Informatics Update: Progress Towards Precision Cancer Surveillance

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> Thirty-second Annual Advanced Cancer Registrars Workshop August 16, 2018





Topics to be Covered

- Growing evidence supporting precision medicine in cancer
- Implications for cancer surveillance and public health
- KCR informatics initiatives that are enhancing precision medicine data capture in registries
- Using precision cancer surveillance data
- Future plans



Growing Evidence Supporting Precision Medicine Initiatives

| Dictionary | |
|------------|--|
|------------|--|

precision medicine

Q

pre-ci-sion med-i-cine

noun

medical care designed to optimize efficiency or therapeutic benefit for particular groups of patients, especially by using genetic or molecular profiling.

"current research is focused around precision medicine—classifying patients on their tumor's molecular changes"

Translations, word origin, and more definitions

Feedback



EURTAC Study Design

- Erlotinib 150mg/day Chemonaïve Stage IIIB/IV NSCLC Stratification EGFR exon 19 deletion or Mutation type ECOG PS (0 vs 1 vs 2) exon 21 L858R mutation ECOG PS 0–2 (n=174) x 4 cycles* Secondary endpoints Primary endpoint
- Progression-free survival (PFS)
 - interim analysis planned at 88 events
- Patients enrolled between 2007 and 2011

- Platinum-based doublet chemotherapy q3wks
 - Objective response rate
 - Overall survival (OS)
 - Location of progression
 - Safety
 - EGFR mutation analysis in serum
 - Quality of life

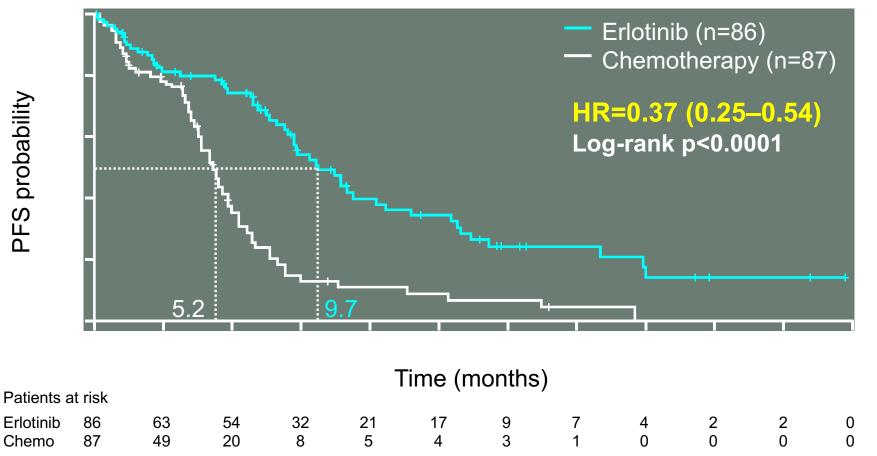


PD

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Slide courtesy of Dr. Jill Kolesar

EUROTAC: First-line Treatment in EGFR Mutation Positive NSCLC



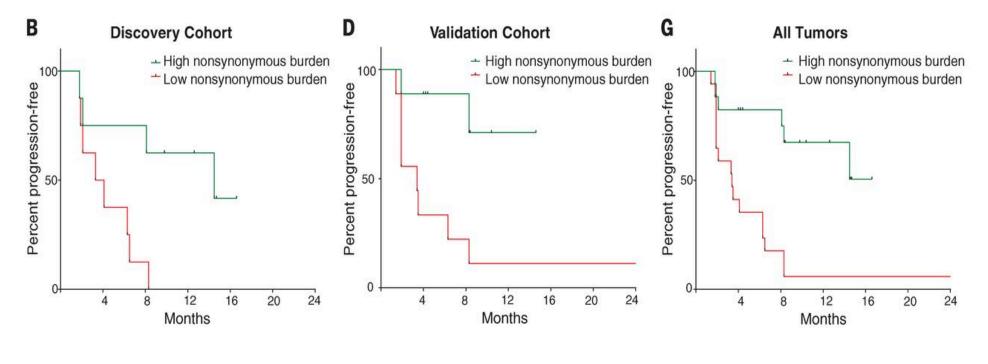


Slide courtesy of Dr. Jill Kolesar

Rosell R, et al. Proc ASOC 2011, #7503

Immuno-therapy with PD-1 Targeted Pembrolizumab

Nonsynonymous mutation burden associated with clinical benefit of anti–PD-1 therapy in non-small cell lung cancer.

