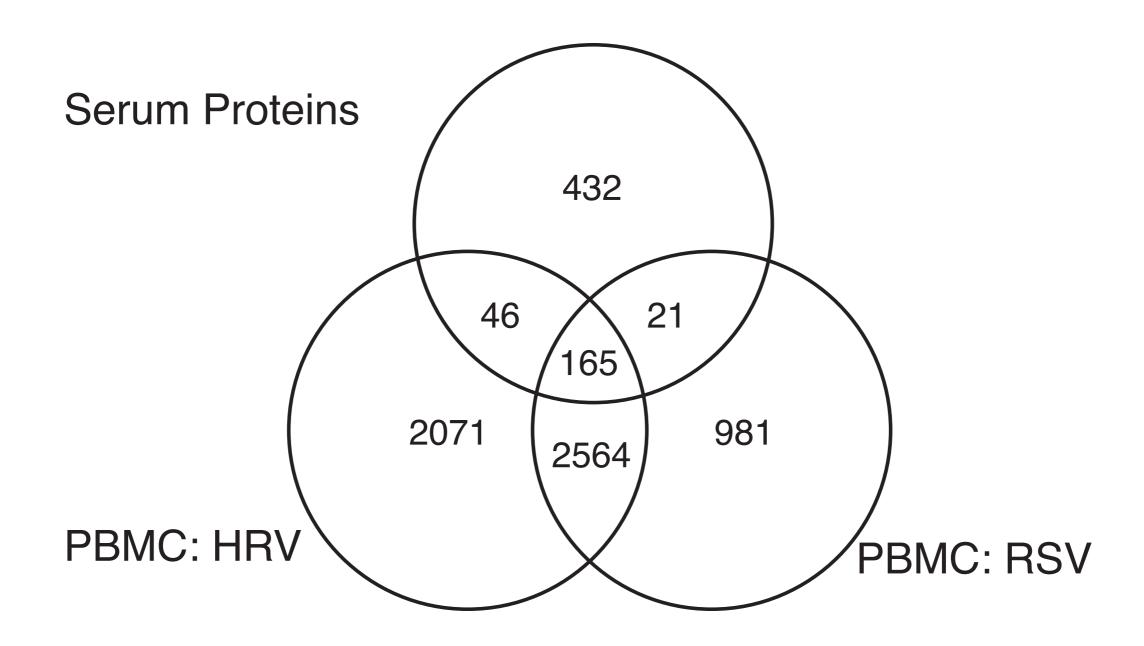
(1) Data Preprocessing: Proteome

Tracking Different Timepoints with Chemical Labeling (TMT 6plex)



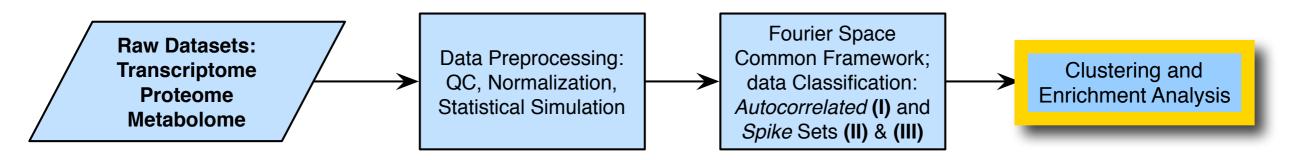
- Common reference ratio
  - Reproducible
  - ▶ Sets can be combined: 3,731 proteins followed over 14 timepoints

