PHARMACOGENOMICS: 2014

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Current Topics in Genome Analysis 2014

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Gentris Corporation

Member, Board of Director

ATIONAL HUMAN GENOME RESEARCH INSTITUTE



"A surgeon who uses the wrong side of the scalpel cuts her own fingers and not the patient;

if the same applied to drugs they would have been investigated very carefully a long time ago"

Rudolph Bucheim Beitrage zur Arzneimittellehre, 1849





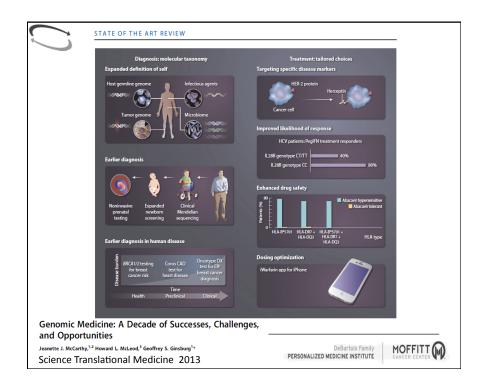
The clinical problem

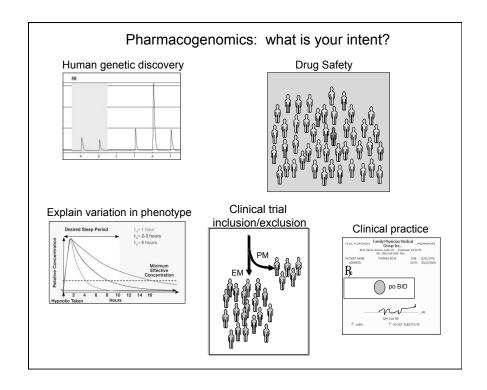
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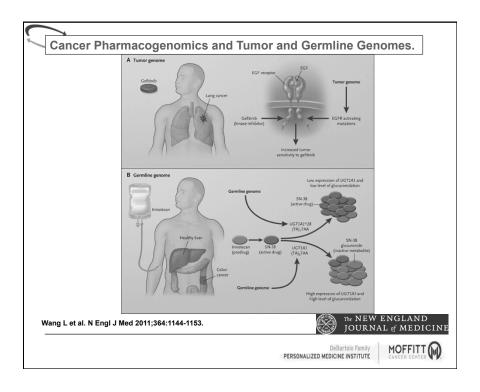
treatment of most diseases

- •Variation in response to therapy
- •Unpredictable toxicity

With choice comes decision







Applications of pharmacogenetics

- Explanation for untoward event (DPYD, CYP2D6)
- Required for insurance coverage (KRAS, EGFR, ABL)
- Identify low utility (KRAS)
- Dose selection (CYP2C9, CYP2C19)
- Therapy selection (CYP2C19)
- Preemptive prediction (HLA-B*5701)



Pharmacogenomic examples-2014

- bcr/abl or 9:22 translocation—imatinib mesylate*
- HER2-neu—trastuzumab**
- C-kit mutations—imatinib mesylate**
- · Epidermal growth factor receptor mutations—gefitinib
- BRAF-vemurafenib
- ALK-Crizotinib
- TPMT-mercaptopurine and azathioprine*
- UGT1A1-irinotecan**
- CYP2C9/VKORC1-warfarin*
- HLA-B*5701-abacavir ...
- HLA-B*1502-carbamazepine
- IL28B-interferon
- CFTR-ivacaftor
- CYP2C19-clopidogrel, voriconazole
- CYP2D6-5-HT3 receptor antagonists, antidepressants, ADHD drugs, and codeine derivatives*





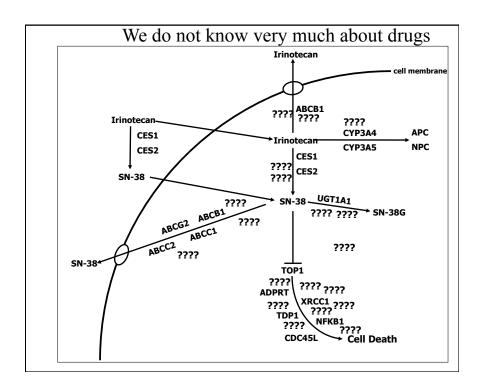


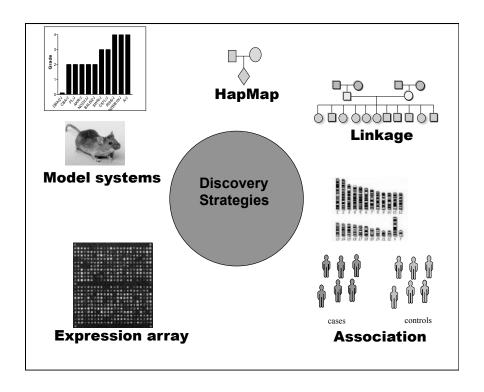
What needs to be done to determine hope vs hype?

- •Find the 'right' biomarkers
- •Validate in robust datasets
- •Apply them!

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We are only beginning to try!

As of 5/6/14

Drug-related phenotypes represented

73/2228 GWA studies (3.3%)

18/73 had ≥ 500 'cases'

22/73 (30%) found no significant 'hits'

37/73 PGx studies had a replication cohort

11 contributed to changes in FDA 'package

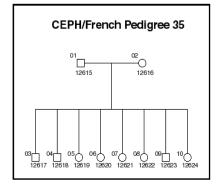
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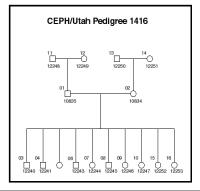




Centre d' Etude du Polymorphisme Human (CEPH) Cell lines

- Large, multigeneration pedigrees widely studied
- Immortalized lymphoblastoid cell lines



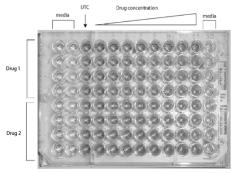


Methodology

Cells counted, plated at 1×10^4 / well

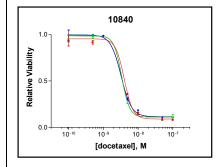
Cells incubated with increasing concentrations of drug