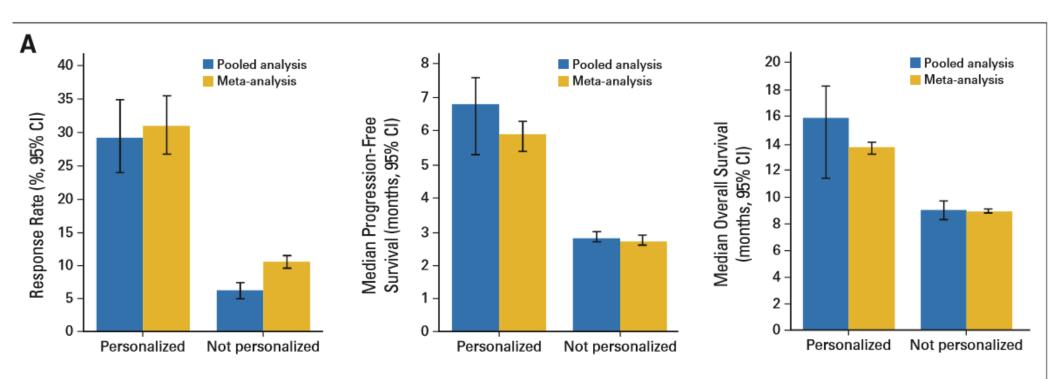


Naiyer A. Rizvi et al. Science 2015;348:124-128



Study Conclusions: More Mutations Predict Better Efficacy

Pooled Analysis of 570 Phase II Trials of Single Agent Targeted Therapies



Schwaederle, MM, et al. JCO 2015



Slide courtesy of Dr. Jill Kolesar

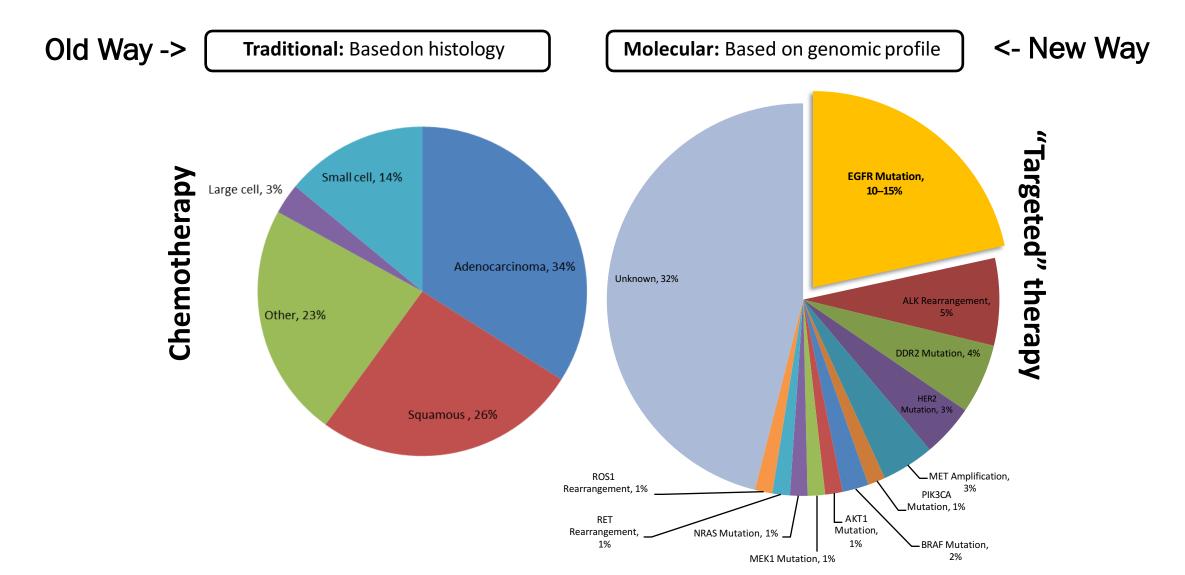
The Precision Medicine Paradigm Shift

Implications for Cancer Surveillance and Public Health





Shifting Paradigm in Lung Cancer Treatment



Role of Precision Cancer Surveillance

- 1. Capture data that accurately measures the implementation and use of precision medicine in clinical settings
- 2. Evaluate the adoption of precision medicine and impact on the population
- 3. Leverage population-based data to ensure maximum benefit to the entire population through evidence-based cancer prevention and control
- 4. Leverage population-based data to accelerate further advances in precision medicine
 - a) Basic research
 - b) Clinical research
 - c) Population research

} Translational Science



From Precision Medicine to Precision Cancer Surveillance

pre · ci · sion sur · veil · lance

Cancer surveillance designed to optimize efficiency in medical care or predict therapeutic benefit for particular groups of patients, especially by using genetic or molecular profiling across entire populations of patients

"Current KCR research is focused around precision surveillance – how to develop informatics methods to deliver efficiencies in registry operations in order to capture additional information so that we may classify <u>all</u> cancer patients by their tumor's molecular changes"



Capturing the Data (The Very Big Data)

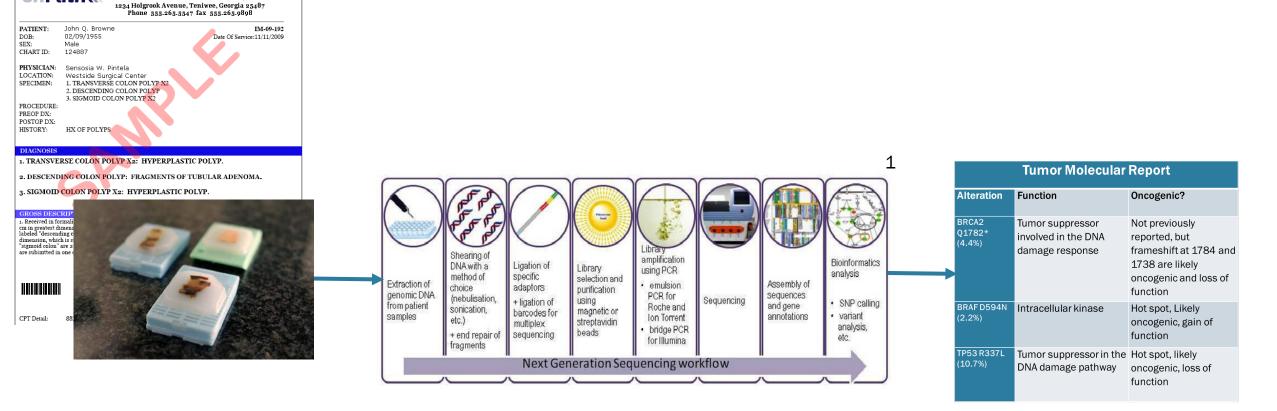
Implications for Hospital Cancer Registries





