ITCR Annual Meeting

Informatics Tools for High-throughput Analysis of Cancer Mutations

Karchin Lab
Departments of Biomedical Engineering and Oncology
Institute of Computational Medicine
Johns Hopkins University

Link to video demo:

https://www.youtube.com/watch?v=xovmIy11B cs

Goals for U01 funded in 2012

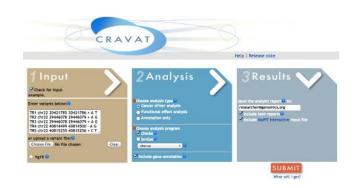
- 1. Integrate tools we developed to prioritize cancer missense mutations
 - a. Create single user-friendly application that provides analysis of large-scale data
 - b. Make it accessible to research scientists who are not bioinformatics experts

Goals for U01 funded in 2012

- 2. Broaden the tools scientifically
 - a. Handle small mutations in cancer exome beyond missense mutations
 - b. Identify important genes and pathways
 - c. Enable cohort-level analysis



Integrate tools to prioritize cancer missense mutations









Integrate tools to prioritize cancer missense mutations

Machine-learning of missense mutation impact

Cancer-Specific High-Throughput
Annotation of Somatic Mutations:
Computational Prediction of Driver Missense
Mutations

Hannah Carter¹, Sining Chen^{2,3}, Leyla Isik¹, Svitlana Tyekucheva³, Victor E. Velculescu⁴, Kenneth W. Kinzler⁴, Bert Vogelstein⁴, and Rachel Karchin¹ Identifying Mendelian disease genes with the Variant Effect Scoring Tool

Hannah Carter, Christopher Douville, Peter D Stenson, David N Cooper and

Missense mutation analysis and protein structure

MuPIT interactive: webserver for mapping variant positions to annotated, interactive 3D structures

Noushin Niknafs, Dewey Kim, RyangGuk Kim, Mark Diekhans, Michael Ryan, Peter D. Stenson, David N. Cooper, Bachel Karchin

Clustering patterns
Proximity to ligands
and interfaces

RESEARCH ARTICLE

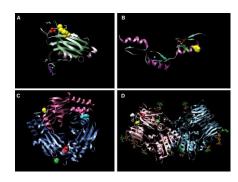
Core Signaling Pathways in Human Pancreatic Cancers Revealed by Global Genomic Analyses

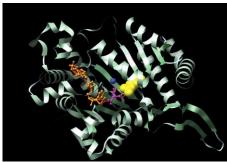
Slat Jones^{1, *}Xlaosong Zhang^{1,*} D. Williams Parsons^{1,2,*}, Jimmy Cheng-Ho Lin^{1,*}, Rebecca J. Leary^{1,*}, Philipp Angenendt^{1,*}, Parminder Mankoo¹, Hannah Carter¹, Hirohiko Kamiyama¹, Antonio Jimeno¹, Seung-Mo Hong¹, Baojin Fu¹, Ming-Tseh Lin¹, Eric S. Calhoun¹, Mihoko Kamiyama¹, Kimberly Walter¹, Tatiana Nikolskaya², Yuri Nikolsky⁶, James Hartigan¹, Douglas R. Smith¹, Manuel Hidalgo¹, Steven Leach^{1,2}, Alison P. Klein^{1,5}, Elizabeth M. Jaffee^{1,6}, Michael Goggins^{1,6}, Anirban Maltra^{1,6}, Christine Iacobusio-Donahue^{1,6}, James R. Eshleman^{1,6}, Scott E. Kern^{1,6}, Rajph H. Hruban^{1,6}, Rachel Karchin¹, Nickolas Papadopoulos¹, Giovanni Parmigiani^{1,7}, Bert Vogelstein^{1,6}, Victor E. Velculescu^{1,7}, Kenneth W. Kinzle^{1,7}

DECEADON ADTICLE

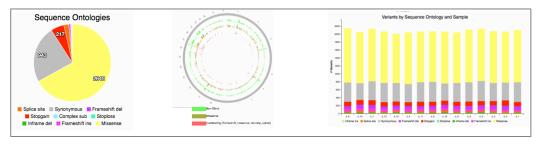
An Integrated Genomic Analysis of Human Glioblastoma Multiforme