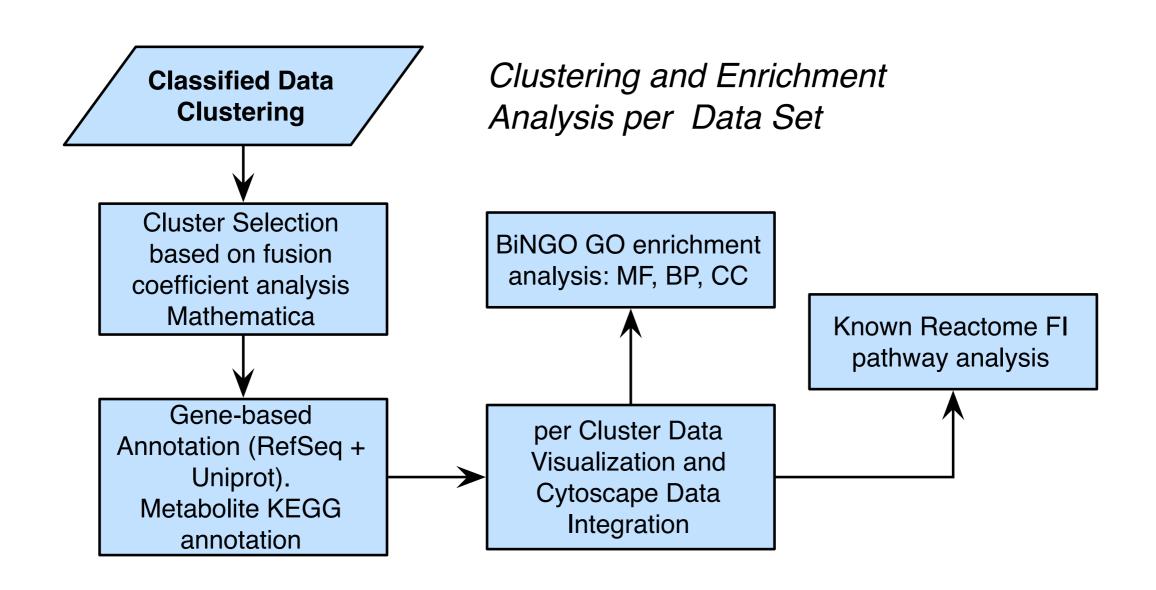
• (1) Data Preprocessing: Proteome



• (2) Common Framework Data Classification

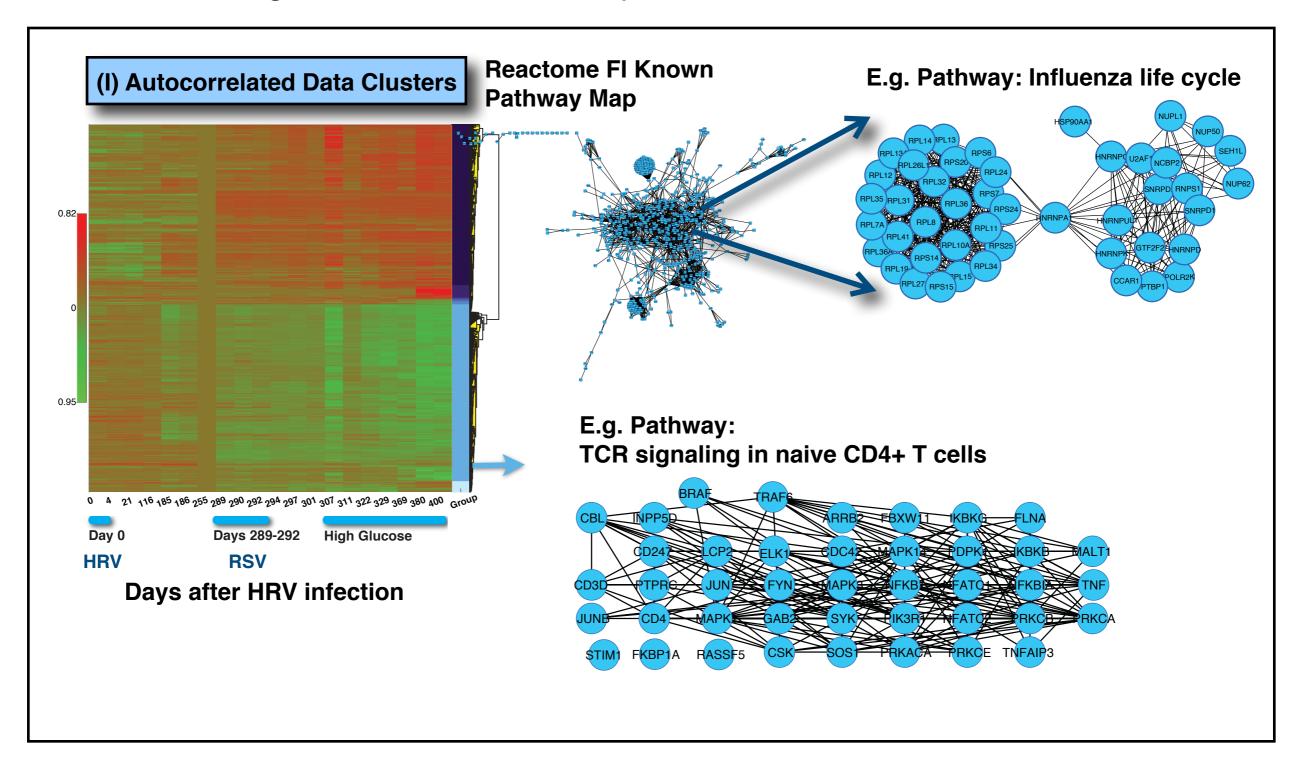
	Transcriptome (HRV+RSV)	Proteome (RSV)	Metabolome (RSV)
Total	19714	3731	4228
Autocorr	4922	257	475
Spike Max	3718	1240	577
Spike Min	7891	1194	884