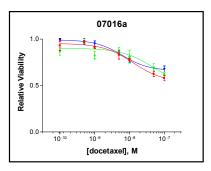
Alamar blue vital dye indicator added



Viability relative to untreated control calculated by spectrophotometry

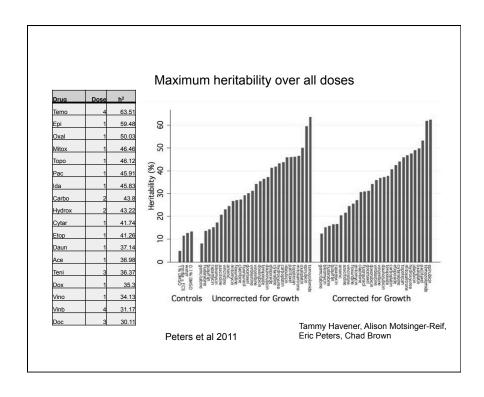
Significant Variation in Cellular Sensitivity to Docetaxel

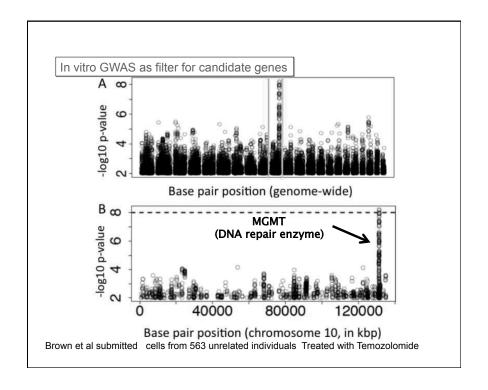


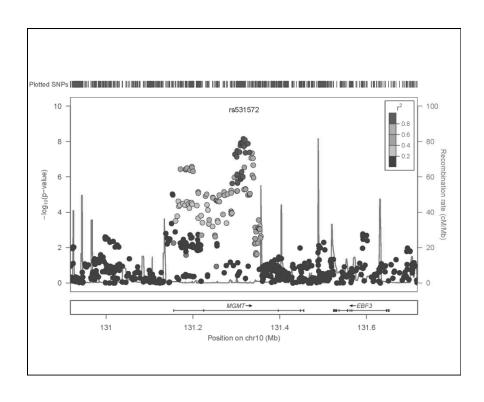


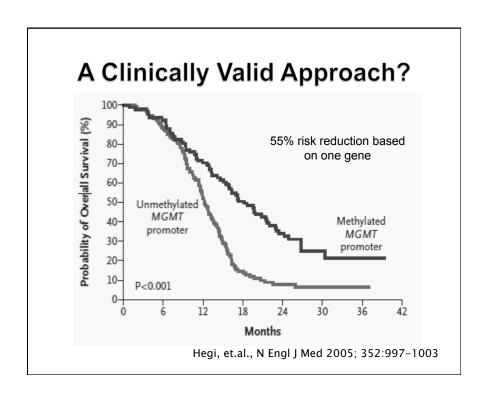
'CE-PH/F-DA' project

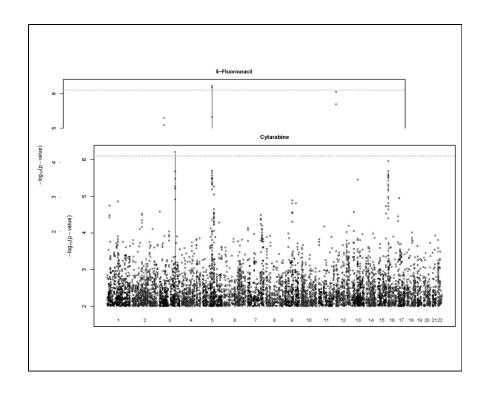
- 126 CEPH cell lines from 14 nuclear families
- All FDA approved cytotoxic drugs + new kinase inhibitors/MTOR/demethylation
- No antiestrogen or vitamin A analogues
- Evaluate degree of heritability, presence of QTL(s), and evidence for correlations between drug sensitivity patterns.











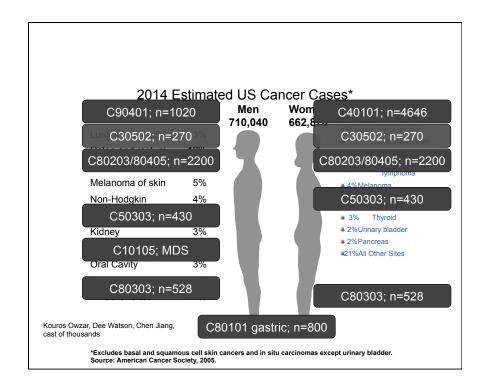


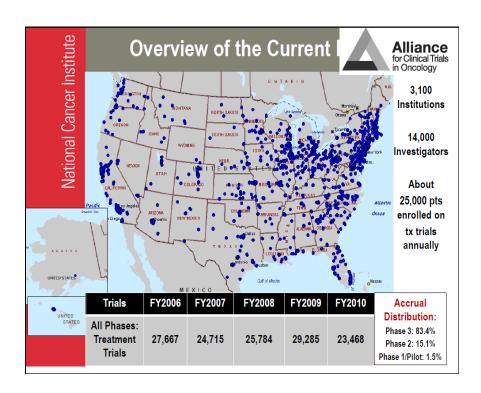
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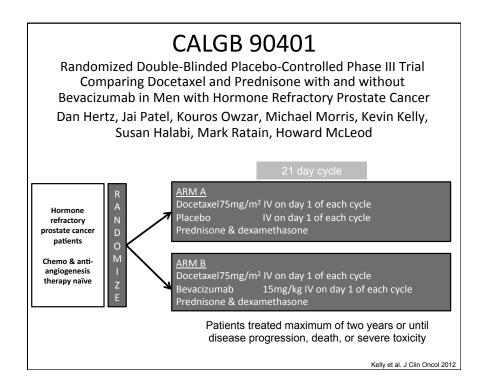
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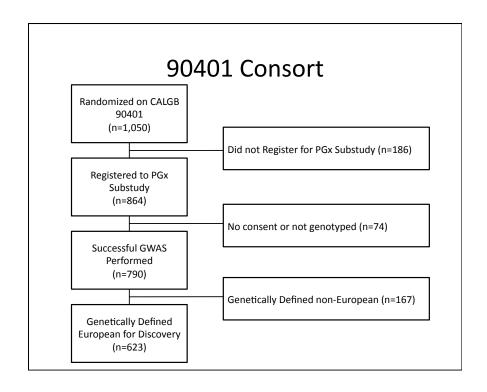






