

Assessing the Economics of Genomic Medicine

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•DISCLOSURES

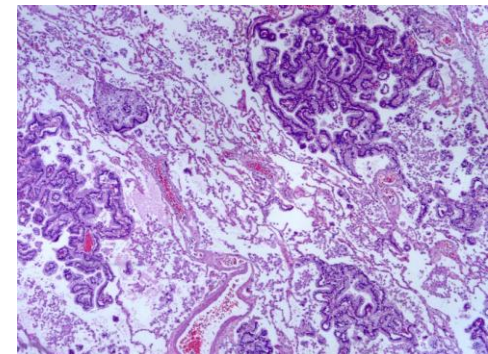
- No conflicts
- Patents
unenforced
- Consultancies
unpaid
- ASCO volunteer
- Government
advisory
Committees
(EGAPP, NCI
BSC)



"It is thornlike in appearance, but I need to order a battery of tests."

Scenario

- The individual presents at age 50 with cough, dyspnea, and chest discomfort. Evaluation reveals a lung mass; bronchoscopy and biopsy reveals *advanced* non-small cell lung cancer. Her tumor is found to have variations that allow the use of targeted therapy and with treatment the patient goes into remission, *followed by relapse, further testing and treatment.*



Cancer Clinical Scenario Conclusions

- Model 1 (targeted mutation testing):
 - Current Practice
 - Resistance
 - Companion Diagnostics
- Model 2 (MPS for disease and actionable variants):
 - More genomes in Oncology than anywhere else
 - More germline genomes also, (including PG), not fully exploited
- Model 3 (MPS + incidentaloma with no threshold):
 - Genomes give more information than exomes
 - Full disclosure of “incidentalome” a research question (45 CFR)

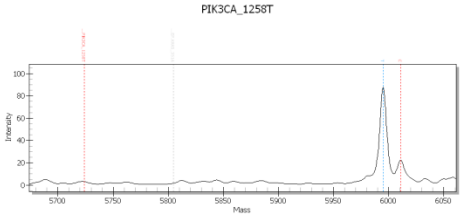
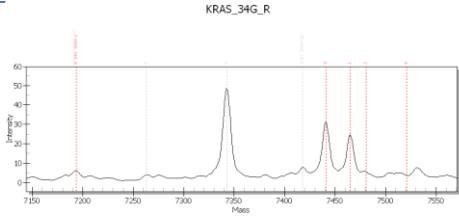
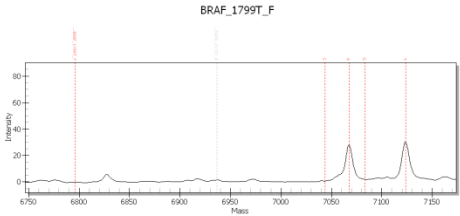
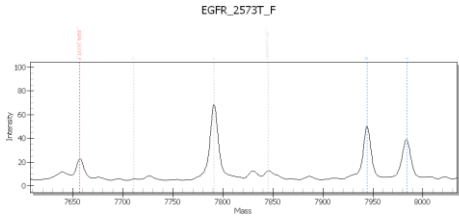
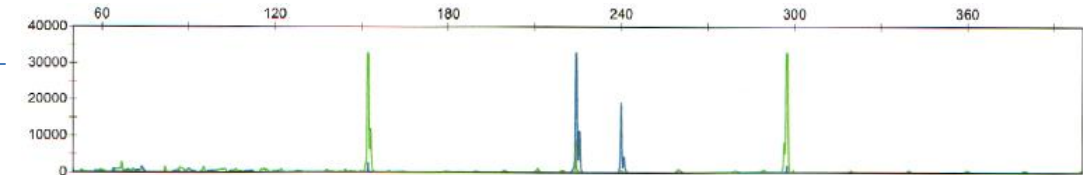
75-82% RR
PFS 8.9-13.3 mos

Model 1:
Targeted
panels
today

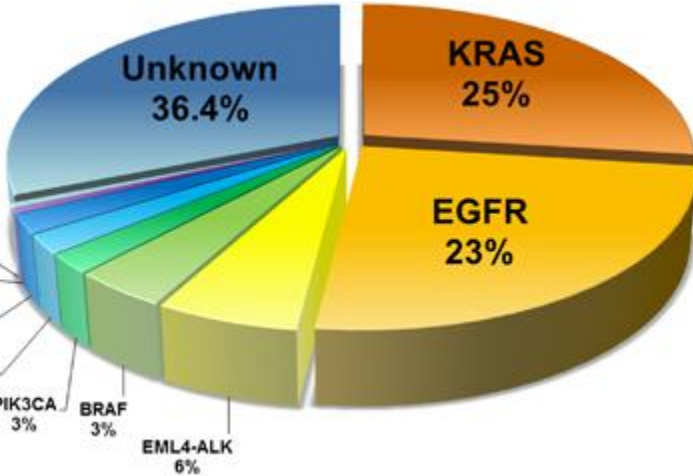
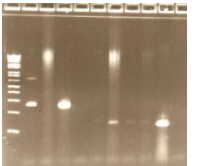
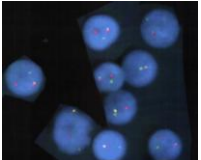
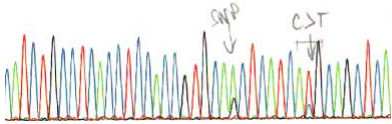
Lung
adenocarcinoma

- EGFR exon 19
- EGFR exon 20
- ERBB2 exon 20
- EGFR exon 21
- PIK3CA
- BRAF
- KRAS
- EGFR T790M
- EML4-ALK
- MET
- ROS