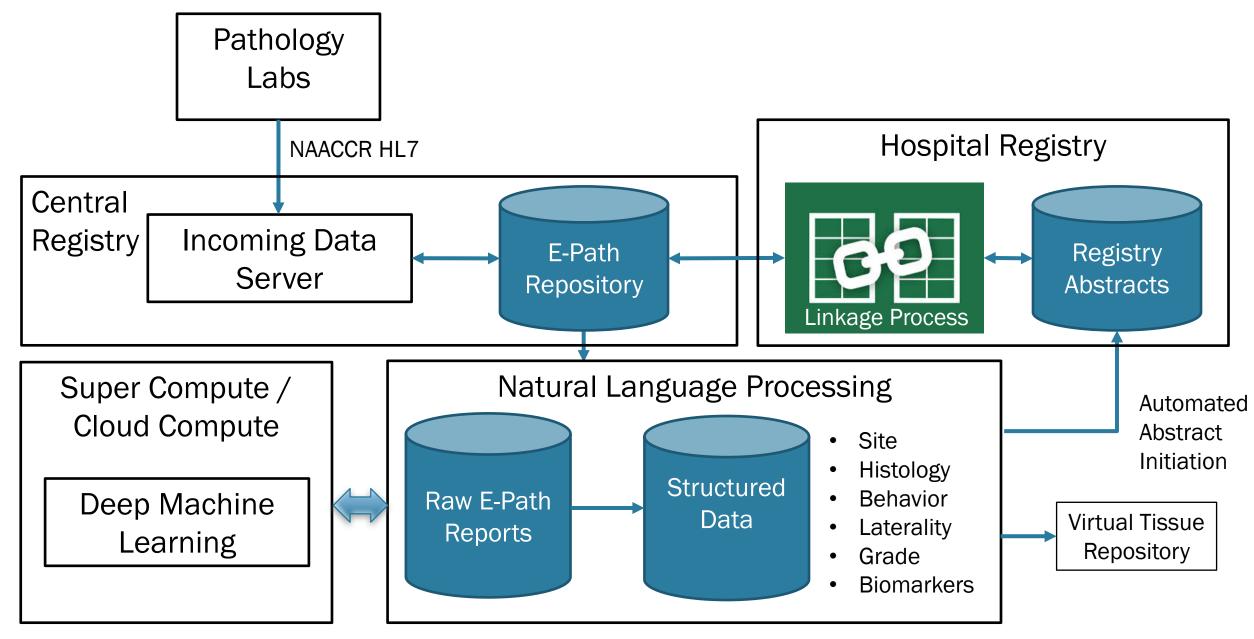
onPath«

INTERNAL MEDICINE SPECIALISTS, INC.



¹Next generation sequencing applications for breast cancer research - Scientific Figure on ResearchGate. Available from: https://www.researchgate.net/Overview-of-the-main-steps-in-Next-Generation-Sequencing-workflow_fig1_282061980 [accessed 13 Aug, 2018]

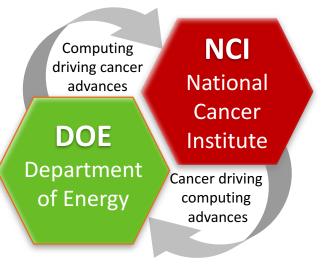
Electronic Pathology Data Flow at KCR



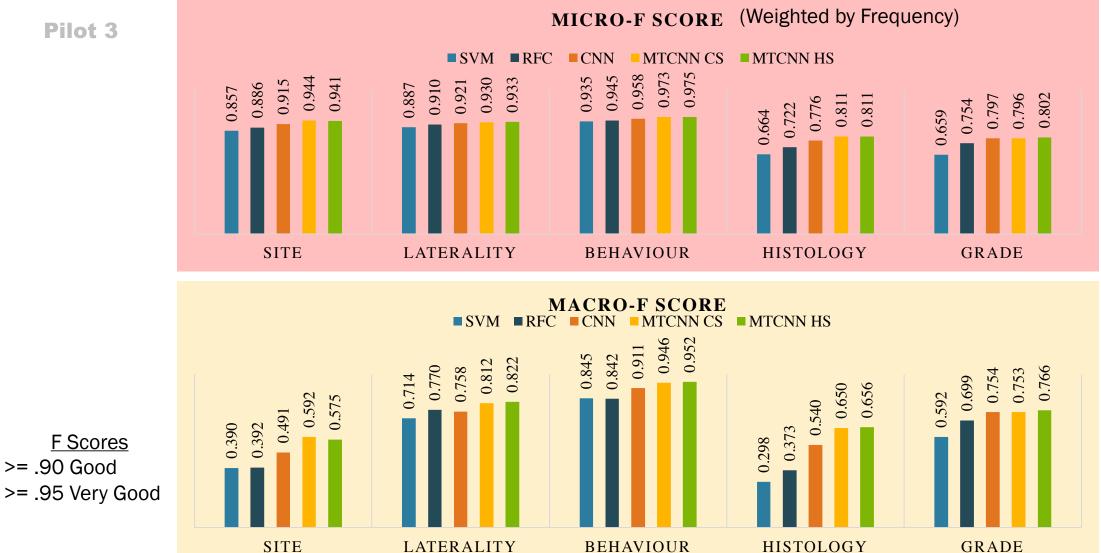
KCR Collaborating with National Cancer Institute and Department of Energy (DOE) on Major NLP Initiative

- KCR one of only four SEER registries chosen to participate
- Moonshot Initiative
 - Exascale CAncer Distributed Learning Environment (CANDLE)
- Pilot 3: Population Information Integration, Analysis, and Modeling
- Specific Aim: Deep NLP for Information Capture
 - Advanced machine learning for scalable patient information capture from unstructured clinical reports to semi-automate SEER data capture