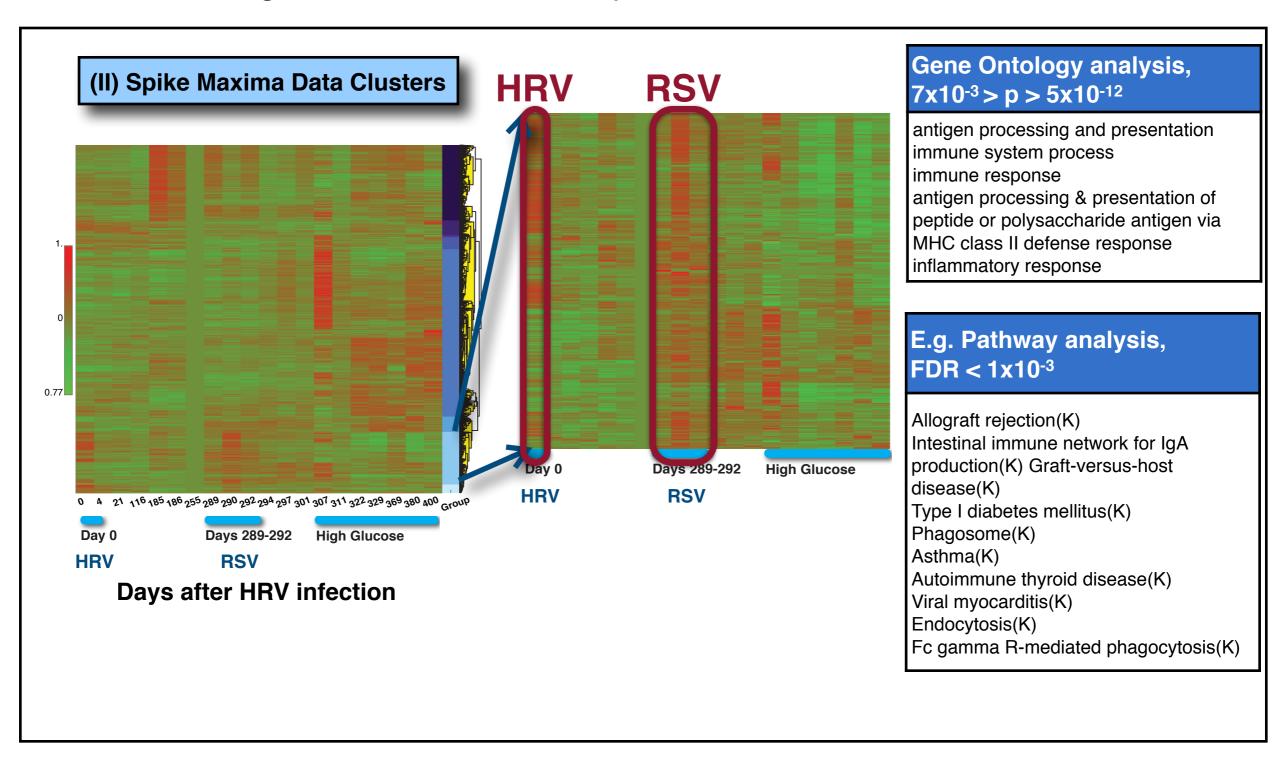
#### III. Dynamics:Transcriptome

• (3) Clustering and Enrichment Analysis



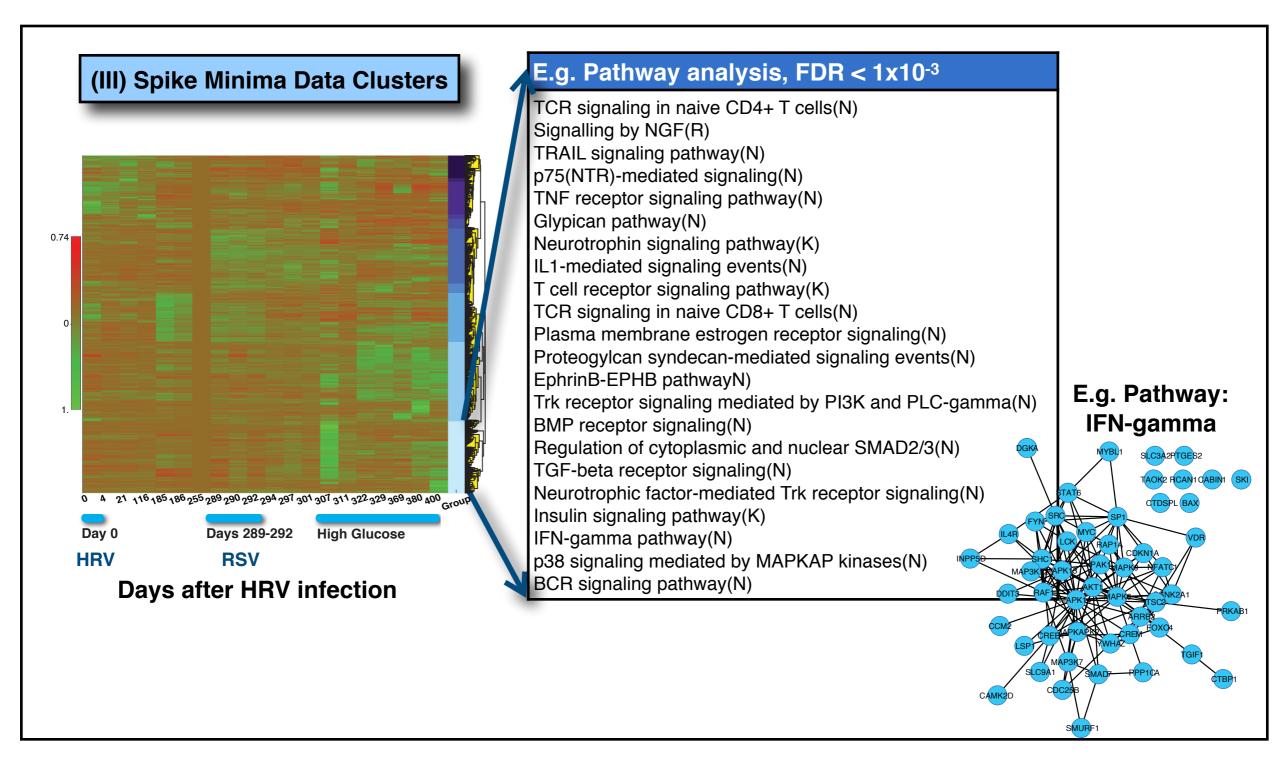