	Grade 2	Grade 3	Grade 4
Neutropenia	<1500-1000/mm ³	1000-500/mm ³	<500/mm ³
Neuropathy	Asymptomatic; loss of deep tendon reflexes or paresthesia	Interfering with function but no activities of daily living	Interfering with activities of daily living
Hypertensio n	Asymptomatic, transient increase by >20 mmHg (diastolic) or to >150/100 if previously WNL	Symptomatic or persistent increase by >20 mmHg (diastolic) or to >150/100 if previously WNL	Requiring more than one drug or more intensive therapy than previously
Proteinuria	2+ to 3+ or >1.0-3.5 g/24 hrs	4+ or >3.5 g/24 hrs	Nephrotic syndrome
Thrombosis	intervention not indicated	Intervention indicated	Embolic event or life- threatening thrombus
Hemorrhage	Gross bleeding or medical intervention necessary	Transfusion or operative intervention indicated	Life-threatening consequences; major urgent intervention





Toxicity Endpoints and Competing Risks in 90401 cohort (n=810)

	Docetaxel Toxicities			Bevacizumab Toxicities							
	Neutropenia		Neuro- Hypertension pathy		Proteinuria		Thrombosis		Hemorr- hage		
	3+	4+	3+	2+	3+	2+	3+	2+	3+	2+	
Toxicity Endpoint	285 36%	161 20%	57 7%	86 11%	34 4%	44 6%	10 1%	53 7%	49 6%	79 10%	
Completed tx w/o toxicity	2%	3%	4%	3%	3%	3%	4%	3%	3%	3%	
Death/ Progres.	31%	37%	40%	36%	38%	38%	39%	38%	39%	39%	
Tx Terminating Adverse Event	19%	26%	32%	34%	37%	36%	38%	34%	35%	31%	
Withdrew/ other	12%	14%	17%	16%	18%	17%	18%	18%	18%	18%	

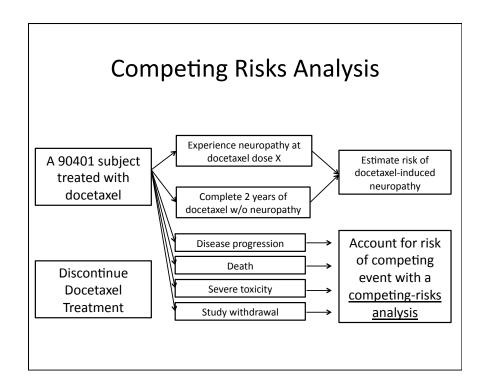
- Prioritize GWAS by:
 - Clinical relevance of toxicity
 - Toxicity event rate
 - Note: half of patients received bevacizumab
 - Likelihood of genetic causal factor
 - Absence of strong confounding

Phenotype Cleaning for Competing Risks Analysis

- · Distinct dataset for each toxicity endpoint GWAS
 - Categorize patients for toxicity of interest or treatment completion
 - Patients who discontinued treatment without experiencing toxicity endpoint categorized by reason for discontinuation (competing risk)
 - · Death or progression
 - Treatment terminating adverse event (TTAE)
 - Withdrawal/other
- Each toxicity or competing risk assigned dose-at-event

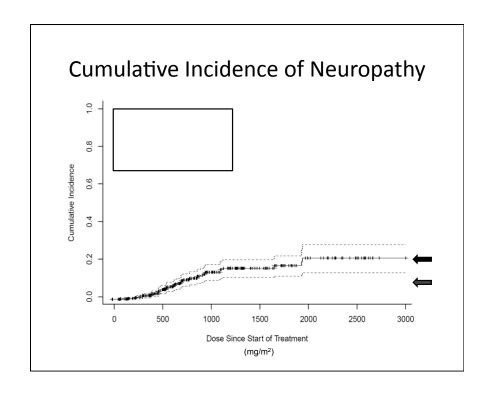
CALGB 90401 Pharmacogenomic Substudy

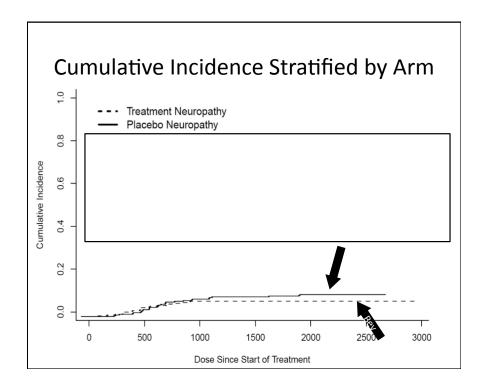
- Aim
 - Discover loci that modulate toxicity risk in prostate cancer patients treated with docetaxel ± bevacizumab
- Separate GWAS for each toxicity of interest
 - Docetaxel: neuropathy, neutropenia
 - Bevacizumab: hypertension, proteinuria, hemorrhage, thrombosis
- Use dose-to-event Cox proportional hazards model for subdistributions
 - Cumulative docetaxel dose (mg/m²) at grade 3+ sensory neuropathy occurrence
 - Adjust for relevant clinical covariates
 - Age (continuous)
 - Diabetes (yes vs. no)
 - BMI (>30 kg/m² vs. other)
 - · Treatment arm (bevacizumab vs. placebo)



Phenotype Cleaning for Competing Risks Analysis

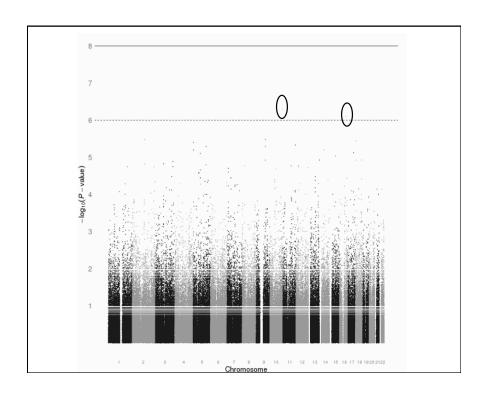
- · Distinct dataset for each toxicity GWAS
 - Categorize every patient by toxicity of interest or competing risk
- Neuropathy GWAS
 - Any patient who experienced neuropathy assigned a 1
 - Any patient who finished treatment w/o neuropathy assigned a 0
- Categorize remaining patients by reason for treatment discontinuation (discontinued treatment before 2 years without neuropathy)
 - Death or progression: 2
 - Treatment terminating adverse event (TTAE): 3
 - Withdrawal/other: 4
 - 2-4 are 'competing risks'
- Each toxicity or competing risk is assigned a dose (or time) at event