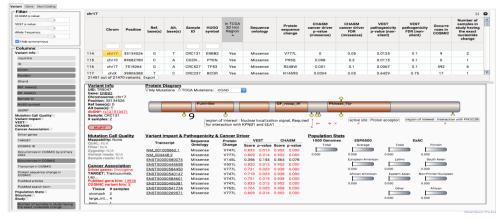
D. Williams Parsons^{1,2,*}, Sián Jones^{1,*}, Xlaosong Zhang^{1,*}, Jimmy Cheng-Ho Lin^{1,*}, Rebecca J. Leary^{1,*}, Philipp Angenendt^{1,*}, Parminder Mankoo³, Hannah Carter¹, Heil Slu⁴, Gary L. Gallia⁴, Alessandro Olivi⁴, Goger McLendon⁴, B. Ahmed Rasheed⁵, Stephen Keir², Tatiana Nikolskaya⁶, Yuri Nikolsky⁷, Dana A. Busam⁸, Hanna Tekkeb⁵, Luis A. Diaz Jr.¹, James Hartigan⁸, Doug R. Smith³, Robert L. Strausberg⁸, Suely Kazue Maghashi Mariel⁹, Sueli Mieko Obs Shinjo¹⁰, Hal Yan⁵, Gregory J. Riggins⁴, Darell D. Bigner⁵, Rachel Karchin³, Nick Papadopoulos¹, Glovanni Parmiglani¹, Bert Vogelstein^{1,1}, Victor E. Velculescu^{1,1}, Kenneth W. Kinzler^{1,4}

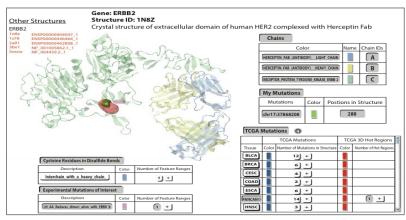




Integrated user-friendly application with interactive results explorer







Broaden scientific scope

- Annotation/scoring of all small non-silent mutation types
 - Machine learning classifiers for specific mutation consequence types
 - Integrated P-values support a unified prioritization

| Chrom osome | Position | Strand | Reference base(s) | Alternate base(s) | Sample ID | HUGO symbol | Sequence ontology | Sequence ontology protein sequence change | VEST pathogenicity p-value (non- silent) | VEST pathogenicity FDR (non- silent) |
|----------------|-----------|--------|----------------------|----------------------|-----------|----------------|----------------------|---|---|---|
| chr12 | 2795367 | + | С | T | SS6004357 | CACNA1 | SG | R1989* | 0.0007 | 0.2 |
| chr4 | 3156068 | + | C | T | SS6004357 | HTT | SG | R1183* | 0.0015 | 0.2 |
| chr7 | 151921149 | + | G | Α | SS6004357 | MLL3 | SG | R1092* | 0.0020 | 0.2 |
| chr12 | 83251120 | + | С | G | SS6004356 | TMTC2 | MS | R139G | 0.0057 | 0.2 |
| chr2 | 129026227 | + | G | T | SS6004357 | HS6ST1 | MS | R249S | 0.0058 | 0.2 |
| chr2 | 129026227 | + | G | T | SS6004356 | HS6ST1 | MS | R249S | 0.0058 | 0.2 |
| chr17 | 19284136 | + | G | С | SS6004356 | MAPK7 | MS | R205P | 0.0068 | 0.2 |
| chr5 | 169135251 | + | C | T | SS6004357 | DOCK2 | MS | R488C | 0.0073 | 0.2 |
| chr11 | 108192148 | + | G | Α | SS6004357 | ATM | SS | _2191_ | 0.0075 | 0.2 |
| chr4 | 134072602 | + | G | С | SS6004357 | PCDH10 | MS | R436P | 0.0078 | 0.2 |
| chr11 | 116629090 | + | T | С | SS6004357 | BUD13 | MS | D465G | 0.0080 | 0.2 |
| chr11 | 116629090 | + | T | С | SS6004356 | BUD13 | MS | D465G | 0.0080 | 0.2 |
| chr5 | 140052204 | + | С | Α | SS6004357 | DND1 | MS | G144C | 0.0083 | 0.2 |
| chr17 | 14110451 | + | Α | С | SS6004356 | COX10 | MS | H418P | 0.0083 | 0.2 |
| chr5 | 7706895 | + | G | Α | SS6004357 | ADCY2 | MS | R383H | 0.0088 | 0.2 |
| chr1 | 233497916 | + | С | T | SS6004357 | KIAA1804 | MS | R477W | 0.0089 | 0.2 |
| chr1 | 233497916 | + | С | T | SS6004356 | KIAA1804 | MS | R477W | 0.0089 | 0.2 |
| | | | | | | | | | | |