EGFR exon 20 EGFR exon 19 ERBB2 exon 20



CATCTGCGCTCACCTCCACCGTGCACTCATCATGCGAGCTCATGCCCT



Targeted therapies approved or in pre-clinical study for lung cancer

Target	Clinically Approved for Lung Cancer	In Clinical Trials for Lung Cancer	Novel Agents in Preclinical Study	Pathway	Target	Clinically Approved for Lung Cancer	In Clinical Trials for Lung Cancer	Novel Agents in Preclinical Study
EGFR	Erlotinib, cetuximab *	Afatinib (BIBW 2992), BMS-690514, canertinib, CUDC-101, EKB-569, gefitinib [†] , icotinib, lapatinib, matuzumab, necitumumab, neratinib (HKI-272), nimotuzumab, panitumumab, pelitinib, PF0299804, vandetanib, XL647, zalutumumab	AEE 788, AV-412, BMS-599626	Angiogenesis	VEGF	Bevacizumab	Aflibercept (AVE005), AMG706, cediranib (AZD2171)	
				RAS/RAF/MEK/ERK	RAS		Lonafarnib, tipifarnib	ISIS 2503 (H-ras)
					RAF		GSK2118436, regorafenib, sorafenib	AZ628, ISIS 5132, XL281 (BMS-908662)
VEGFR		Axitinib, BMS-690514, brivanib alaninate (BMS-582664), cediranib, E7080, foretinib, linifanib, motesanib (AMG-706), neovastat (AE-941), pazopanib, ramucirumab, regorafenib, sorafenib, sunitinib, tivozanib, vandetanib, vandetanib (BIBF 1120), vatalanib, XL184, XL647, XL999	Adnectin, AEE 788, TKI-258, TSU-68		MEK		GSK1120212, PD325901, selumetinib (AZD6244), sorafenib	AS 703026, AZD8330, GDC-0973, RDEA119
				PI3K/AKT/mTOR	PI3K		BKM120, GDC-0941, PX-866, XL147, XL765	BEZ235, BGT226, LY294002
					AKT		Nelfinavir, MK-2206, perifosine	
ALK	Crizotinib		GSK1838705A, nVP-TAE684		mTOR		Everolimus (RAD001), PX-866, ridaforolimus, sirolimus/rapamycin, temsirolimus (CCI-779)	AZD8055, BEZ235, OSI-027
HER2		Afatinib (BIBW 2992), BMS-690514, CI-1033, CUDC-101, EKB-569, lapatinib, PF0299804, neratinib (HKI-272), pertuzumab, trastuzumab, XL647	AEE 788, AV-412, BMS-599626	Apoptosis	IAPs			HGS1029
					TRAIL		Conatumumab (AMG 655), dulcanermin (AMG 951), mapatumumab	Apomab, lexatumumab
c-MET	Crizotinib	AMG 102, AV-299 (SCH-900105), foretinib, GSK1363089, MetMab, tivantinib (ARQ197), XL184	AMG 208, PF-04217903, PHA-665752, SGX523, SU11274		BCL2		Gossypol, navitoclax (ABT-263), oblimersen, obatoclax	ABT-737
PDGFR		Axitinib, cediranib, dasatinib (BMS-354825), E7080, imatinib, IMC-3G3, linifanib, motesanib (AMG-706), pazopanib, ramucirumab, regorafenib, sorafenib, sunitinib, vandetanib (BIBF 1120), vatalanib, XL999	TKI-258, TSU-68		PARP		Iniparib (SAR240550), veliparbi	AG014699, olaparib FUS1 Fus1 liposome complex
				HSPs	HSP90		Ganetespib (STA-9090), retaspimycin (IPI-504), SNX-5422 (PF04929113), tanespimycin	17-AAG, alvespimycin
IGF-1R		AMG 479, BIIB022, cixutumumab (IMC-A12), figitumumab (CP751,851), MK-0646, OSI906	BMS-754807	HDACs	HDACs		Belinostat, CI-994 (tacedinaline), CUDC-101, entinostat, panobinostat (LBH589), Pivanex, romidepsin, vorinostat	SB939
FGFR		Brivanib alaninate (BMS-582664), E-7080, regorafenib, vandetanib (BIBF 1120), XL999	FP-1039, PD-173074, TKI-258, TSU-68	Proteasome	Proteasome		Carfilzomib, bortezomib, salinosporamide A (NPI-0052)	CEP-18770, MLN9708
c-KIT		Axitinib, cediranib, dasatinib (BMS-354825), imatinib, motesanib (AMG-706), pazopanib, regorafenib, sorafenib, sunitinib, vatalanib		Stem cell pathways	Hh (SMO)		RO4929097, vismodegib (GDC-0449), XL139 (BMS-833923)	Cyclopamine, IPI-926, LDE225
					Notch (γ -secretase)			MK0752, MKK-003, PF03084014
FLT-3		MK0457, sorafenib, sunitinib, XL999		Telomerase	Telomerase		Imetelstat (GRN-163L), KML-001 (sodium meta-arsenite)	Sodium meta-arsenite
SRC/BCR-ABL		AZD0530, dasatinib (BMS-354825), imatinib, XL999	KX2-391	Cell cycle/cell proliferation	p53			p53 peptide vaccine, PRIMA-1
DDR2		Dasatinib (BMS-354825)			MDM2			JNJ-26854165, RO5045337

RTK, ALK, QALY

Economic Analysis: Randomized Placebo-Controlled Clinical Trial of Erlotinib in Advanced Non-Small Cell Lung Cancer

Penelope A. Bradbury,
Ming-Sound Tsao, William
Group on Economic Analysis



British Journal of Cancer (2012) 106, 1100–1106
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www.bjcancer.com

Manuscript received M

Correspondence to: Natali

Results The incremental
year gained
magnitude of
cost-effectiveness

The cost-effectiveness of screening lung cancer patients for targeted drug sensitivity markers

J Natl Cancer

AJ Atherly¹ and DR Camidge^{*,2}

¹Department of Health Systems, Management and Policy, Colorado School of Public Health, University of Colorado, Aurora, CO, USA; ²Division of Medical Oncology, University of Colorado Cancer Center, Anschutz Medical Campus, Anschutz Cancer Pavilion, Mailstop F704, 1665 North Aurora Court, Aurora 80045, CO, USA

RESULTS: For assays costing \$14
NSCLC, excluding treatment of
biomarker frequency from 1.6
unscreened group. Cheaper screening
exceed proportion of subjects
effect of screening cost per QALY
achievable at biomarker frequency

Targeted Genetic Intervention	Cost per QALY
Lung /Erlotinib	\$94,638
Lung /ALK	\$106,707
*BRCA1 testing/MRI age 35-54	\$55,420
**Lynch/IHC/BRAF	\$36,200
*JAMA 295:2374, 2006 **Ann Int Med 155:69, 2011	

Exploiting Genetics of Resistance

Table 1

Overview of recently developed, genotype-guided, molecularly targeted cancer therapies and associated mechanisms of acquired drug resistance

Target	Drug	Acquired resistance mechanism (pre-clinical)	Acquired resistance mechanism (clinical)
EGFR	Gefitinib, erlotinib	<i>EGFR</i> T790M, <i>MET</i> amplification, IGF1R activation, EMT, reversible epigenetic	<i>EGFR</i> T790M, <i>MET</i> amplification, EMT, small cell differentiation
BRAF	Vemurafenib	CRAF elevation, <i>BRAF</i> amplification, COT1 elevation PDGFRB elevation, IGF1R elevation	<i>NRAS</i> mutation, <i>MEK</i> mutation, PDGFRB elevation, COT1 elevation
ALK	Crizotinib	<i>EGFR</i> activation, <i>ALK</i> secondary mutation	<i>EGFR</i> activation, <i>ALK</i> secondary mutation
SMO	Vismodegib, NVP-LDE225	<i>SMO</i> mutation, <i>Gli2</i> amplification, PI3K elevation	<i>SMO</i> mutation
PARP	Olaparib, iniparib, veniparib	<i>BRCA2</i> intragenic deletion	None
JAK1,2	Several	None	None