Neuropathy GWAS

- 810 Subjects consented and genotyped on Illumina 610 quad
 - Discovery in 623 genetically defined European patients
 - 187 patient replication cohort (genetically defined non-European)
- No SNP reached genome-wide significance before adjustment
- Created priority SNP list based on:
 - P-value/rank
 - Biological plausibility
 - · Previously reported associations
 - Gene function
 - LD with functional variant
 - Regulation of gene expression
 - Encode data



Neuropathy GWAS Priority SNPs Plausible Biological Mechanism rsID Gene MAF P-value Adj p-val HR Rank Functionally related to FGD4 (40101) 2.32 FGD3 5.3E-6 Neuronal outgrowth & 2.29 Highly expressed in the developing CNS 1.1E-5 3.4E-5 Relevant to neuronal 3.25 rs478472 1.7E-5 2.2E-5 ОРСМ Neuronal outgrowth &

Toxicity Endpoints in 90401 (n=810)

	Docetaxel Toxicities			Bevacizumab Toxicities							
	Neutropenia		Neuro- Hype pathy		ension	Proteinuria		Thrombosis		Hemorr- hage	
	3+	4+	3+	2+	3+	2+	3+	2+	3+	2+	
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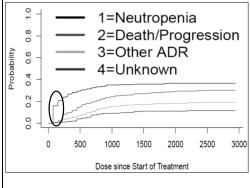
Prioritize GWAS by:

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- Likelihood of genetic causal factor

Toxicity event rate

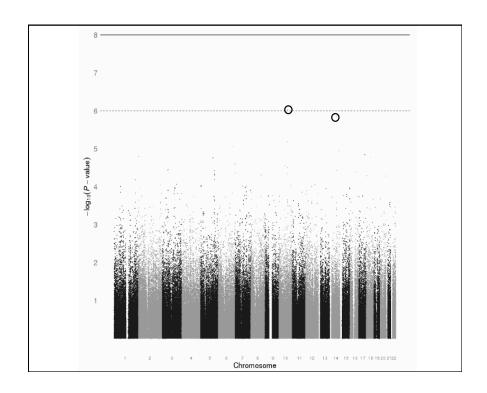
- Absence of strong confounding

Neutropenia Event Rates



Cycle	G3+ Neut	%	Cum. %
1	124	44%	124 (44%)
2	39	14%	<u>163 (58%)</u>
3	24	8%	187 (66%)
4	19	7%	206 (73%)
5	11	4%	217 (77%)
6	9	3%	226 (80%)
7+	59	21%	285 (100%)

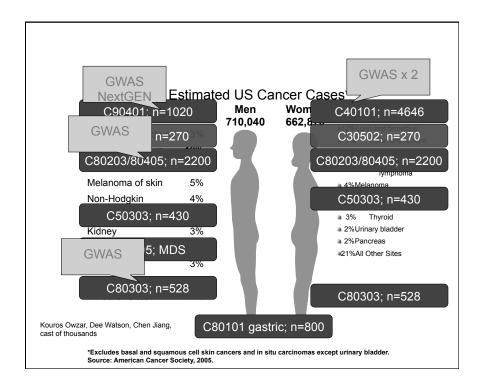
- Neutropenia groups for analysis
 - Case: grade 3+ neutropenia in cycles 1 or 2
 - Control: completed 2 full cycles without G3+ neutropenia
 - Excluded: treatment discontinued or reduced after cycle 1

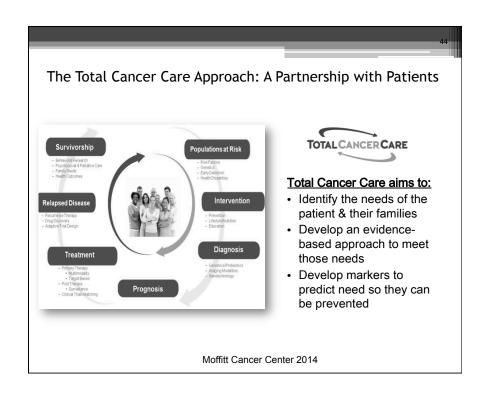


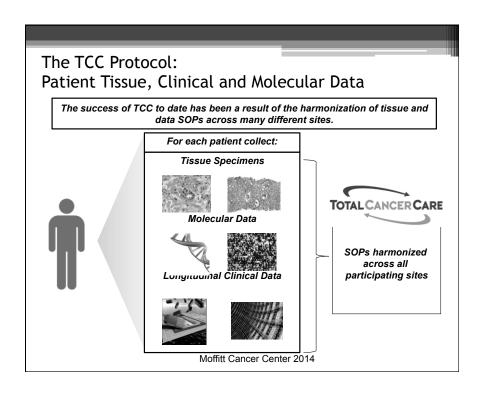
Neutropenia GWAS Top 10 SNPs MAF B-Coeff rsID Gene P-val **Biological Function or Associations** Rank 0.22 9.19E-07 1.14 1.42E-06 Congenital macrothrombocytopenia 0.18 0.74 6.46E-06 LD with #1 (D'=0.98) 8.91E-06 1.15E-05 1.43E-05 PITPNC1 Cell signaling and lipid metabolism rs12618922 TSSC1 1.59E-05 s2385427 D with #7 (D'=0.98) 1.62E-05 -1.15 s16978131 KRT8P5 1.68E-05 Pseudogene

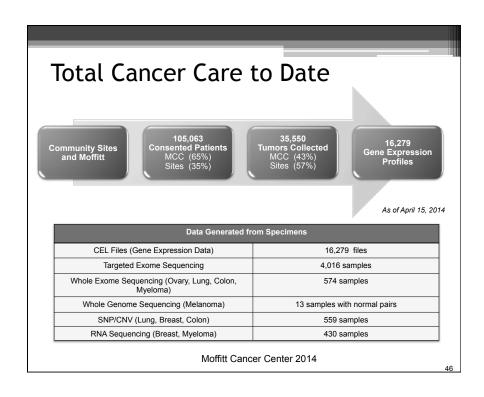
s11241793 ZNF608

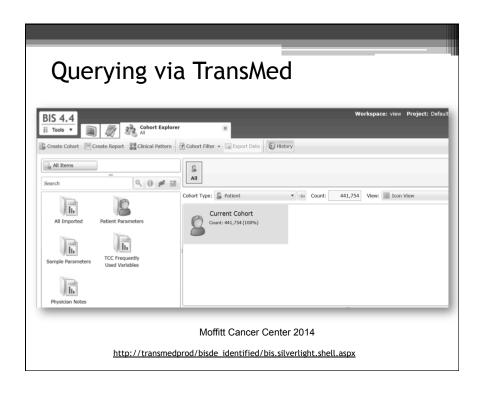
Associations with radiation sensitivity, cognitive impairment, &