DOE-NCI partnership to advance exascale development through cancer research



Tumor-Level Analysis: 2-fold cross-validation 2004-2015 data (59,427 cases)



Pilot 3

KCR/Markey Team at the Oakridge National Lab SUMMIT: Most Powerful Supercomputer on Earth





Capturing Biomarkers

Natural Language Processing for Electronic Pathology Reports



Capturing Molecular Biomarkers the Old-fashioned Way: Manual Abstraction of Site Specific Factors

Brain and CNS

- Brain molecular markers
- Brain & CNS chromosome 1p and 19q
- MGMT
- Breast
 - Ki-67
 - Oncotype DX
- Colon and Rectum
 - KRAS
 - Microsatellite Instability (MSI)
- Uveal Melanoma
 - Chromosome 3 and 8q status
- Oropharynx
 - HPV Status



NLP to Enhance Automated Capture of Biomarkers

- NCCN Guidelines for EGFR and ALK Testing in Lung Cancer
 - EGFR
 - Epidermal growth factor receptor (EGFR) mutations cause new cancer cells to form quickly
 - Testing advised for metastatic lung adenocarcinomas, large-cell lung carcinomas and unknown subtypes
 - ALK
 - Anaplastic lymphoma kinase (ALK) gene re-arrangements makes an overactive ALK surface receptor that helps lung cancer cells grow
 - <u>Testing advised</u> for metastatic lung adenocarcinomas, large-cell lung carcinomas and unknown subtypes



KCR Collaboration with the SEER Seattle Puget-Sound Registry and the Fred Hutchinson Cancer Research Center

Hypothesis

- NLP can be used to derive ALK and EGFR testing results from non-small cell lung cancer E-Path reports

Study Methods

- Each team selected 1000 random E-Path reports from their respective registry
 - Seattle ended up selecting over 3500 reports
- Lung cancer oncologists reviewed all E-Path reports to identify reports indicating ALK and EGFR testing and reporting of testing results
- Each team developed a machine-learned NLP model to derive tests and test results from E-Path reports
- Model tested on other team's cohort of E-Path reports



Study Results

Seattle and Kentucky achieved excellent results identifying EGFR and ALK testing was ordered

- F-Scores 96.0 98.0
- Seattle performed better identifying positive test results
 - Seattle ALK/EGFR Positive Results F-Scores 97.0
 - Kentucky EGFR Positive Results F-Score 60.0
- Models did not perform well on the other site's E-Path reports
 - Seattle on KY Data: ALK/EGFR F-Scores 36.0, 4.0, respectively
 - Kentucky on Seattle Data: results pending
- Conclusions
 - Testing results not routinely reported
 - Pathology reporting terminology for biomarkers differs by region
 - Models perform better when trained on region specific data
 - More research needed

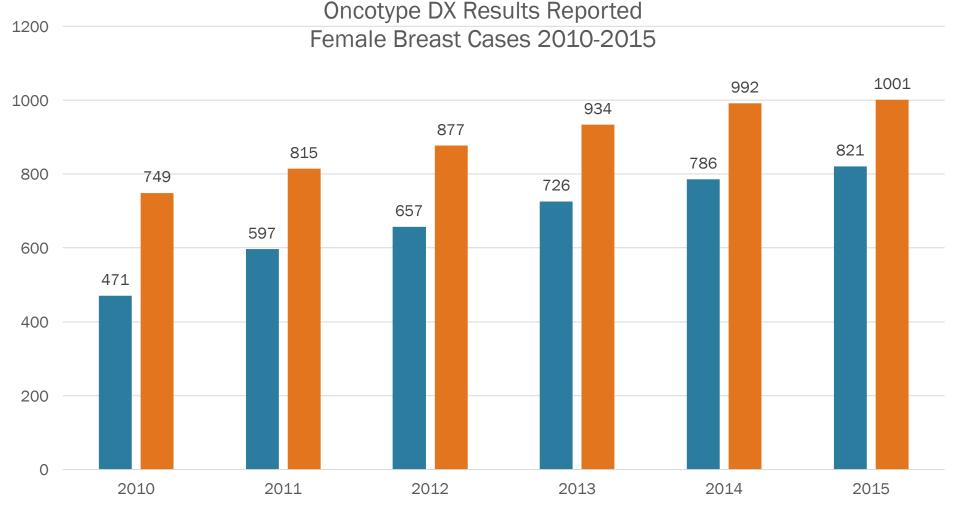


Capturing Molecular Biomarkers at Scale Oncotype DX Linkages

NGS Multi-gene Panel Reporting



Results of Oncotype DX Linkage 32% Increase in Completeness



CPDMS LINKAGE

Capturing Next Generation Sequencing (NGS) Multi-Gene Panel Biomarkers

- Clinical use of multi-gene panel sequencing of tumors is increasing rapidly
 - Molecular Tumor Boards
- Common service providers
 - Foundation Medicine
 - Caris Life Sciences
 - Guardant Health
 - OncoDNA
 - Tempus
 - Oncology Research Information Exchange Network (ORIEN) [Research]
 - Academic Clinical Labs
- Reports include mutations (both significant and of unknown significance)
 - Several providers are also willing to share raw data files (BAM)



Foundation Medicine

FoundationOne CDx

- Next generation sequencing based in vitro diagnostic device for detection of substitutions, insertion and deletion alternations (indels), and copy number alterations (CNAs) in 324 genes
- Select gene rearrangements
- Genomic signatures
 - Microsatellite instability (MSi)
 - Tumor mutation burden (TMB)
- Uses DNA isolation from formalin-fixed paraffin embedded (FFPE) tumor tissue specimens
- FDA approved on November 30, 2017
- CMS coverage simultaneously proposed
 - Medicare beneficiaries with recurrent, metastatic or advanced state IV cancer, not previously NGS tested



