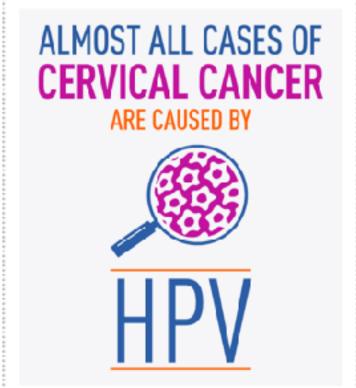
Reproducibility issues while using publicly available metagenomic datasets

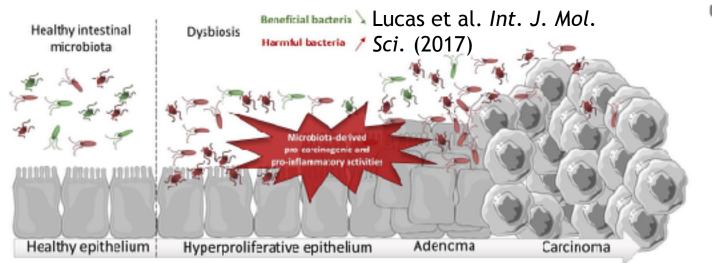
Scott Eckert
06/07/2019
Liu Group
Data Reproducibility Bootcamp

Microbiome

- Human microbiome
 - Totality microbial DNA in human bod
- 10:1 ratio of bacterial:human cell
- 1.3:1 ratio
 - 0.2kg



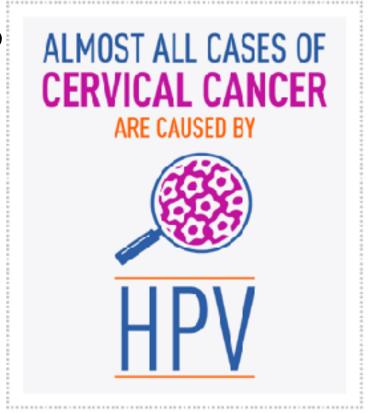


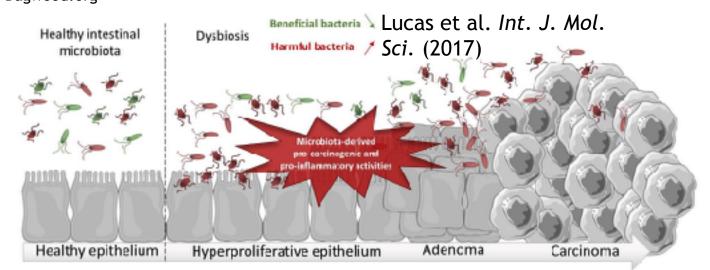


cancer.gov/hpv

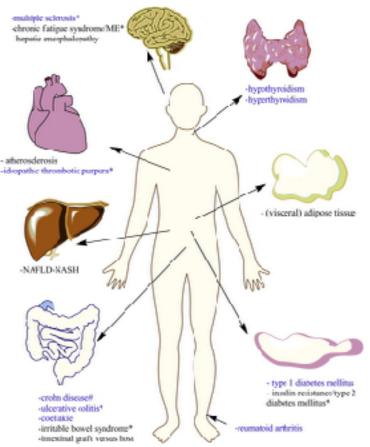


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cancer.gov/hpv

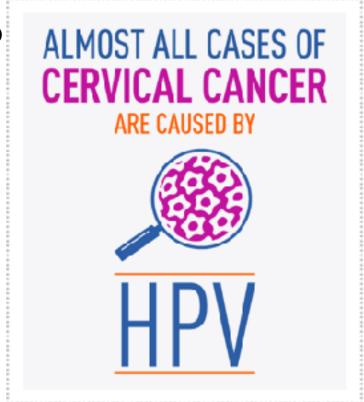


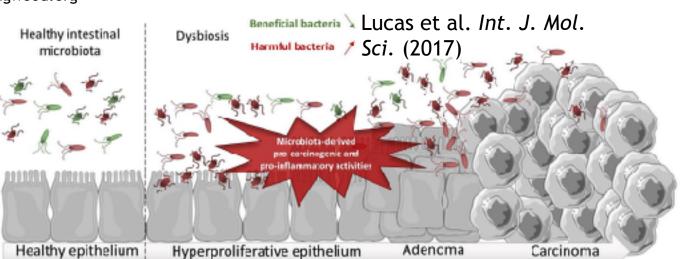
A. Vrieze et al. Best
Pract Res Clin
Gastroenterol (2013)

Continue of feet feet feet transchantation



Howard F. Schwartz, Colorado State University, Bugwood.org





cancer.gov/hpv

Challenge with microbiome studies

- Critiques:
 - Microbiome is variable, changes with a cup of coffee
 - Not enough phenotypic information



Enriching human microbiome datasets

Critiques:

- Microbiome is variable, changes with a cup of coffee
- Not enough phenotypic information



• Ideas:

- Call host genotype from off-target WGS reads
- Generate additional related phenotypes/covariates

Published in final edited form as: Nat Genet.; 44(6): 631–635. doi:10.1038/ng.2283.