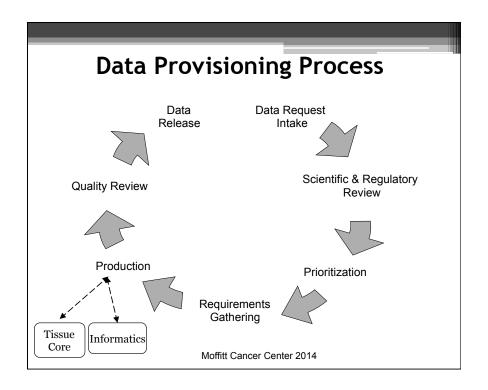


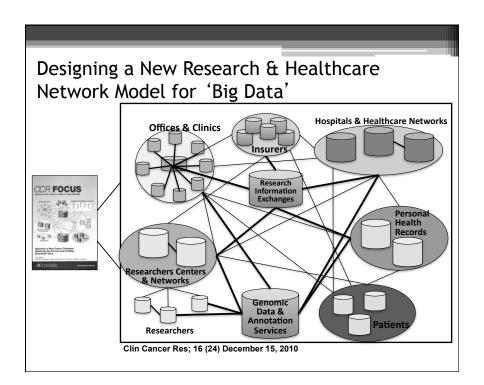














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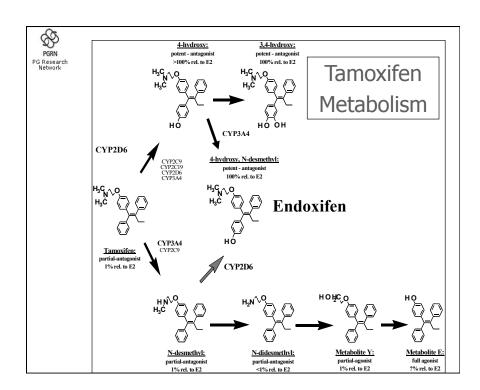


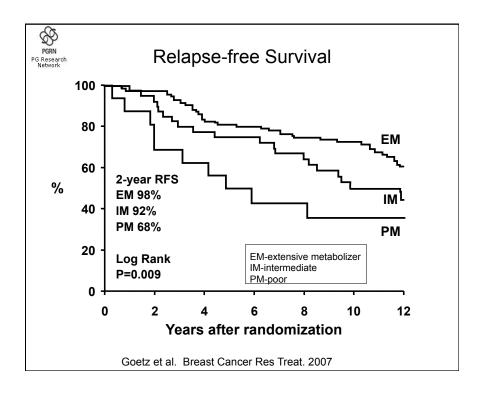
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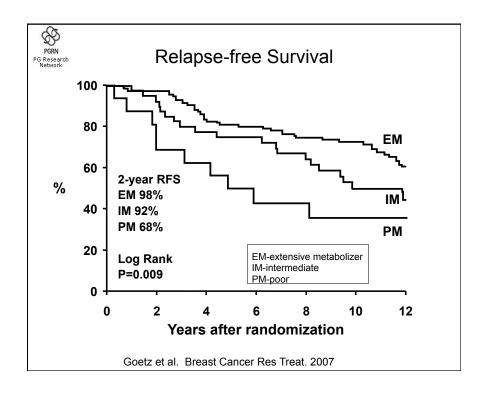


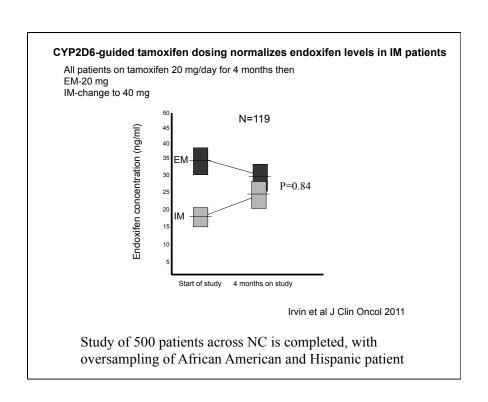




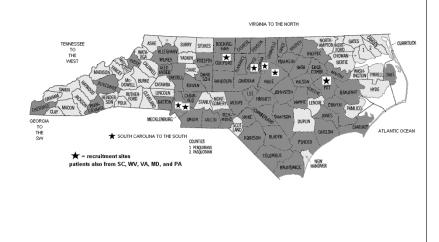


Adjuvant Tamoxifen and CYP2D6 CYP2D6 associated with recurrence Goetz et al. 2005, 2007 (USA) Schroth et al. 2007 (Germany) Kiyotani et al. 2008 (Japan) Newman et al. 2008 (UK) Xu et al. 2008 (China) Okishiro et al. 2009 (Japan) Ramon et al. 2009 (Spain) Bijl et al. 2009 (Netherlands) Schroth et al. 2009, 2010 (Germany, USA) Fugisata et al. 2010 (Japan) Lammers et al. 2010 (Netherlands) Kiyotani et al. 2010 (Japan) Thompson et al 2010 (UK) Kiyotani et al 2012 (Japan) CYP2D6 not associated with recurrence Wegman et al. 2005, 2007 (Sweden) Nowell et al. 2005 (USA) Abraham et al. 2010 (UK) Goetz et al 2011 (USA) Rae et al 2012 (UK) Regan et al 2012 (USA/Europe)



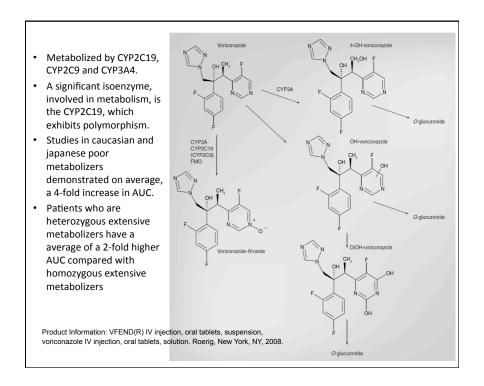


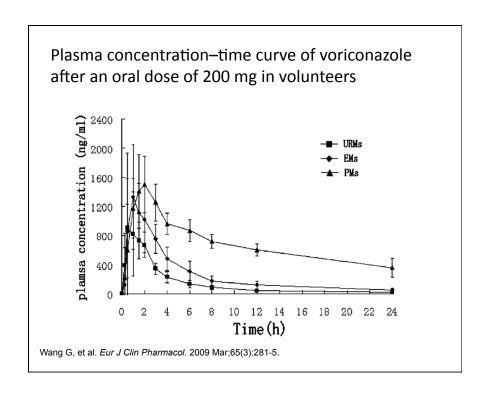
Implementation Science can be conducted where most patients are treated