Current Opinion in Genetics & Development 2012, 22:45–49

Woops, the tumor may show hallmarks of germline changes: the example of *EGFR**T790M

PHYSURGE.COM
SCIENCE : PHYSICS : TECH : NANO : NEWS

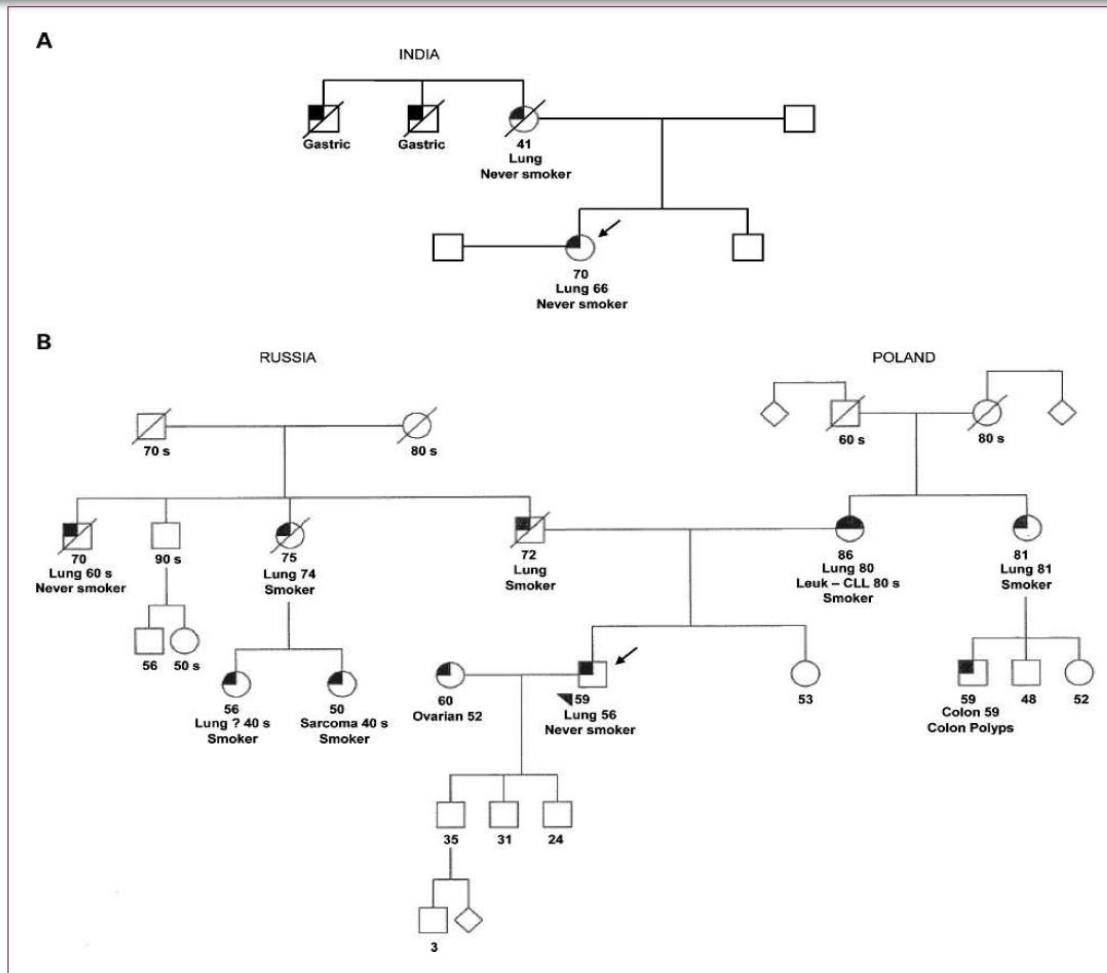


Fig. 3. Pedigrees of patients found to have a germ line *EGFR* T790M mutation. Numbers, ages of family members; arrows, probands; Lung, patients with lung cancer (followed by age at onset); Leuk, leukemia; CLL, chronic lymphoid leukemia; Gastric, gastric cancer.

CT screening reduces lung-cancer deaths in heavy smokers



(PhysOrg.com) -- Studying heavy smokers, the National Cancer Institute's 33-center National Lung Screening Trial found that significantly fewer who were screened with low-dose CT scans died from lung cancer than heavy smokers screened with standard chest X-rays.

The study involved more than 53,000 people in the United States, including more than 3,800 participants at the Washington University School of Medicine and Barnes-Jewish Hospital.

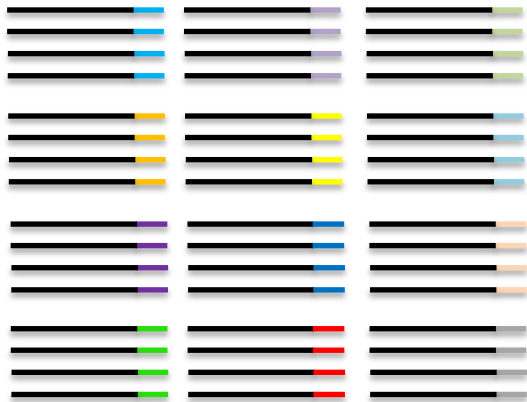
JAMA. 2012;307(22):2418-2429

- Girard et al *Clin Cancer Res*. 2010 Jan 15;16(2):755-63

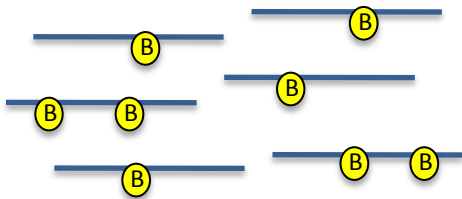
Model 2: Sequencing of “Actionable” Cancer Genes

IMPACT: Integrated Mutation Profilng of Actionable Cancer Targets

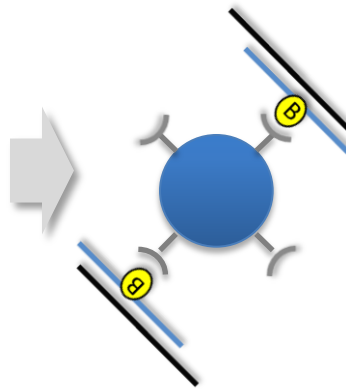
Prepare **12-24 libraries**



Baits for **230 cancer genes**



Hybridize and select
(NimbleGen SeqCap)