Extremely low-coverage sequencing and imputation increases power for genome-wide association studies

Bogdan Pasaniuc^{1,2,3,*}, Nadin Rohland^{3,4}, Paul J. McLaren^{3,5}, Kiran Garimella³, Noah Zaitlen^{1,2,3}, Heng Li³, Namrata Gupta³, Benjamin Neale³, Mark Daly³, Pamela Sklar⁶, Patrick F. Sullivan⁷, Sarah Bergen³, Jennifer L. Moran³, Christina M. Hultman⁸, Paul Lichtenstein⁸, Patrik Magnusson⁸, Shaun M. Purcell⁹, David W. Haas¹⁰, Liming Liang^{1,2,3}, Shamil Sunyaev^{3,5}, Nick Patterson³, Paul I.W. de Bakker^{3,5,11}, David Reich^{3,4,*,±}, and Alkes L. Price^{1,2,3,*,±}

- Random downsampling of 1000 Genomes Project
- Imputation from 0.24x off-target reads from WES
 - Comparable power GWAS from genotype array for common variants

Design



- Call genotypes for individuals in HMP, available studies
- Assess read depth, distribution and G/C content
 - Compare to genotype array data (available for ~300 individuals)
 - Identify other datasets with sufficient read depth

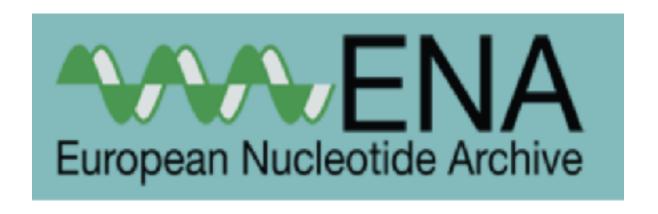


Pasoli et al. Nature Methods (2017)

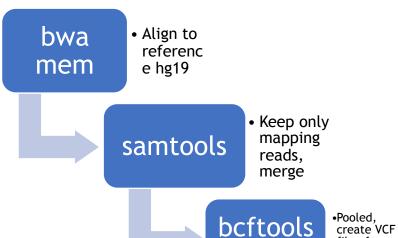
Data acquisition

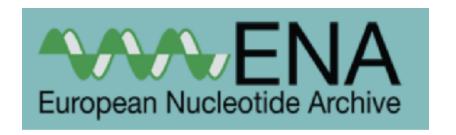
- Sequence Read Archive (SRA) from NCBI
 - SRA-toolkit
 - prefetch and fastq-dump
- European Nucleotide Archive (ENA) from EBI
 - No tool, but standard file paths from 7 or 8 digit





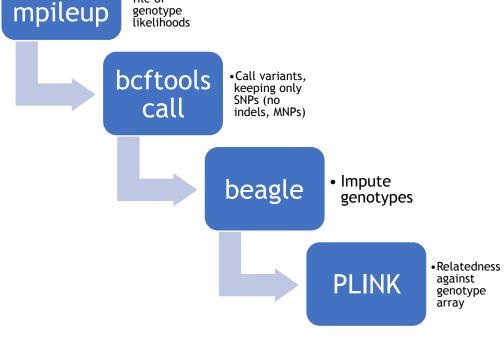
Pipeline





Use publicly available data





file of

Results validation



- HMP data structure
 - Many files per individual
 - Variable- different sites and number of replicates
 - Compare to array data
 - Cross validation