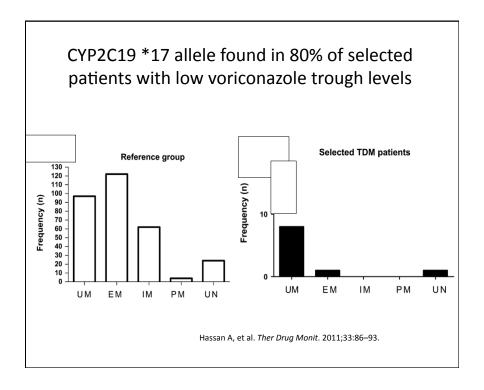


Voriconazole and CYP2C19: Clinical Implications

- Used to treat fungal infection
- Used as fungal prophylaxis in myeloid malignancies







Genotyping for Ultrarapid Metabolizers in Adult BMT and AML Patient Populations Can Save Significant Healthcare Costs

Realistic Case

Cost Savings Model Based on 100 Patients

	# of Patients	Cost of Genotyping	Incremental Savings by Avoiding IFI	Total
Cost of Screening Patients	100	(\$319.12)	-	(\$31,912)
Cost Savings from Genotyping	5	-	\$29,183	\$145,915
Total Cost Savings from CYP2C19 Screening Program				\$114,003
Total Savings/Patient	\$1,140			

Assumptions

Estimated # of Patients with CYP2C19*17 = 30

Predicted # of Patients to Develop IFI = 5.4

Estimated Effectiveness of CYP2C19*17 Status Based Intervention = 94%

Estimated # of IFI Cases Avoided by Genotyping = 5.4 x 0.94 = 5

Moffitt Cancer Center 2014

Genotyping for Ultrarapid Metabolizers in Adult BMT and AML Patient Populations Can Save Significant Healthcare Costs

Conservative Case

Cost Savings Model Based on 100 Patients

	# of Patients	Cost of Genotyping	Incremental Savings by Avoiding IFI	Total
Cost of Screening Patients	100	(\$319.12)	-	(\$31,912)
Cost Savings from Genotyping	1.6	-	\$29,183	\$46,693
Total Cost Savings from CYP2C19 Screening Program				\$14,781
Total Savings/Patient	\$148			

Assumptions: Estimated # of Patients with CYP2C19*17 = 1.8

Estimated Effectiveness of Intervention Based on CYP2C19*17 Status = 90%

Estimated # of IFI Cases Avoided by Genotyping = 1.8 X 90% = 1.6

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Genotyping for Ultrarapid Metabolizers in Adult BMT and AML Patient Populations Can Save Significant Healthcare Costs

Aggressive Case

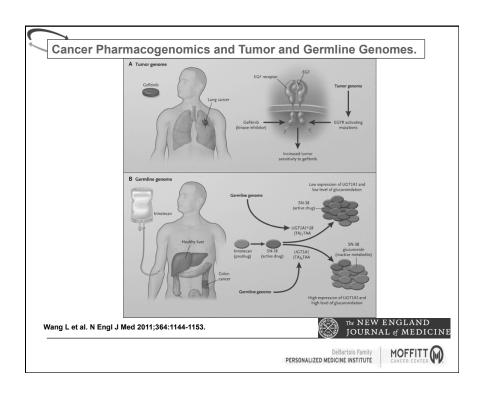
Cost Savings Model Based on 100 Patients

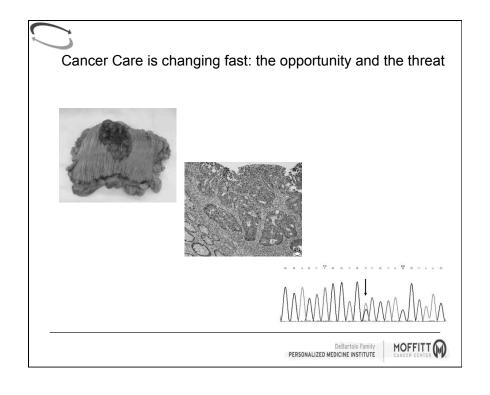
	# of Patients	Cost of Genotyping	Incremental Savings by Avoiding IFI	Total
Cost of Screening Patients	100	(\$319.12)	-	(\$31,912)
Cost Savings from Genotyping	30	-	\$29,183	\$875,490
Total Cost Savings from CYP2C19 Screening Program				\$843,578
Total Savings/Patient	\$8,436			

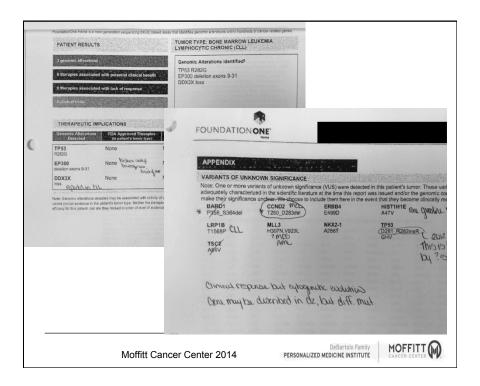
Estimated # of Patients with CYP2C19*17 = 30

Estimated # of IFI Cases Avoided by Genotyping = $5.4 \times 0.94 = 30$

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PGENI iiiiiii

- •Modern medical therapy is a key component of improved health and a sizeable part of health budgets
- •Selection of medications for each indication is a combination of clinical consensus, access/cost of drugs, and familiarity
- •Medicine prioritization is a high stakes undertaking for developing countries
- •We need to use all available data

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Source of data for patient therapy selection

Best option: individual



Good: relevant geographic/ ethnic/racial population



Worst: inferred world population







Overview of study plan

- Identify common ethnic racial groups (>10%)
- Collect 500 blood samples (250 male; 250 female) from each ethnic group.
 Preference is for healthy volunteers (e.g., blood donors).
 Only gender, ethnicity, and age known for each sample.
- · Genotype for variants of interest
- Generate recommendations for medication selection

Africa example

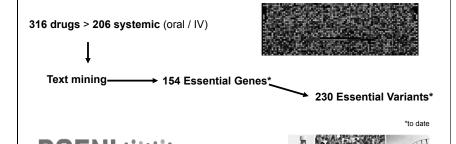
The Gambia: Egypt:
Fulani 18% Eastern Hamitic (Egyptians, 99%
Jola 10% Bedouin,
Mandinka 42% and Berbers)
Wolof 16%

PGENI iiiii Treating the Population.



