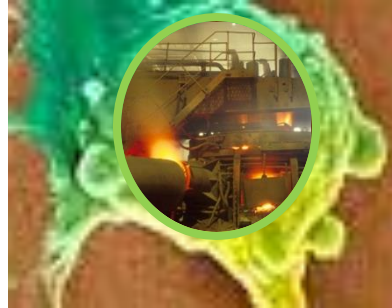


Signatures of mutational processes in human cancer

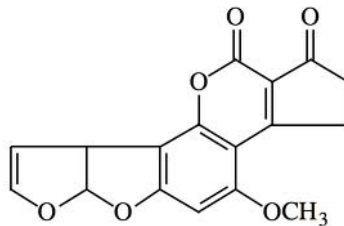
Insights from cancer genome sequencing

- Mutated cancer genes
- Biological processes implicated in cancer development
- Identification of drug targets
- Evolution of subclones
- Evolution of metastases
- Infectious pathogens involved in oncogenesis
- Prediction of outcome and response to therapy
- Circulating DNA for monitoring and early detection
- Mutational processes operative in carcinogenesis

Somatic mutations occur in all cells of the body throughout life



.....**A****T****C****G****G****G****A****T****C****G****G****A****C****C****C****G****A****T****G**.....



TP53 mutations in human cancer

TP53 mutations in human cancer

C>T

C>A

C>G

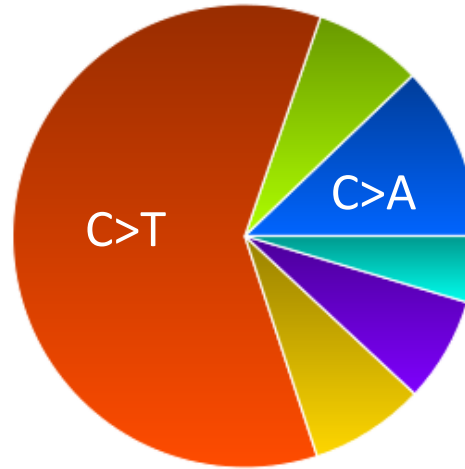
T>A

T>C

T>G

TP53 mutations in human cancer