Assessing the Pathogenicity of Insertion and Deletion Variants with the Variant Effect Scoring Tool (VEST-Indel)

Christopher Douville, David L. Masica, Peter D. Stenson, David N. Cooper, Derek M. Gygax, Rick Kim, Michael Ryan, Rachel Karchin ™



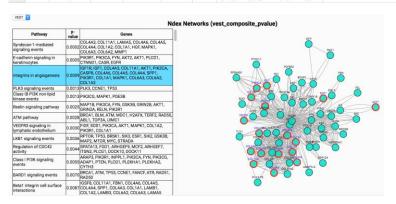


Broaden scientific scope

Identify important genes and pathways for cohort-level analysis

| | HUGO Number of MuPIT of Link | | Most severe sequence ontology | VEST pathogenicity composite p-value (non-silent) • | VEST pathogenicity FDR (non- silent) | Driver genes | Occurrences in COSMIC by primary sites | Number of samples in study having the gene mutated | |
|----|------------------------------|----|-------------------------------------|---|---|-----------------|--|---|----|
| | | | | | | | | | |
| 1 | TP53 | 28 | Yes | Frameshft del | 0 | 0.05 | TSG | large_intestine(3317);vulva(122);pleura(21);peritoneum | 28 |
| 2 | EGFR | 6 | Yes | Missense | 0 | 0.05 | Oncogene | large_intestine(270);pleura(5);peritoneum(11);endome | 6 |
| 3 | HIST1H3B | 3 | Yes | Missense | 0 | 0.05 | Oncogene | upper_aerodigestive_tract(1);cervix(2);large_intestine(| 3 |
| 4 | CACNA1E | 4 | Yes | Missense | 0 | 0.05 | | large_intestine(187);pleura(1);peritoneum(1);endometr | 4 |
| 5 | PIK3CA | 31 | Yes | Missense | 0 | 0.05 | Oncogene | large_intestine(1792);vulva(7);pleura(1);peritoneum(2) | 31 |
| 6 | DNAH2 | 4 | Yes | Missense | 0.0001 | 0.05 | | large_intestine(228);peritoneum(1);endometrium(103) | 4 |
| 7 | TRIP12 | 3 | Yes | Missense | 0.0001 | 0.05 | | upper_aerodigestive_tract(4);cervix(6);large_intestine(| 3 |
| 8 | MAP1B | 3 | | Missense | 0.0002 | 0.05 | | large_intestine(149);peritoneum(1);endometrium(57);i | 3 |
| 9 | GNE | 3 | Yes | Missense | 0.0002 | 0.05 | | upper_aerodigestive_tract(2);cervix(3);large_intestine(| 3 |
| 10 | RNASE4 | 2 | Yes | Missense | 0.0002 | 0.05 | | large_intestine(5);stomach(5);central_nervous_system | 2 |
| 11 | MLL | 3 | | Stopgain | 0.0002 | 0.05 | | | 3 |
| 12 | INSR | 3 | Yes | Missense | 0.0003 | 0.1 | | large_intestine(72);endometrium(27);lung(33);skin(53) | 3 |
| 13 | EPC1 | 2 | Yes | Missense | 0.0004 | 0.1 | | upper_aerodigestive_tract(1);cervix(3);large_intestine(| 2 |
| 14 | TRPM3 | 3 | Yes | Missense | 0.0004 | 0.1 | | large_intestine(119);endometrium(48);lung(55);skin(7 | 3 |
| 15 | ITPR2 | 3 | Yes | Splice site | 0.0004 | 0.1 | | large_intestine(135);endometrium(46);lung(63);skin(5 | 3 |
| 16 | TUBD1 | 3 | Yes | Missense | 0.0004 | 0.1 | | thyroid(1);cervix(4);large_intestine(23);stomach(7);cen | 3 |