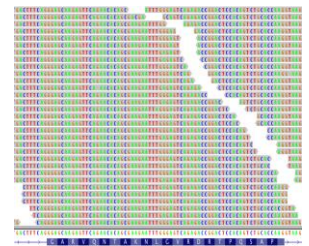
Berger Lab

Sequence to 500-1000X
(1 lane of HiSeq 2000)



Genomics Core Lab

Align to genome
and analyze



Berger Lab

Berger Lab

Current List of 230 Cancer Genes

ABL1	ABL2	AKT1	AKT2	AKT3	ALK	ALOX12B	APC	AR	ARAF	ARHGAP26	ARID1A	ASXL1	ATM	ATRX	AURKA	BAP1	BCL2L1	BCL6	BIRC2	BRAF	BRCA1	BRCA2	CARD11	CBL	CBLB
CBLC	CCND1	CCNE1	CD79B	CDC42EP2	CDC73	CDH1	CDK4	CDK6	CDK8	CDKN2A	CDKN2B	CDKN2C	CEBPA	CHEK1	CHEK2	CREBBP	CRKL	CRLF2	CSF1R	CTNNB1	CYLD	DAXX	DDR2	DICER1	DIS3
DNMT1	DNMT3A	DNMT3B	EGFR	EIF4EBP1	EP300	EPHA3	EPHA5	EPHA6	EPHA7	EPHA8	EPHB1	EPHB4	EPHB6	ERBB2	ERBB3	ERBB4	ERG	ESR1	ETV1	ETV6	EZH2	FAM123B	FAM46C	FAS	FBXW7
FGFR1	FGFR2	FGFR3	FGFR4	FH	FLCN	FLT1	FLT3	FOXL2	GATA1	GATA2	GATA3	GNA11	GNAQ	GNAS	GOLPH3	GRIN2A	GSK3B	HDAC2	HIF1A	HMGA2	HNF1A	HRAS	HSP90AA1	IDH1	IDH2
IGF1R	IGFBP7	IKBKE	IKZF1	INSR	IRS1	IRS2	JAK1	JAK2	JAK3	JUN	KDM5C	KDM6A	KDR	KEAP1	KIT	KLF6	KRAS	LDHA	LGR6	MAGI2	MAP2K1	MAP2K2	MAP2K4	MAP3K8	MCL1
MDM2	MDM4	MEN1	MET	MITF	MLH1	MLL	MLL2	MLL3	MLST8	MPL	MSH2	MSH6	MTOR	MYB	MYC	MYCL1	MYCN	NCOA2	NF1	NF2	NFE2L2	NFKB1	NFKB2	NKX2-1	NOTCH1
NOTCH2	NOTCH3	NOTCH4	NPM1	NRAS	NTRK1	NTRK2	NTRK3	PAK7	PARK2	PARP1	PAX5	PBRM1	PDGFRA	PDGFRB	PHOX2B	PIK3C2G	PIK3CA	PIK3CB	PIK3CD	PIK3CG	PIK3R1	PIK3R2	PIK3R3	PKM2	PLK2
PNRC1	PREX2	PRKAR1A	PRKCI	PTCH1	PTEN	PTPN11	PTPRD	PTPRS	RAF1	RARA	RB1	REL	RET	RICTOR	RPTOR	RUNX1	SDHB	SETD2	SHQ1	SMAD4	SMARCA4	SMARCB1	SMO	SOCS1	SOX2
SPOP	SRC	STK11	SUFU	TBK1	TEK	TERT	TET1	TET2	TGFBR2	TMPRSS2	TNFAIP3	TOP1	TP53	TP63	TSC1	TSC2	TSHR	VHL	WT1	YAP1	YES1				

Caveats:
-VUS!
- consent

When lawyers write consents for commercial (for-profit) NGS



Exome Requisition - Proband (requisition and consent)

*Required for processing

4b. OPTION FOR RESULTS BLINDING (LATER-ONSET DISEASE) [Skip if <18 y.o.]

Later-onset disease: A mutation may increase the risk of developing a particular disease. An individual may carry a mutation but not yet have symptoms of this disease. This can be because symptoms usually begin at an age older than the individual has currently attained. These diseases also may not be fully penetrant; that is, often a mutation in one of these genes may simply increase individual risk of disease but does not predict the onset of disease with certainty. For example: A 40-year-old man is found to carry a mutation in a gene which increases the risk of dementia. He is in excellent health and has no problems with memory or cognition. This may be because the individual will develop symptoms at a later age (50's or 60's) or this individual may never develop symptoms (not penetrant).

In some cases, preventative treatment may be available to prevent or slow the onset of symptoms. Some of these disorders would include: Alzheimers disease, Parkinsons disease, polycystic kidney disease, hypertrophic cardiomyopathy, and many more.

This information may impact personal health (choose one):

☐ I choose to receive information regarding risk for later-onset disease.

_____ ☐ However, there are specific genes or conditions for which I DO NOT want to receive information (indicate them below or attached additional sheet).
(Initial here)

☐ I choose NOT to receive information regarding risk for later-onset disease.

_____ ☐ However, there are specific genes or conditions for which I DO want to receive information (indicate them below or attached additional sheet).
(Initial here)

When Academics write Consent for Research NGS

UNIVERSITY OF MICHIGAN CONSENT TO BE PART OF A RESEARCH STUDY

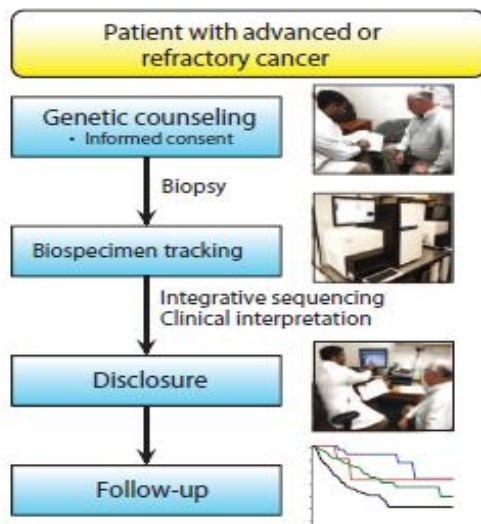
Please feel free to ask questions and discuss your preferences with the study team members. They will help you complete the table. If you do nothing, you will be told. However, if you wish not to be told, please initial where indicated below.

What choices do I have for receiving these other results that do not have direct impact on care of my current cancer?	If you do NOT want to be told of these results, please initial the boxes below.
1) Results that may have significance for biological family members.	
2) Results that are not related to your cancer , but may have potential medical impact for you.	