Selection of drugs and genes

- Focused on systemic drugs from WHO Essential Medicines List (http://www.who.int/)
- Conducted text mining for metabolism, transport and drug target proteins >300,000 articles reviewed
- · Mined literature for allele frequencies of key SNPs in key genes



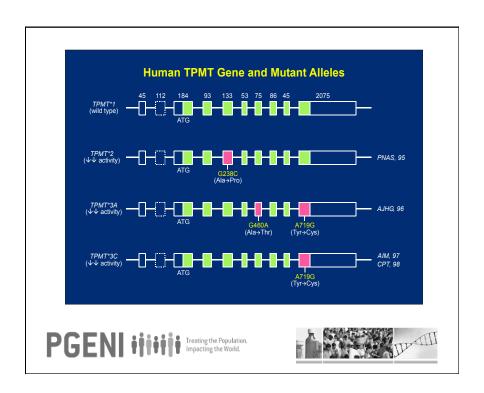


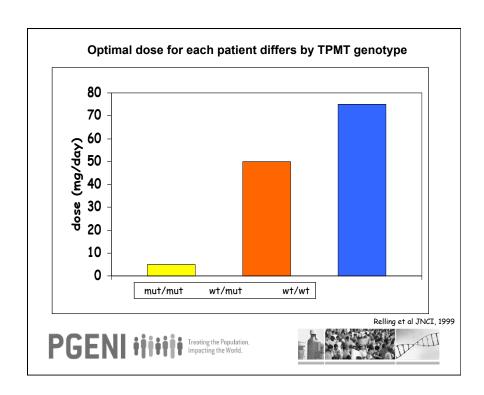
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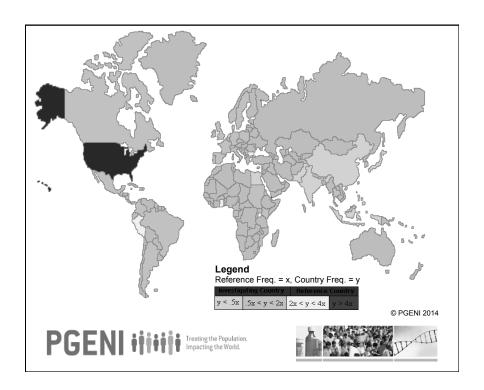
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- HER2-neu—trastuzumab**
- · C-kit mutations—imatinib mesylate**
- Epidermal growth factor receptor mutations—gefitinib
- BRAF-vemurafenib
- · ALK-Crizotinib
- TPMT-mercaptopurine and azathioprine*
- UGT1A1-irinotecan**
- CYP2C9/VKORC1-warfarin*
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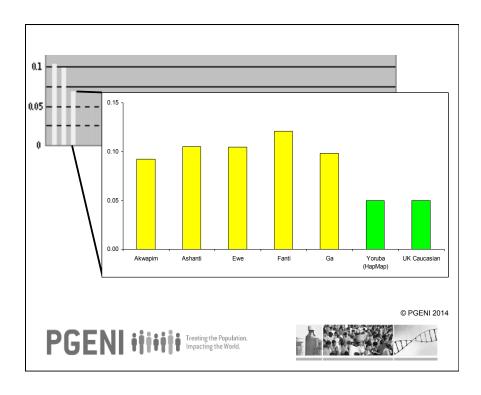
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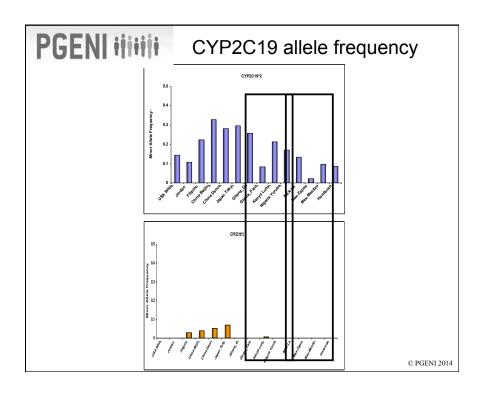












Type of output

Surveillance - identifying population subgroups at higher risk of toxicity or treatment failure

Prioritization - assisting the treatment selection from among WHO recommended therapies





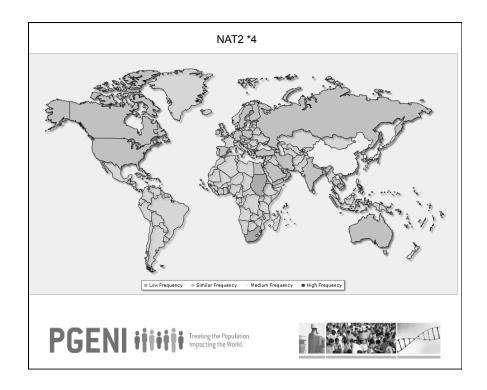
PGENI Surveillance example: Tuberculosis

					Probably	Possibly	Not	No Data	
Drug	Gene	Allele	Effect	Associated	Associated	Associated	Associated	Available	
			Efficacy				X		
	NAT2	*5/*6/*7	Hepatotoxicity	Х					
Isoniazid			Neuropathy		X				
	CYP2E1	*5B	Efficacy					Χ	
	CIFZLI	ם	Hepatotoxicity	X					
Rifampicin	ESB	ECD		Efficacy					X
Kliampicin			Toxicity					X	
Pyrazinamide	XDH		Efficacy					Χ	
Fyrazinaniue ADH	XDI1	ADIT	Hepatotoxicity			X			
Ethambutol	MTND4	MTND4	Efficacy					Χ	
	WHIND4		Optic neuropathy			X			
Streptomycin	MTDND1		Efficacy					Χ	
Streptorriyeni	MIRNRI	MIKNR1		Ototoxicity		X			