159814214	CREGGADES - CRAGGADES - CRAGGADES - CREGGADES - CREGGA
	SRRB60358; SRRB60359; SRRB63962; SRRB62847; SRRB62848; SRRB62023; SRRB62824; SRRB639860; SRRB63966; SRRB60366; SRRB68367; SRRB61999; SRRB62000; SR
768516768	\$981804164;\$981804782;\$981804520;\$981804551;\$981804607;\$981803550;\$981804426;\$981804164;\$981804782;\$981804320;\$981804551;\$981804607;\$981803550
764325968	\$\text{\$4.500} \text{\$4.500} \
889635352	\$PR\$66821;\$P\$63983;\$P\$663984;\$P\$66898;\$P\$66883;\$P\$66833;\$P\$66833;\$P\$66883;\$P\$66883;\$P\$66983;\$P\$663987;\$P\$663983;\$P\$8639899;\$P\$8639899;\$P\$863989;\$P\$863989;\$P\$863989;\$P\$863989;\$P\$863989;\$P\$8639899;\$P\$8639899;\$P\$8639899;\$P\$8639899;\$P\$8639899;\$P\$8639899;\$P\$8639899;\$P\$8639899;\$P\$8639899;\$P\$8639899;\$P\$8639899;\$P\$8639899;\$P\$8639899;\$P\$8639899;\$P\$86398999;\$P\$8639899;\$P\$863999;\$P\$863999999999999999999999999999999999999
158357646	\$RR\$31987;\$RR\$31997;\$RR\$31998;\$RR\$32491;\$RR\$32494;\$RR\$32496;\$RR\$32502;\$RR\$33632;\$RR\$39765;\$RR\$39766;\$RR\$39826;\$RR\$39826;\$RR\$39667;\$RR\$39966;\$R
763577454	SRR961138; SRR962321; SRR961386; SRR961487; SRR962479; SRR962473; SRR962353; SRR962357; SRR962389; SRR962413; SRR962396; SRR962398; SRR961388; SRR961411; SR
763860675	SRR263496; SRR263497; SRR261468; SRR261479; SRR261333; SRR261335; SRR26684; SRR261370; SRR261391; SRR261326; SRR261368; SRR2614697; SRR261442; SRR2613443; S
765216893	SRR1803874; SRR1804325; SRR18043879; SRR1804290; SRR1804435; SRR1804465; SRR1804458; SRR1804470; SRR1804429; SRR1804694; SRR513169; SRR514225; SRR511923; SR
765155402	\$\text{\$83896}\text{\$987}\text{\$981804966}\text{\$981804966}\text{\$981804917}\text{\$981804917}\text{\$9891803997}\text{\$9871803997}\text{\$9871804990}\text{\$9871804917}\text{\$987180399}\text{\$9871803997}\text{\$9871803997}\text{\$987180399}\text{\$987180399}\text{\$987180399}\text{\$98718039}\$9871
168704339	\$88859440;\$88859441;\$88859442;\$88859443;\$88859444;\$88859445;\$88859446;\$88859447;\$88859496;\$88859497;\$88861993;\$88861994;\$88863912;\$88863920;\$8
993302508	\$\text{\$61662};\$\text{\$631668};\$\text{\$63166};\$\text{\$78183158};\$\text{\$781831265};\$\text{\$781831365};\$\text{\$781831661};\$\text{\$781831940};\$\text{\$781831383};\$\text{\$781831483};\$\text{\$781831365};\$\text{\$781831661}\$
159470302	\$RR532115;\$RR532120;\$RR532137;\$RR532141;\$RR532275;\$RR532281;\$RR532284;\$RR532287;\$RR532722;\$RR532745;\$RR532916;\$RR532922;\$RR532929;\$R
368533340	SRR527884; SRR527916; SRR527952; SRR528882; SRR528834; SRR528887; SRR528156; SRR528212; SRR528239; SRR528337; SRR528367; SRR528418; SRR528516; SRR527884; SR
195044680	SRR1952551; SRR1952554; SRR1952557; SRR1952566; SRR1952567; SRR2241109; SRR2241110; SRR2241111
295137534	SRR532345; SRR532355; SRR532364; SRR532367; SRR532635; SRR532639; SRR532644; SRR532649; SRR532651; SRR533331; SRR533335; SRR533343; SRR533345; SRR533338; SR
868454789	\$\text{981661}\$\$\text{981266}\$\$\text{5\text{1081691}}\$\text{881981}\$\text{981691948}\$\text{5\text{881081864}}\$\text{5\text{1081866}}\$\text{5\text{1081063}}\$\tex
612472597	\$\$\text{\$\
168765829	\$RR\$59566;\$RR\$59581;\$RR\$59358;\$RR\$59359;\$RR\$59842;\$RR\$59843;\$RR\$59498;\$RR\$59356;\$RR\$59357;\$RR\$59518;\$RR\$59518;
159328691	\$RR1564226;\$RR1564226
158418336	SRR2175723; SRR2175769

Quality check of imputed genotype

• Data from Castro-Nallar et al. PeerJ (2015)

Oropharyngeal microbiome of SCZ patients compared to

controls

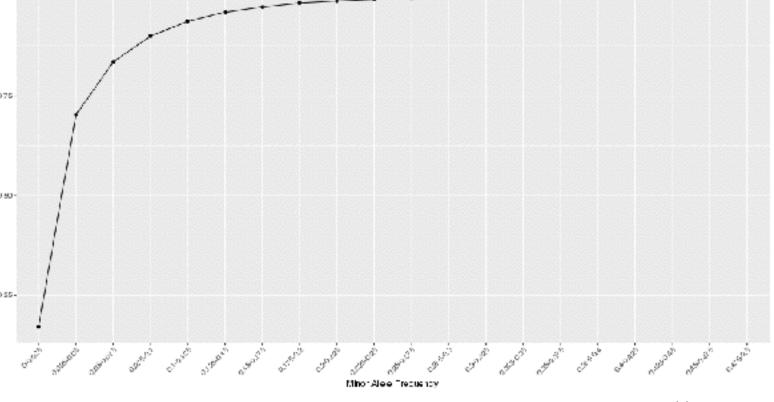
Ti/Tv ratio

2.2:1

One technical replicate

• PLINK to check relatedne

Label mismatch



Make backups of your work

GitHub