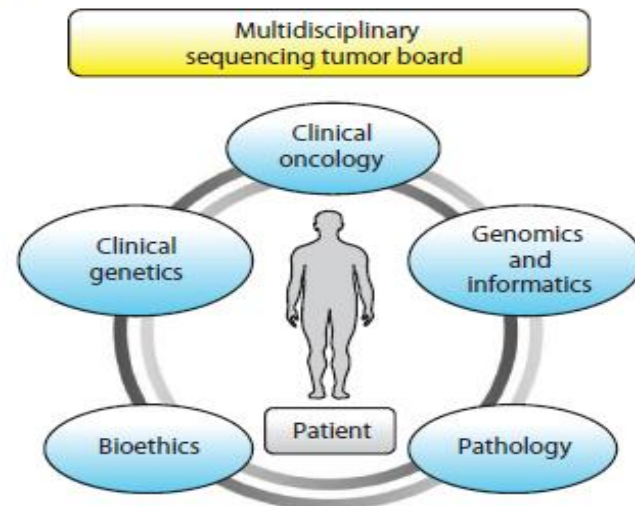
5.2 What are the risks of genetic research?

There are some risks to receiving genetic results. Participants could experience risks such as psychological or emotional distress, loss of insurance, loss of employment, discovery of previously unknown health conditions, discovery that you are not the biological parent of a child(ren), or discovery that you could carry a gene for a certain disease, etc. Therefore, we offer genetic counseling before participation in the study as part of the informed consent process.