FoundationOne CDx

Table 1: Companion diagnostic indications

| INDICATIONS | DIOMARKER | FDA-APPROVED THERAPY* | | |
|----------------------------|---|--|--|--|
| | EGFR exon 19 deletions and EGFR exon 21 L858R alterations | Gilotrif® (afatinib), Iressa® (gefitinib), or Tarceva® (erlotinib) | | |
| Non-Small Cell Lung Cancer | EGFR exon 20 T790M alterations | agrisso® (osimertinib) | | |
| (NSCLC) | ALK rearrangements | Alecensa®(alectinib), Xalkori® (crizotinib), or Zykadia® (ceritinib) | | |
| | BRAF V600E | Tafinlar® (dabrafenib) in combination with Mekinist® (trametinib) | | |
| | BRAF V600E | Tafinlar® (dabrafenib) or Zelboraf® (vemurafenib) | | |
| Melanoma | BRAF V600E or V600K | Mekinist® (trametinib) or Cotellic®(cobimetinib), in combination with Zelboraf®(vemurafenib) | | |
| Breast Cancer | ERBB2 (HER2) amplification | Herceptin® (trastuzumab), Kadcyla® (ado-trastuzumab-emtansine), or Perjeta® (pertuzumab) | | |
| | KRAS wild-type (absence of mutations in codons 12 and 13) | Erbitux® (cetuximab) | | |
| Colorectal Cancer | <i>KRAS</i> wild-type (absence of mutations in exons 2, 3 and 4) and <i>NRAS</i> wild-type (absence of mutations in exons 2, 3 and 4) | Vectibix® (panitumumab) | | |
| Ovarian Cancer | BRCA1/2 alterations | Rubraca® (rucaparib) | | |

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Current Gene List²

Genes with full coding exonic regons included in FoundationOne CDx for the detection of substitutions, insertion-deletions (indels), and copy-number alterations (CNAs).

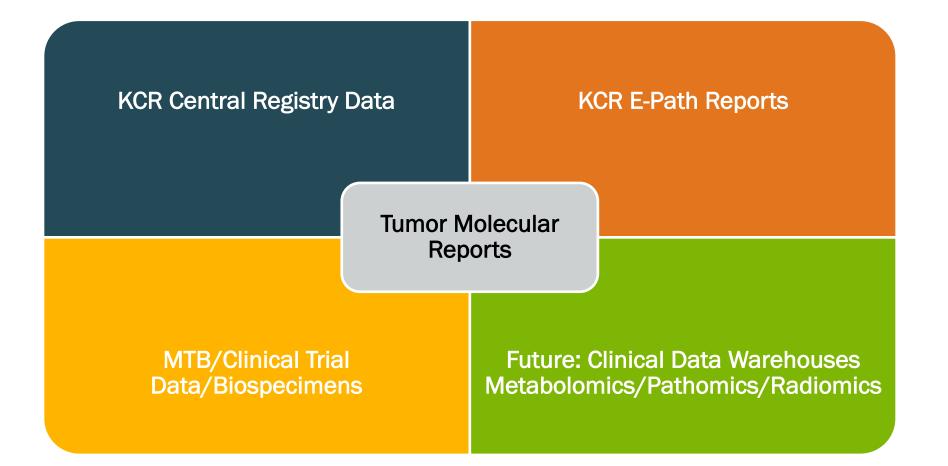
| ABL1 | ACVR1B | AKT1 | AKT2 | AKT3 | ALK | ALOX12B | AMER1 (FAM123B) | APC |
|--------|-----------------|--------|---------------|--------|---------|---------|-----------------|--------|
| AR | ARAF | ARFRP1 | ARID1A | ASXL1 | ATM | ATR | ATRX | AURKA |
| AURKB | AXIN1 | AXL | BAP1 | BARD1 | BCL2 | BCL2L1 | BCL2L2 | BCL6 |
| BCOR | BCORL1 | BRAF | BRCA1 | BRCA2 | BRD4 | BRIP1 | BTG1 | BTG2 |
| BTK | C11orf30 (EMSY) | CALR | CARD11 | CASP8 | CBFB | CBL | CCND1 | CCND2 |
| CCND3 | CCNE1 | CD22 | CD274 (PD-L1) | CD70 | CD79A | CD79B | CDC73 | CDH1 |
| CDK12 | CDK4 | CDK6 | CDK8 | CDKN1A | CDKN1B | CDKN2A | CDKN2B | CDKN2C |
| CEBPA | CHEK1 | CHEK2 | C/C | CREBBP | CRKL | CSF1R | CSF3R | CTCF |
| CTNNA1 | CTNNB1 | CUL3 | CUL4A | CXCR4 | CYP17A1 | DAXX | DDR1 | DDR2 |
| DIS3 | DNMT3A | DOT1L | EED | EGFR | EP300 | EPHA3 | EPHB1 | EPHB4 |
| ERBB2 | ERBB3 | ERBB4 | ERCC4 | ERG | ERRFI1 | ESR1 | EZH2 | FAM46C |

Poll: Who is interested in reviewing molecular reports and coding the mutations manually?