#### III. Dynamics:Transcriptome

• (3) Clustering and Enrichment Analysis



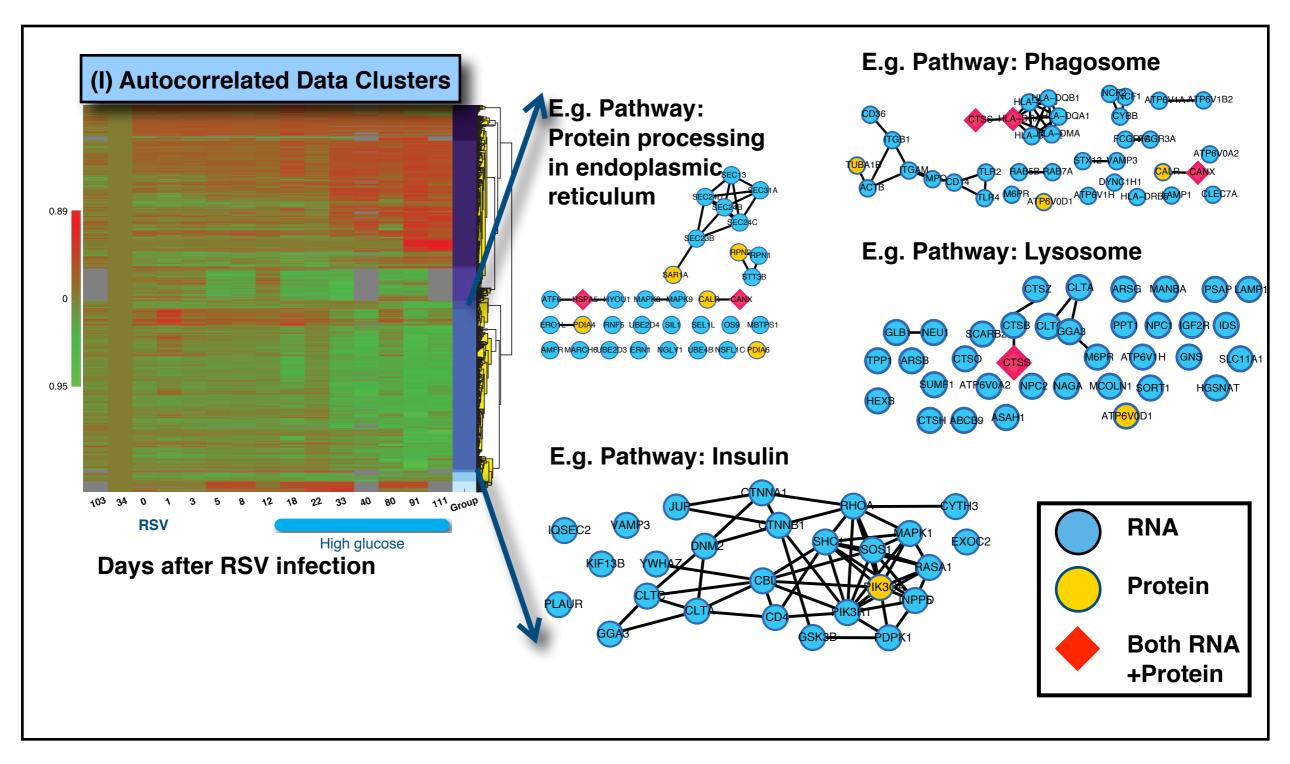
#### III. Dynamics: Transcriptome

• (3) Clustering and Enrichment Analysis