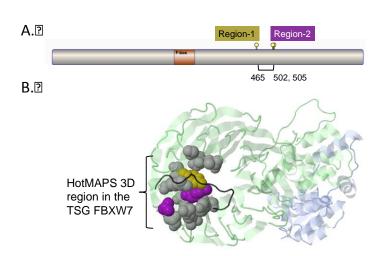
Multiple criteria to sort genes by importance in a cohort

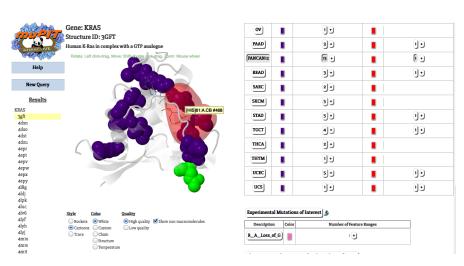


Find pathways enriched for important genes

Broaden scientific scope

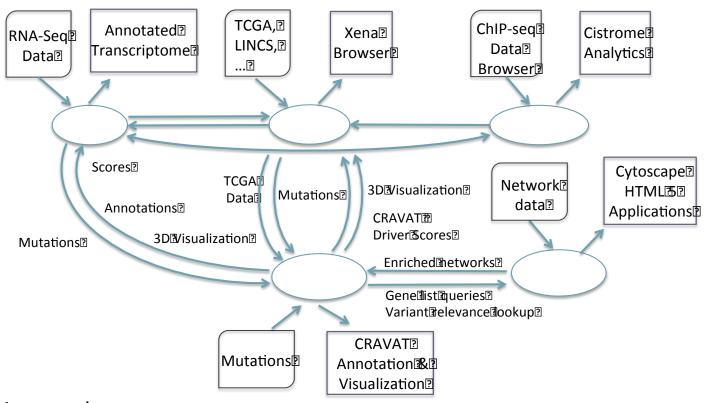
- HotMAPS algorithm and MuPIT viewing of 3D hotspot mutation regions in cancer cohorts
 - Positional clustering of somatic mutations is a signal of positive selection
 - Clustering in 3D detects hotspots that are missed in 1D





Cancer Res. 2016 Apr 28. pii: canres.3190.2015. [Epub ahead of print]

ITCR project collaborations



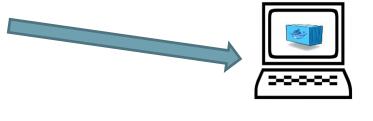
Administrative supplements

Broaden user base

https://hub.docker.com/r/karchinlab/cravatmupit/

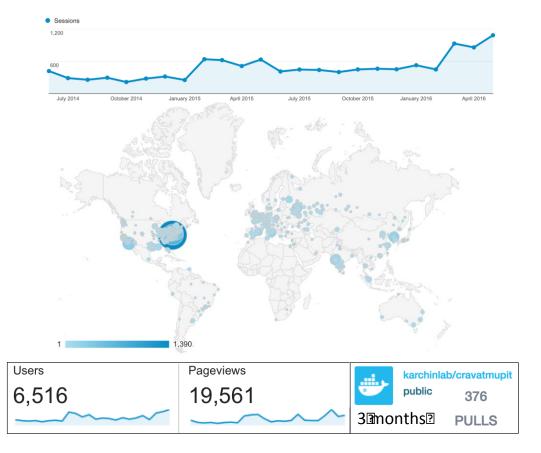
- Galaxy tools
- Docker containers
 - Run locally
 - Run in cloud
 - Handle protected data







Usage



U24 Aims

- New features to make the tools more broadly useful
 - Add new mutation, gene and pathway scoring methods and annotations
 - Expand to non-coding mutations
 - Customized modular analysis and installation
- Maximize interoperability and interactions with other tools
 - NCI cloud pilot projects
 - Additional Galaxy tools
- Keep system up-to-date, user support and outreach
 - Rebuild underlying databases for hg38
 - Increase presence on genomics-focused social media