| | | _ | | | | | - | |
|-------------|--------------|---------|---------|---------|--------------|-----------------|---------------|--------|
| JUN | KDM5A | KDM5C | KDM6A | KDR | KEAP1 | KEL | KIT | KLHL6 |
| KMT2A (MLL) | KMT2D (MLL2) | KRAS | LTK | LYN | MAF | MAP2K1 (MEK1) | MAP2K2 (MEK2) | MAP2K4 |
| MAP3K1 | MAP3K13 | MAPK1 | MCL1 | MDM2 | MDM4 | MED12 | MEF2B | MEN1 |
| MERTK | MET | MITF | MKNK1 | MLH1 | MPL | MRE11A | MSH2 | MSH3 |
| MSH6 | MST1R | MTAP | MTOR | MUTYH | МҮС | MYCL (MYCL1) | MYCN | MYD88 |
| NBN | NF1 | NF2 | NFE2L2 | NFKBIA | NKX2-1 | NOTCH1 | NOTCH2 | NOTCH3 |
| NPM1 | NRAS | NT5C2 | NTRK1 | NTRK2 | NTRK3 | P2RY8 | PALB2 | PARK2 |
| PARP1 | PARP2 | PARP3 | PAX5 | PBRM1 | PDCD1 (PD-1) | PDCD1LG2 (PD-L2 | 2) | PDGFRA |
| PDGFRB | PDK1 | PIK3C2B | PIK3C2G | PIK3CA | PIK3CB | PIK3R1 | PIM1 | PMS2 |
| POLD1 | POLE | PPARG | PPP2R1A | PPP2R2A | PRDM1 | PRKAR1A | PRKCI | PTCH1 |
| PTEN | PTPN11 | PTPRO | QKI | RAC1 | RAD21 | RAD51 | RAD51B | RAD51C |
| RAD51D | RAD52 | RAD54L | RAF1 | RARA | RB1 | RBM10 | REL | RET |
| RICTOR | RNF43 | ROS1 | RPTOR | SDHA | SDHB | SDHC | SDHD | SETD2 |
| SF3B1 | SGK1 | SMAD2 | SMAD4 | SMARCA4 | SMARCB1 | SMO | SNCAIP | SOCS1 |
| SOX2 | SOX9 | SPEN | SPOP | SRC | STAG2 | STAT3 | STK11 | SUFU |
| SYK | TBX3 | TEK | TET2 | TGFBR2 | TIPARP | TNFAIP3 | TNFRSF14 | TP53 |
| TSC1 | TSC2 | TYRO3 | U2AF1 | VEGFA | VHL | WHSC1 (MMSET) | WHSC1L1 | WT1 |
| XPO1 | XRCC2 | ZNF217 | ZNF703 | | | | | |
| | | | | | | | | |

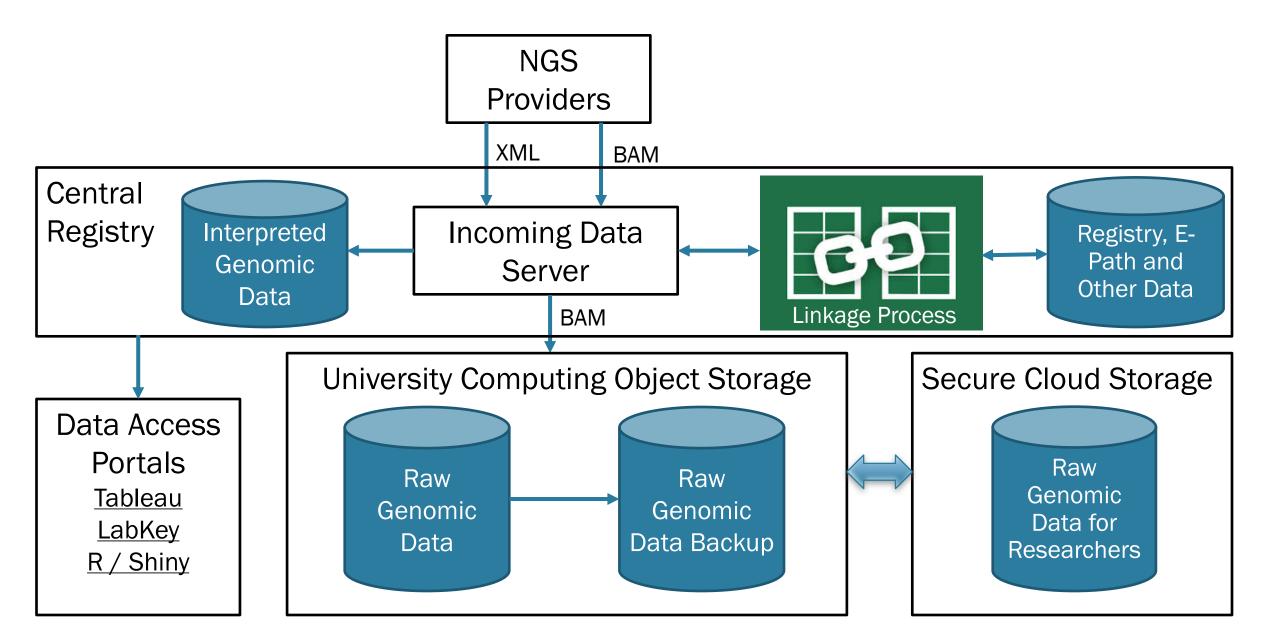


Integration of Molecular, Registry, Pathology, MTB, Clinical Trial, Biorepository, Other Data



Integrated data to support Molecular Tumor Boards, Population Health and Research in Precision Medicine

Genomic Data Flow into the Central Registry



Additional Data Needed from Hospital Registrars

Contextual information about specimen sent for testing

- Primary site?
- Recurrence?
- Metastatic lesion?
- Timing/State of Disease
 - At time of diagnosis?
 - Before or after chemotherapy?
 - Following recurrence?
 - How long after remission?
- Additional treatment details
 - Specific targeted therapy
 - Selected from dropdown (searchable)
- Treatment response to targeted therapy