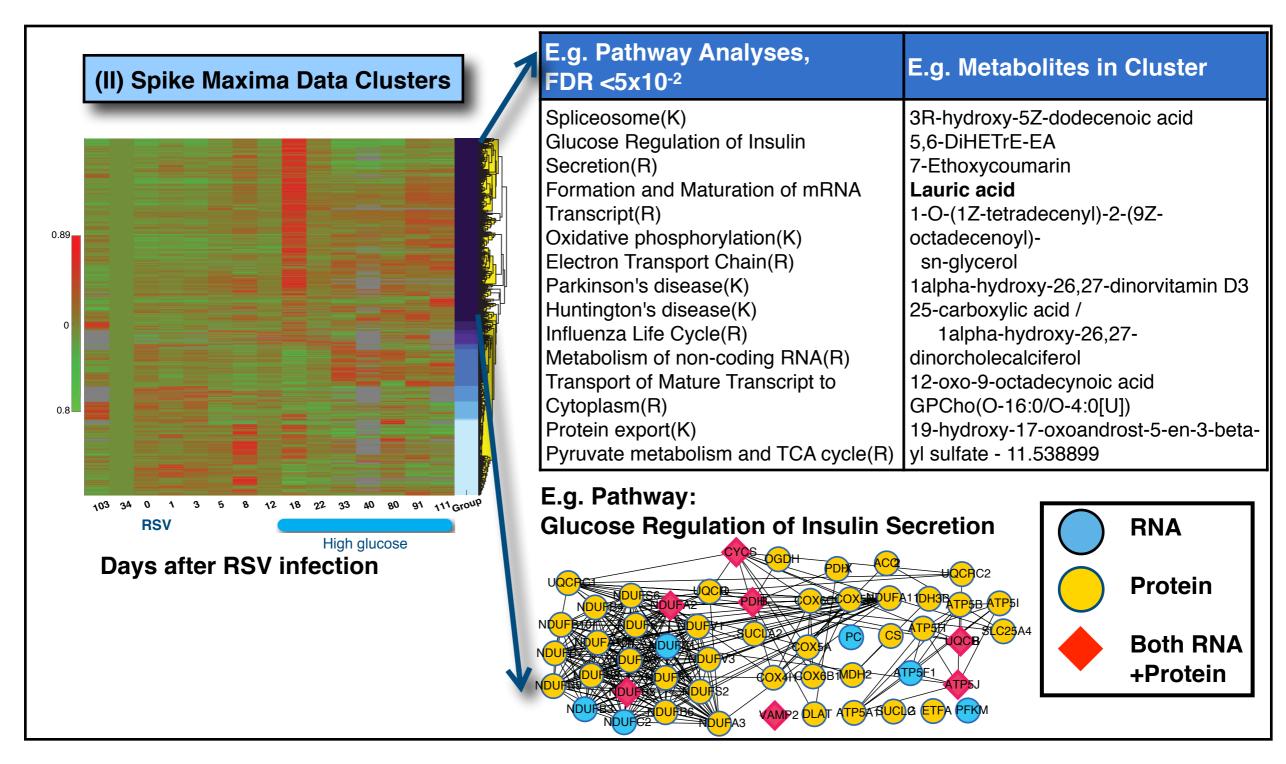
#### III. Dynamics:Integrated Omics

• (3) Clustering and Enrichment Analysis



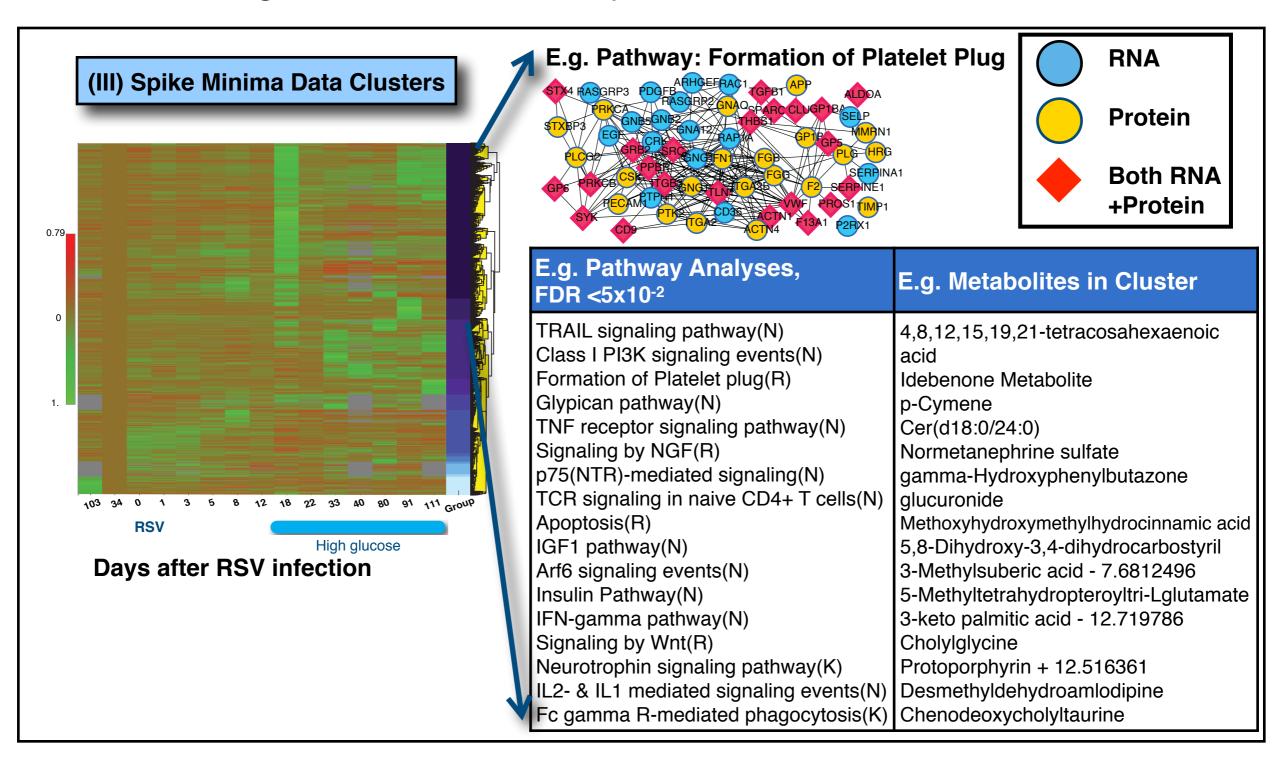
#### III. Dynamics:Integrated