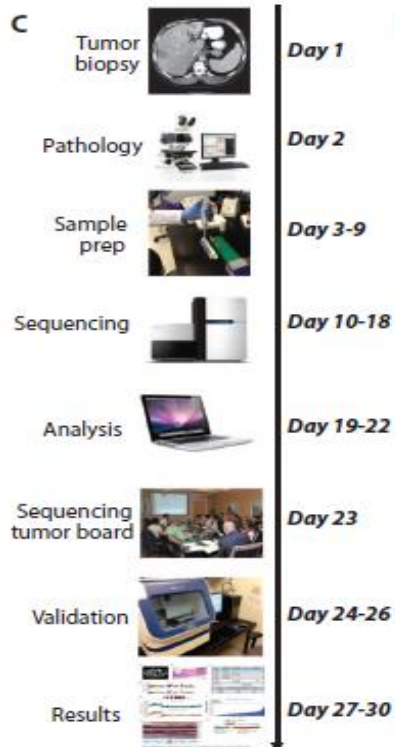
A



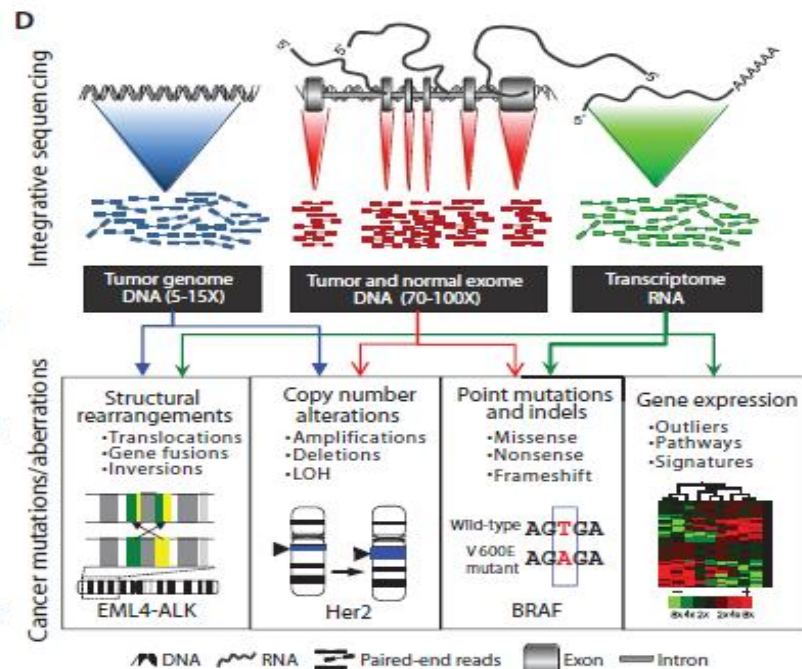
B



C



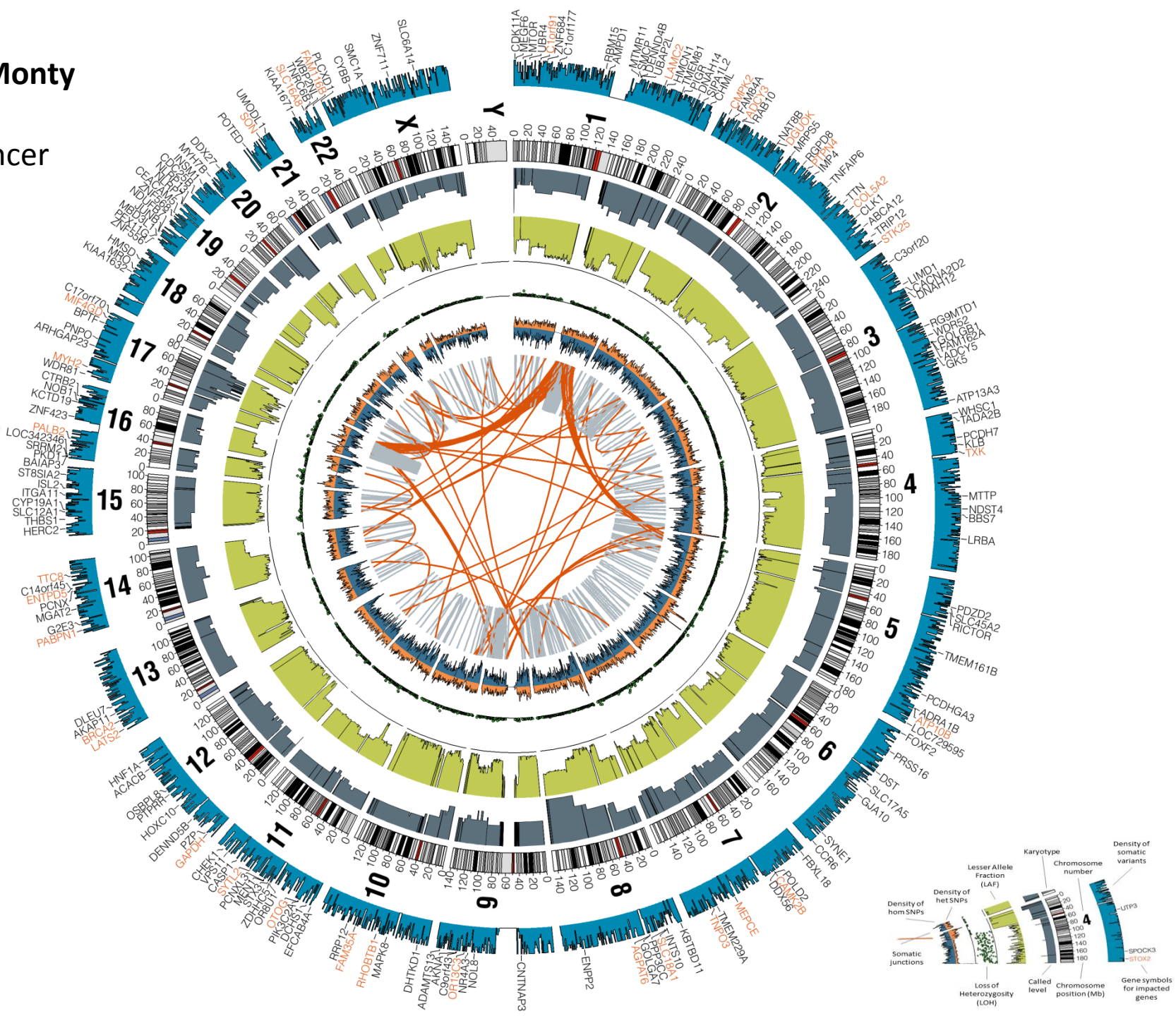
D



The Full Monty

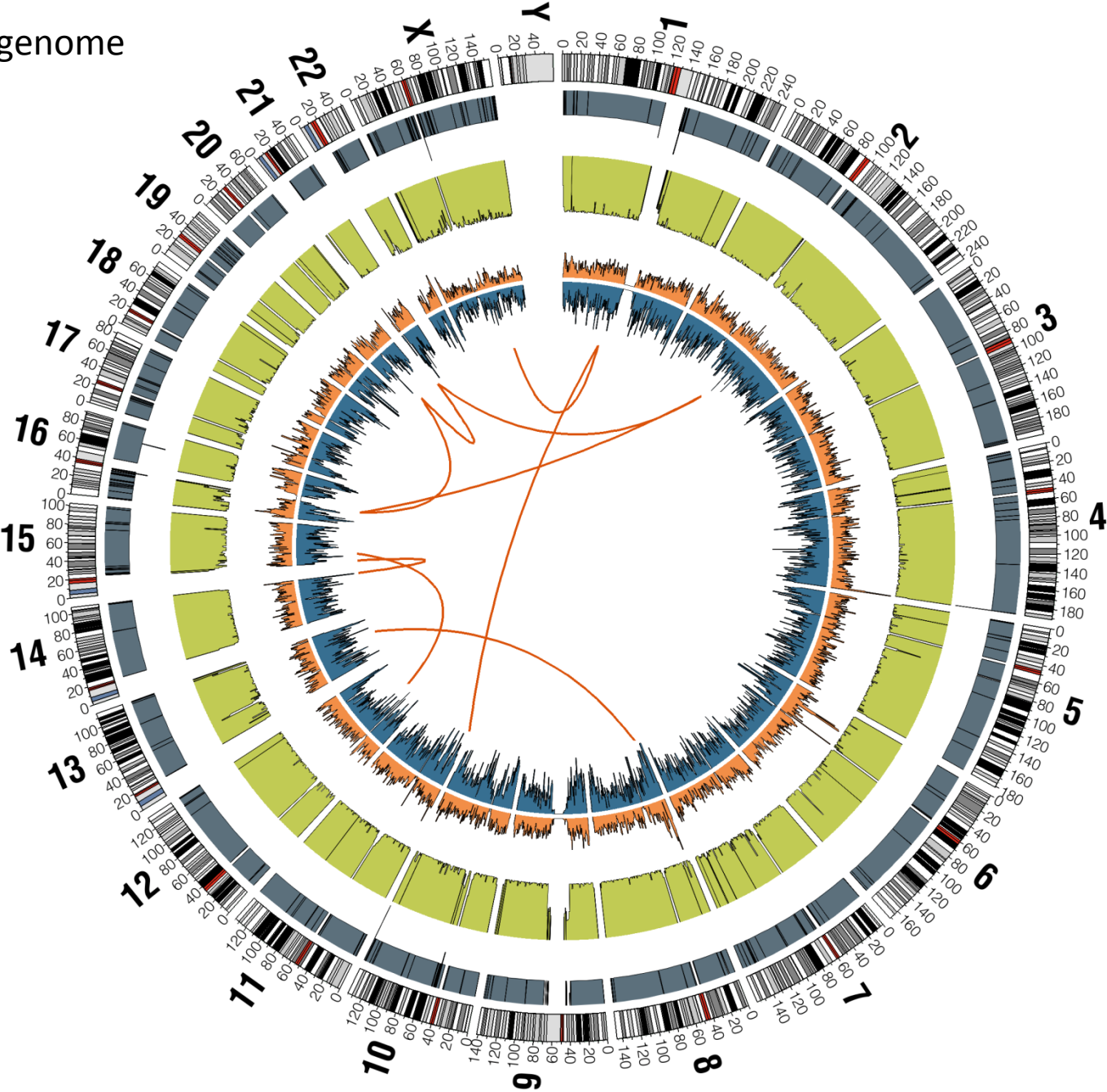
breast cancer
genome

PALB2
Frame shift
mutation



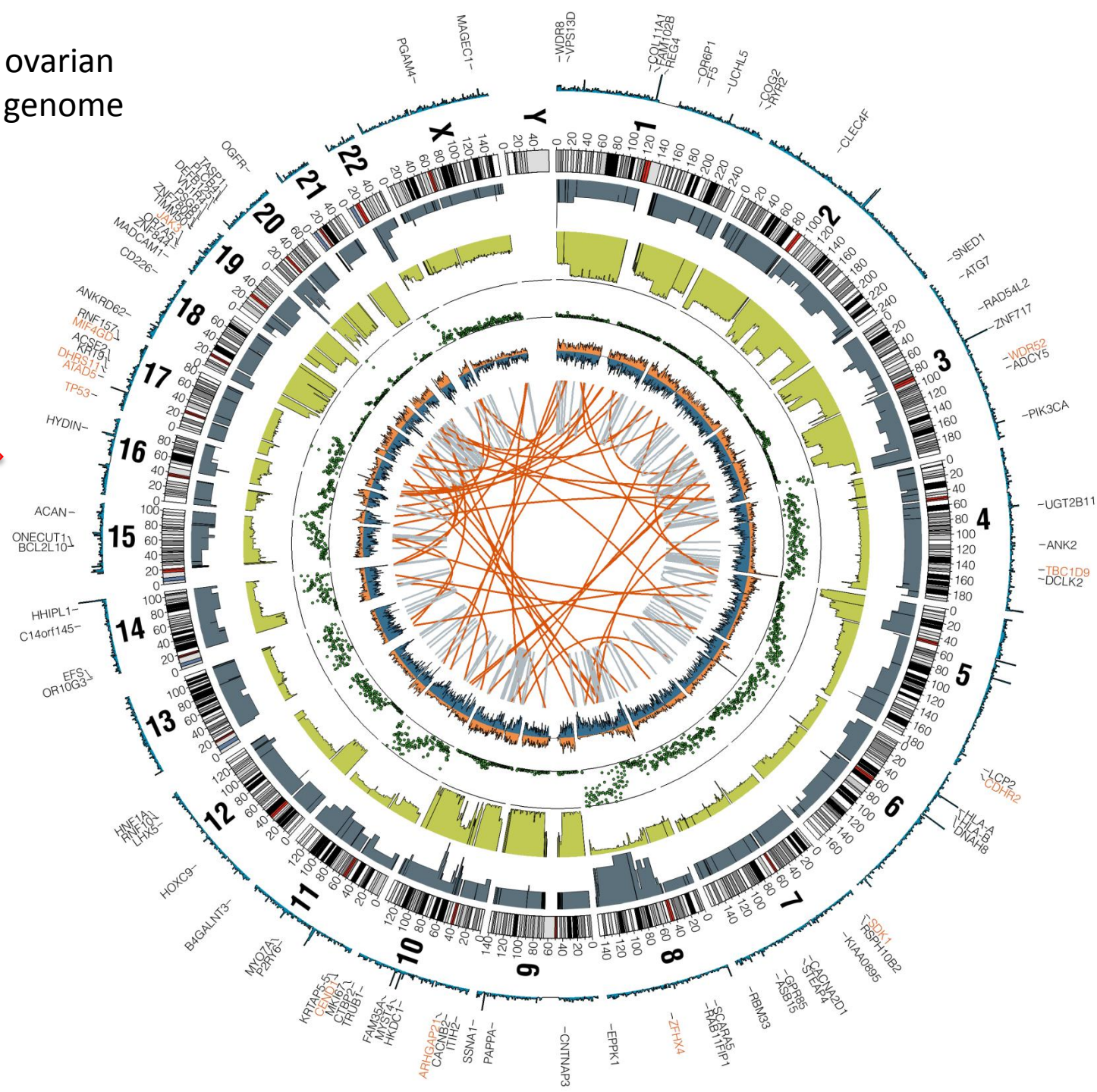
Germline genome

Complex
SV
disrupting
PALB2 in
germline →



Serous ovarian cancer genome

LOH of
PALB2 and
germline
SV retained



Kauff, Offit, *NEJM* 2002;
23;346(21):1609-1534