Population Health and Research

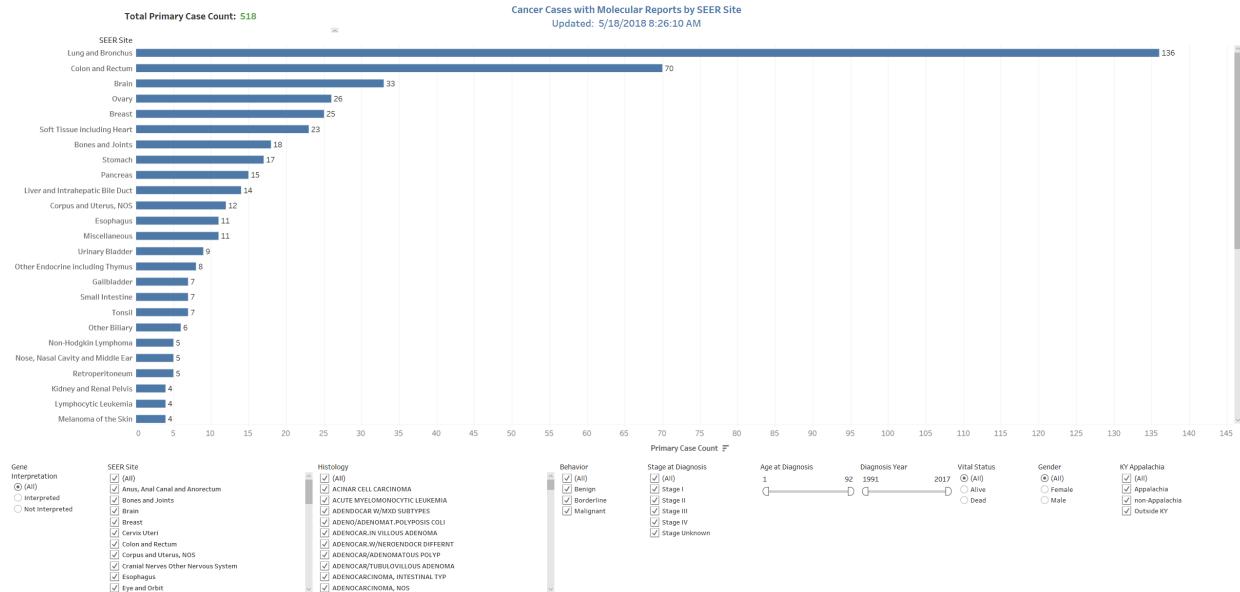
Using population-based molecular report data



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By Cancer Site Group By Gene Mutation By Cancer Site Group and Gen... Reference



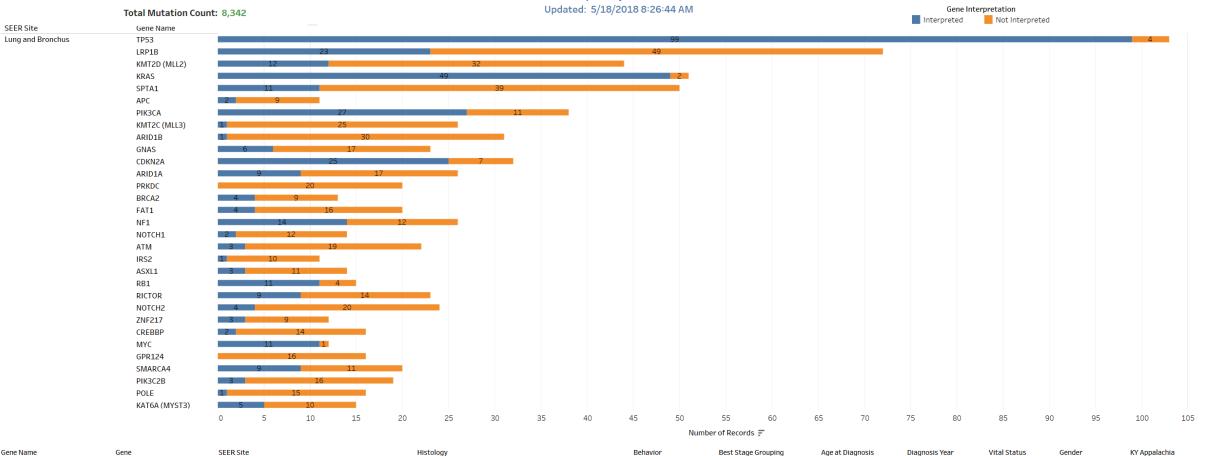


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By Cancer Site Group By Gene Mutation By Cancer Site Group and Gen... Reference



Cancer Cases with Molecular Reports by SEER Site and Gene Mutation Counts



| Gene Name | Gene | SEER Site | Histology | Behavior | Best Stage Grouping | Age at Diagnosis | Diagnosis Y |
|-------------------|------------------------------------|---------------------------------------|-----------------------------|-------------------|---------------------|------------------|-------------|
| ✓ (AII) | Interpretation | ✓ (AII) | ^ (AII) | ^ | ✓ (AII) | 0 | 92 1991 |
| ✓ ABL1 | (IIA) (| Anus, Anal Canal and Anorectum | ✓ ACINAR CELL CARCINOMA | ✓ Benign | ✓ Stage I | 0 | D |
| ✓ ABL2 | Interpreted | ✓ Bones and Joints | ACUTE MYELOMONOCYTIC LEUK | EMIA 🗸 Borderline | ✓ Stage II | 0 | |
| ✓ ACTB | Not Interpreted | ✓ Brain | ✓ ADENDOCAR W/MXD SUBTYPES | ✓ Malignant | ✓ Stage III | | |
| ✓ ACVR1B | | ✓ Breast | ✓ ADENO/ADENOMAT.POLYPOSIS | COLI | ✓ Stage IV | | |
| ✓ AKT1 | | ✓ Cervix Uteri | ADENOCAR.IN VILLOUS ADENON | A | ✓ Stage Unknown | | |
| ✓ AKT2 | | ✓ Colon and Rectum | ADENOCAR.W/NEROENDOCR DI | FFERNT | | | |
| 🗸 АКТЗ | | ✓ Corpus and Uterus, NOS | ADENOCAR/ADENOMATOUS POL | YP | | | |
| ✓ ALK | | ✓ Cranial Nerves Other Nervous System | ADENOCAR/TUBULOVILLOUS AD | ENOMA | | | |
| ✓ AMER1 (FAM123B) | | ✓ Esophagus | ✓ ADENOCARCINOMA, INTESTINA | LTYP | | | |
| ✓ APC | ~ | ✓ Eye and Orbit | ✓ ADENOCARCINOMA, NOS | ~ | | | |