Omics

• (3) Clustering and Enrichment Analysis



### III. Dynamics:Integrated Omics

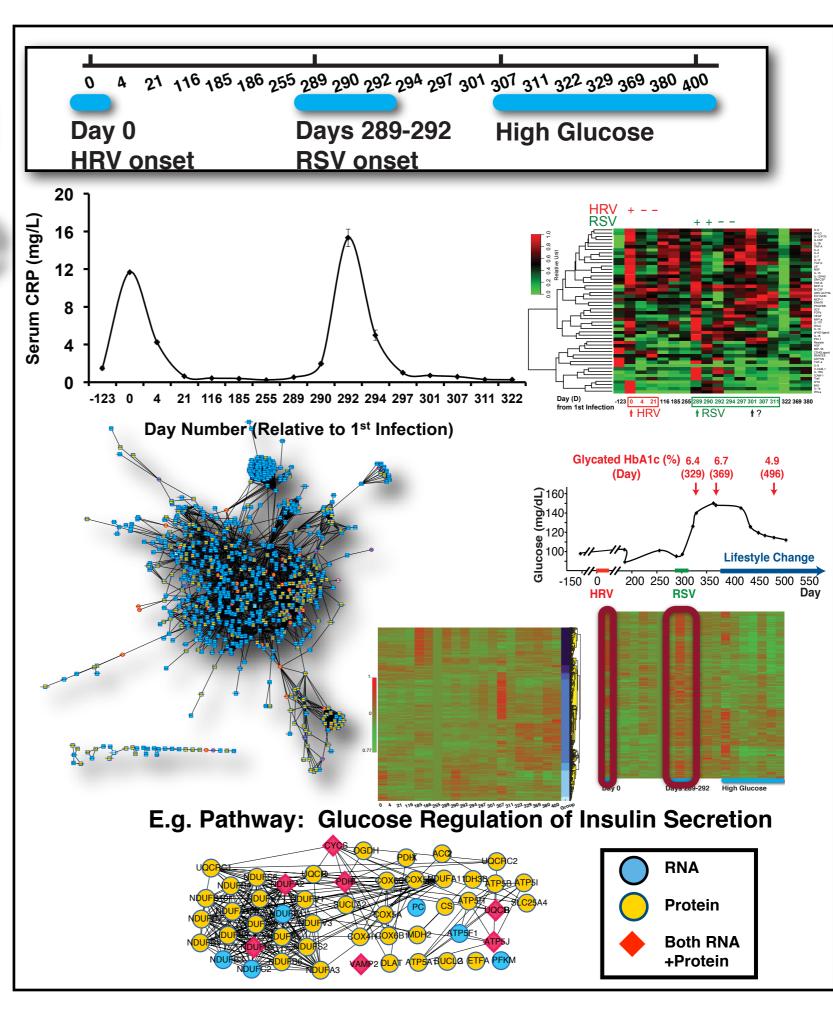
• (3) Clustering and Enrichment Analysis