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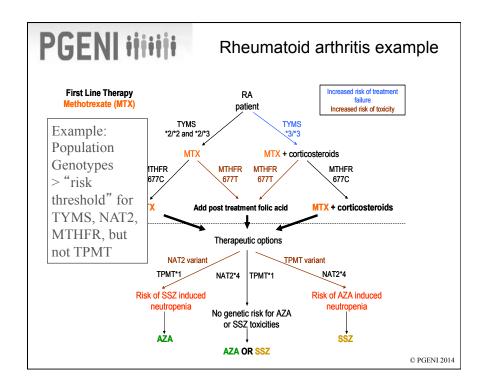
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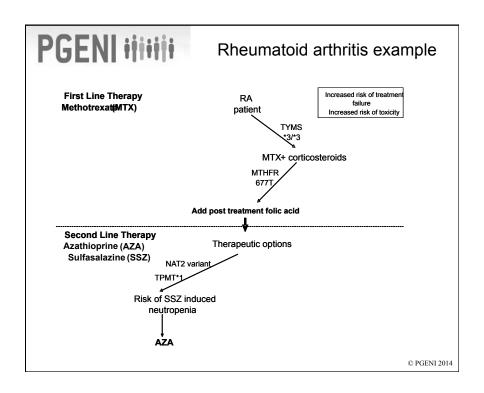
Surveillance - identifying population subgroups at higher risk of toxicity or treatment failure

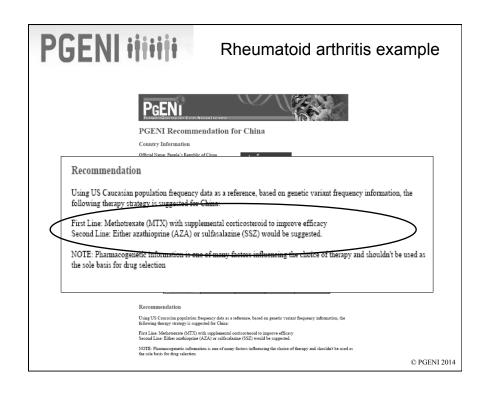
Prioritization - assisting the treatment selection from among WHO recommended therapies

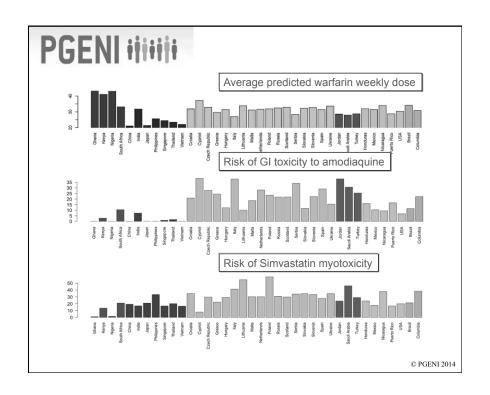
PGEN iiii Treating the Population. Impacting the World.

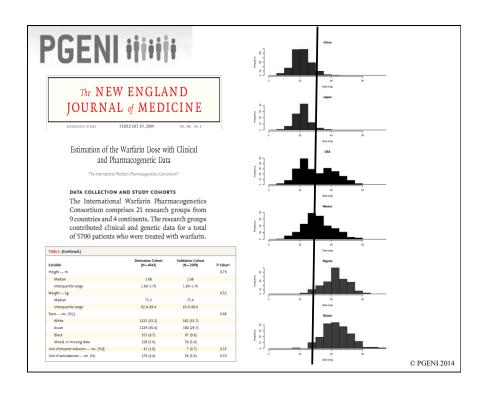


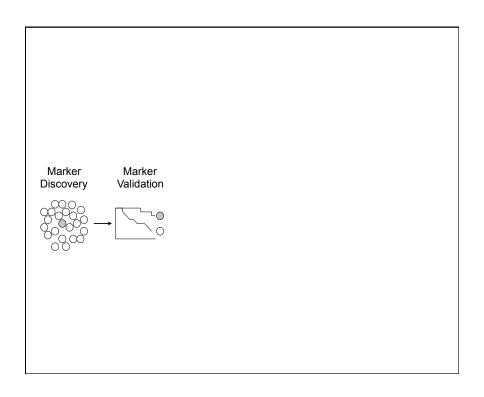


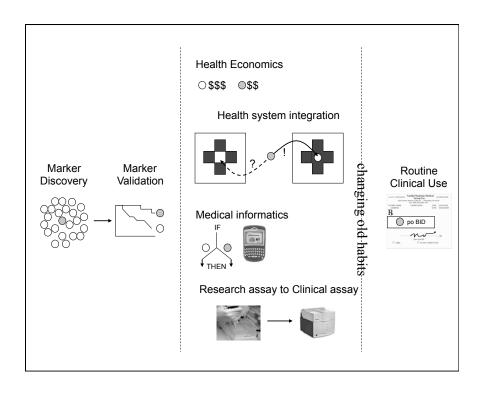


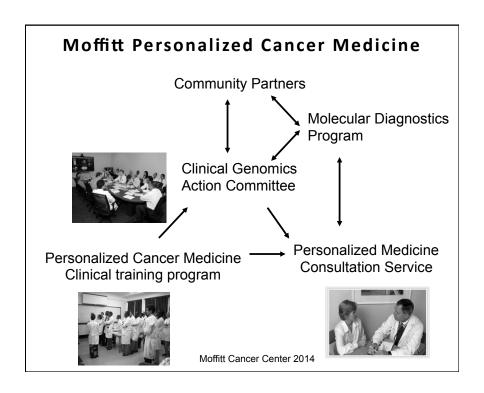












Clinical Risk Panel: easier to test all than some

- · Clinical pathway-driven care
- Adhere to cancer risk guidelines
- · Identify underlying predisposition to severe toxicity
- Mitigating risk of untoward drug effects



Moffitt Cancer Center 2014

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MOFFITT (M)



I have ears, but cannot hear

- 44 year old white male (CSO at a NC biotech)
- AV block 2º congenital heart disease
- Presents for placement of epicardial pacemaker
- Tells cardiologist, CT surgeon, anesthesiologist, and admitting team (cardiology fellow, resident, intern) that an executive physical revealed genetic data relevant to pain control and anticoagulation
- Adequate pain control (4/10) in recovery room on MS
- moved to CCU and switch to oxycodone during the night, waking up in severe pain (10/10), ignored x 24 hours
- Student and PharmD recognized CYP2D6 PM and patient was switched to hydromorphone (5/10)