Robson and Offit, *NEJM*.
2007;357(2):154-62.

CLINICAL PRACTICE

Management of an Inherited Predisposition to Breast Cancer

Mark Robson, M.D., and Kenneth Offit, M.D., M.P.H.

Positive *BRCA1* or *BRCA2*
test result

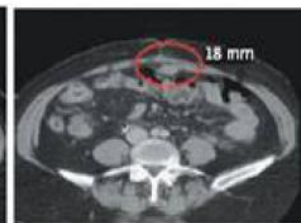
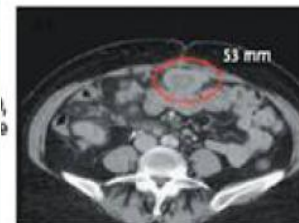
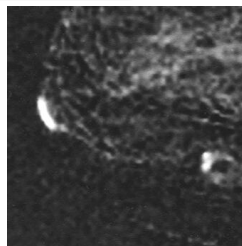
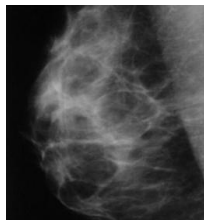
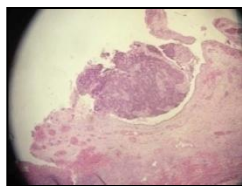
Identify at-risk adult
relatives; offer genetic
counseling/testing