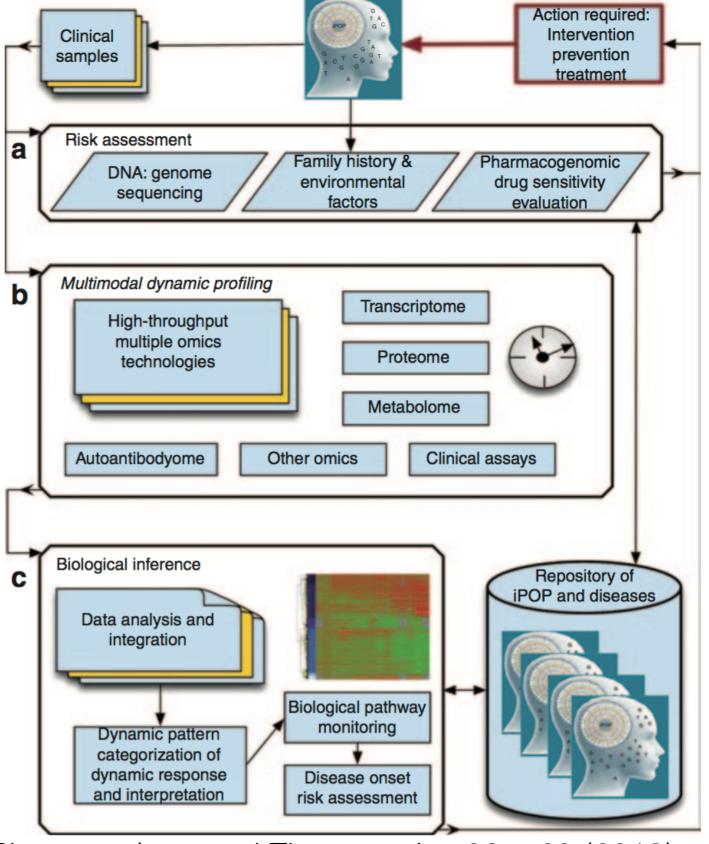
# Precision Medicine

- Personalized
  - Determine risks
  - Monitor
  - Integrate

Mias and Snyder, Quantitative Biology 1(1) p. 71 (2013). Chen\*, Mias\*, Li-Pook-Than\*, Jiang\* et al Cell 148,1293 (2012).



#### A Framework for Personalized & Precision Medicine



Mias & Snyder, Clinical Pharmacology and Therapeutics 93, p29 (2013)