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2017 (AII)

O Dead

Ð Alive (AII)

Female

O Male

✓ (All)

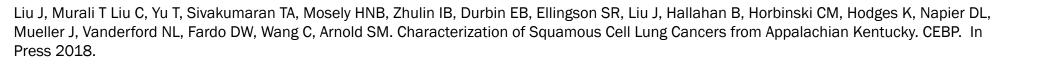
✓ Appalachia

✓ Outside KY

🗸 non-Appalachia

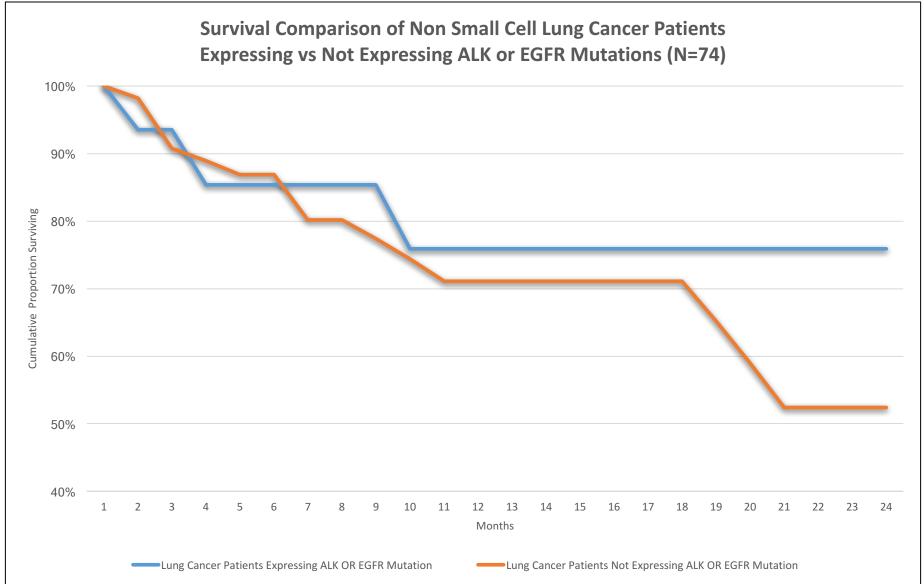
Identifying Molecular Disparities in the Population

- Recent study examined molecular profiles of 51 non-small cell lung cancer in Appalachian Kentucky compared to the Cancer Genome Atlas (TCGA)
- Certain tumor mutations were significantly higher among Appalachian Kentucky patients compared to the U.S.
 - PCMTD1
 - IDH1
- Does this represent a health disparity in Kentucky's underserved population?





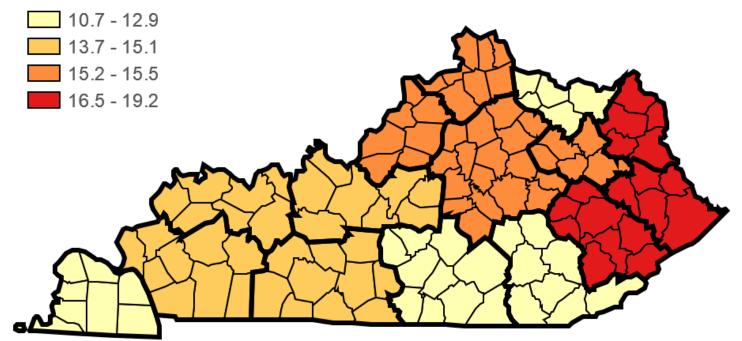
Population Measures: How do Gene Mutations Impact Survival?



Mapping Biomarker Data for Cancer Prevention and Control

Age-Adjusted Invasive Cancer Incidence Rates in Kentucky Triple Negative (HR-/HER2-) - Breast, Female, 2011 - 2015 By Area Development District Age-Adjusted to the 2000 U.S. Standard Million Population

Kentucky Rate: 14.8 / per 100,000



All rates per 100,000. Data accessed May 16, 2018. Based on data released Nov 2017. © 2018 Kentucky Cancer Registry.



Conclusions: Precision Cancer Surveillance is a Critical Role for Cancer Registries

- Capture and integration of Next Generation Sequencing (NGS) molecular test results is a major goal of the Kentucky Cancer Registry
- Informatics efforts are developing methods and tools to enhance e-Path reporting and other infrastructures needed to capture data for all patients who are tested
 - Cannot wait for site specific factors to emerge
 - Cancer registrar manual entry of 100s of molecular markers impossible
- Electronic transmissions of standardized molecular test results from NGS service providers is feasible and practical
 - Molecular test report data is no more challenging than electronic pathology reporting
 - Raw data file storage, however, requires more significant technical expertise and storage facilities
- Central cancer registries can be enhanced with **population-based** molecular test data within 2-4 years
- Advances will positively impact clinical decision making and evidence-based cancer prevention and control



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Browse cancer incidence and mortality data on your iPad, iPhone, or iPod Touch