Surgery

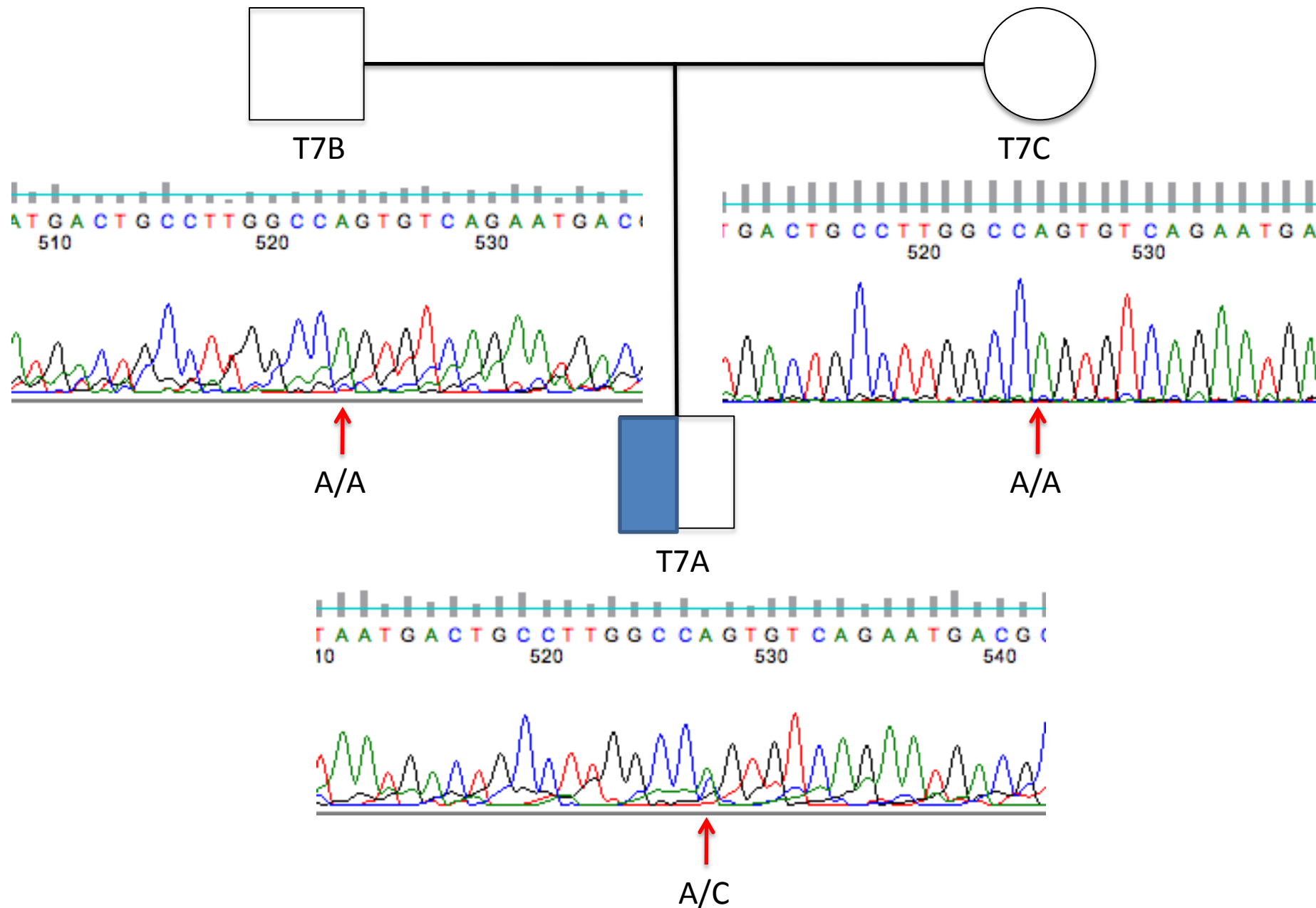
Increased
surveillance

Chemo-
prevention

Treatment
PARPi



De Novo Mechanisms in Human Cancer Etiology



Adapted Berg model

Return of results	OPT-OUT:	OPT-IN:			OPT-IN:	UNAVAILABLE
	RESULTS CHANGE MEDICAL MANAGEMENT	IT MAY BE IMPORTANT INFORMATION BUT IT WILL NOT CHANGE MEDICAL MANAGEMENT			PRENATAL TESTING MAY BE AVAILABLE	UNINTERPRETABLE INFORMATION
BINs	1	2A	2B	2C	3	4
level of risk:	High	Low	Medium	High	Low to person, potentially high to offspring	
Examples:	<i>a single gene change that gives a >60% life time risk for breast cancer</i> OR <i>a single gene change that causes people with it to have less side effects when a certain drug is given</i>	<i>gene changes that may slightly alter your risk of common diseases</i>	<i>gene changes that may slightly alter your risk of important diseases or single gene conditions for which no firm clinical recommendations exist</i>	<i>a single gene change that gives a high life time risk for untreatable neurodegenerative disease</i>	<i>Carrier status for severe AR or X-linked disease : childhood onset neurodegenerative disease OR Mental retardation</i>	<i>Will need further research before clinical relevance can be established</i>

table adapted from Berg et al. (reproductive bin 3 added)

Results of a single genome (exome)

No bin 1 variants

Bin 2a: 3 SNPs

1 = PharmG

CYP2C9 rs1799853

2 = low risk cancer SNPs

IL23R rs11209026

CLPTM1L rs402710

Bin 2b: 14 previously reported variants, no novel

3 carrier conditions: Sitosterolemia,
Methylmalonic aciduria, Hemansky Pudlak
syndrome

The effect sizes of most GWAS cancer risk SNPs are small and of no clinical utility (Stadler et al 2010,2011; EGAPP)

Genetics, Genomics, and Cancer Risk Assessment



Exception; modifying SNPs in BRCA2/1 background

•Gaudet PLOS Genet, Couch Nat Genet, 2010, submitted

HMZ nonsense

	A	B	C	D	E	F	G	H	I	J	K	L
1	GENE	SAMPLE	CHROM	POS	REF	ALT	FILTER	QUAL	ID	SNPEFF_EFFECT	SNPEFF_FUNC	SNPEFF_IM
15275	OVGP1	s_11_7_19	chr1	111968121	C	T	PASS	3681.66	rs1264887	STOP_GAINED	NONSENSE	HIGH
15384	OR52N4	s_11_7_19	chr11	5776484	A	T	PASS	8847.87	rs4910844	STOP_GAINED	NONSENSE	HIGH
15846	MUC19	s_11_7_19	chr12	40834955	C	A	PASS	3196.79	rs1078461	STOP_GAINED	NONSENSE	HIGH
16258	FAM187B	s_11_7_19	chr19	35719020	C	T	PASS	2985.7	rs541169	STOP_GAINED	NONSENSE	HIGH
16697	ADAMTS1	s_11_7_19	chr21	28216066	C	T	PASS	1329.42	rs370850	STOP_GAINED	NONSENSE	HIGH
16959	H2BFM	s_11_7_19	chrX	103294760	C	T	PASS	558.3	rs2301384	STOP_GAINED	NONSENSE	HIGH



A Systematic Survey of Loss-of-Function Variants in Human Protein-Coding Genes

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Genome-sequencing studies indicate that all humans carry many genetic variants predicted to cause loss of function (LoF) of protein-coding genes, suggesting unexpected redundancy in the human genome. Here we apply stringent filters to 2951 putative LoF variants obtained from 185 human genomes to determine their true prevalence and properties. We estimate that human genomes typically contain ~100 genuine LoF variants with ~20 genes completely inactivated. We identify rare and likely deleterious LoF alleles, including 26 known and 21 predicted severe disease-causing variants, as well as common LoF variants in nonessential genes. We describe functional and evolutionary differences between LoF-tolerant and recessive disease genes and a method for using these differences to prioritize candidate genes found in clinical sequencing studies.



Cancer Clinical Scenario Conclusions

- **Model 1 (targeted mutation testing):**
 - Targeted therapy is current practice, but access an issue
 - More expensive with more targets *and more resistance*
 - A resistance genotype may be seen in the germline
 - Cost of companion diagnostics may be impacted by *Prometheus* case (*)
- **Model 2 (NGS for disease and actionable variants):**
 - Exon capture and whole exome analysis of tumors require germline controls: disclosure of actionable variants in cancer will impact pharmacogenomics as well as non-cancer disease risk in future generations
- **Model 3 (NGS + incidentaloma with no threshold):**
 - Whole exome/genome analysis of tumors may reveal germline changes with therapeutic as well familial risk implications.
 - May be prefigured if ID HHS-OPHS-2011-0005 change in 45 CFR (*)
 - As in other scenarios, full disclosure of “incidentalome” - outside context of medical practice standards -- will likely lead to clinical and economic inefficiencies (variants, utility concerns).



The end of the beginning