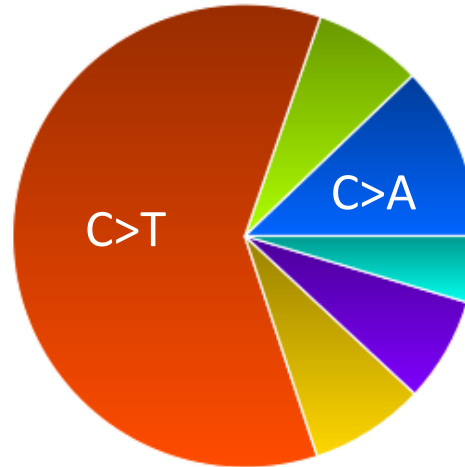
686 skin cancers



Ultraviolet light
causes C>T mutations

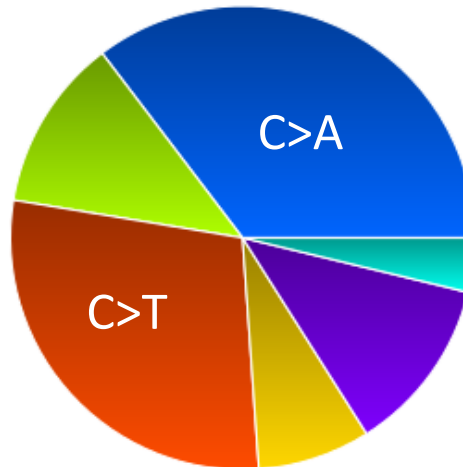
TP53 mutations in human cancer

686 skin cancers



Ultraviolet light
causes C>T mutations

1647 lung cancers



Tobacco carcinogens
cause C>A mutations

From fertilised egg to cancer cell

Chemotherapy
resistant
recurrence

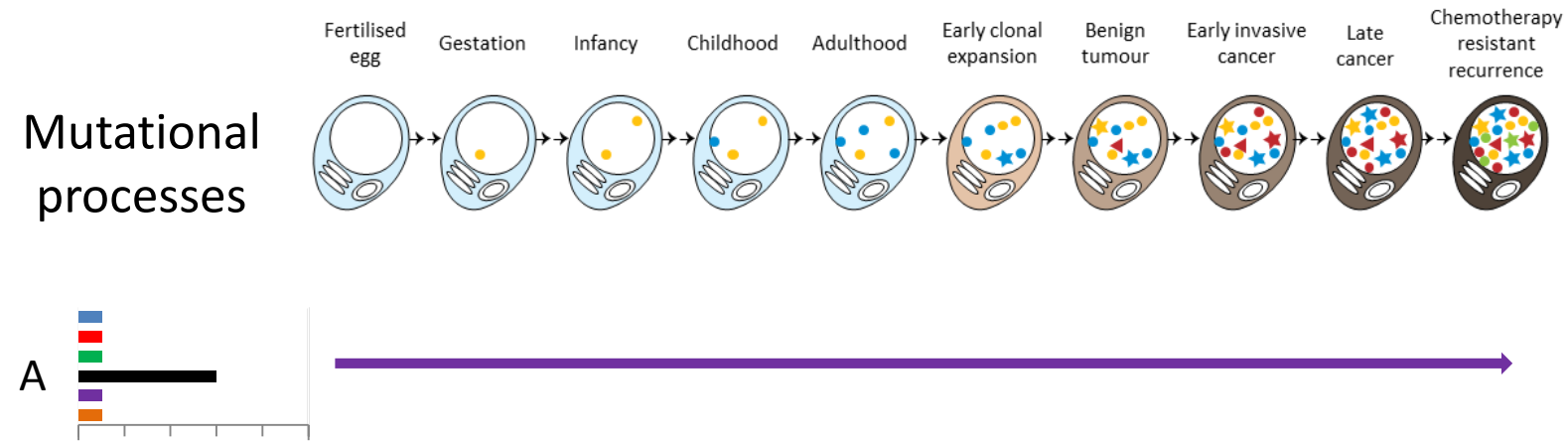


From fertilised egg to cancer cell

Chemotherapy
resistant
recurrence

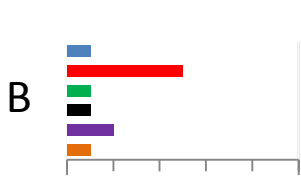
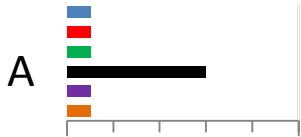
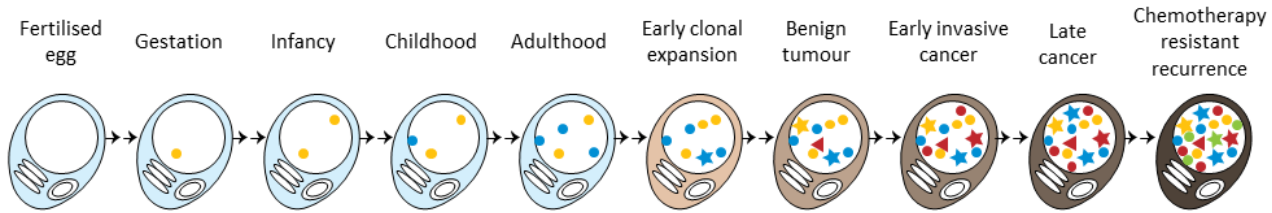


From fertilised egg to cancer cell

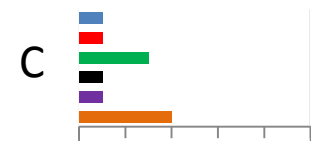
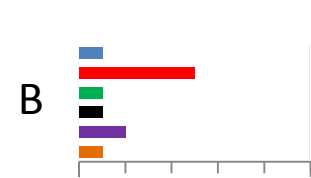
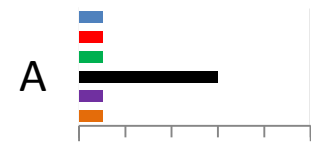
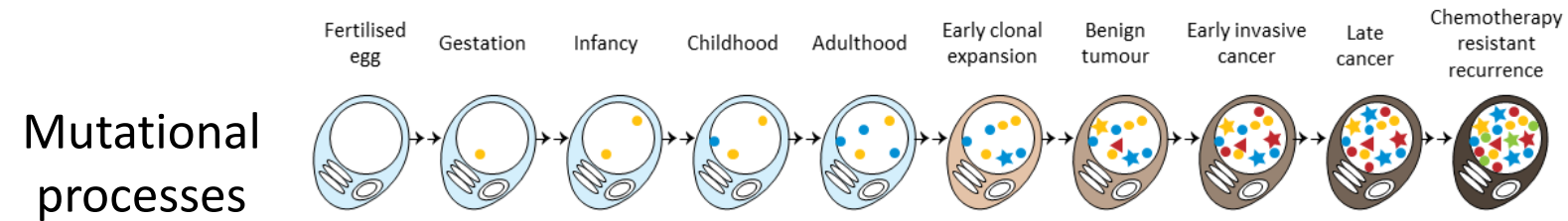


From fertilised egg to cancer cell

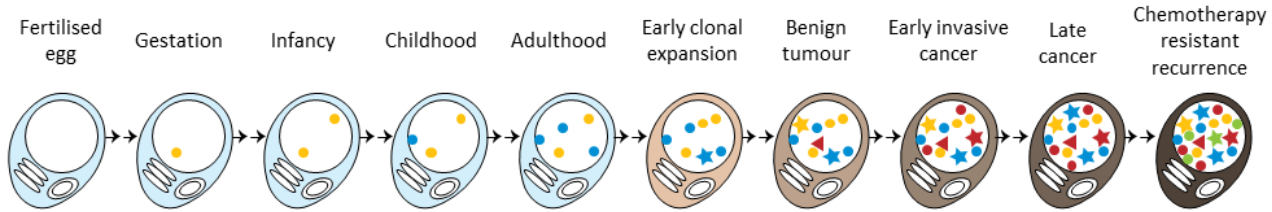
Mutational processes



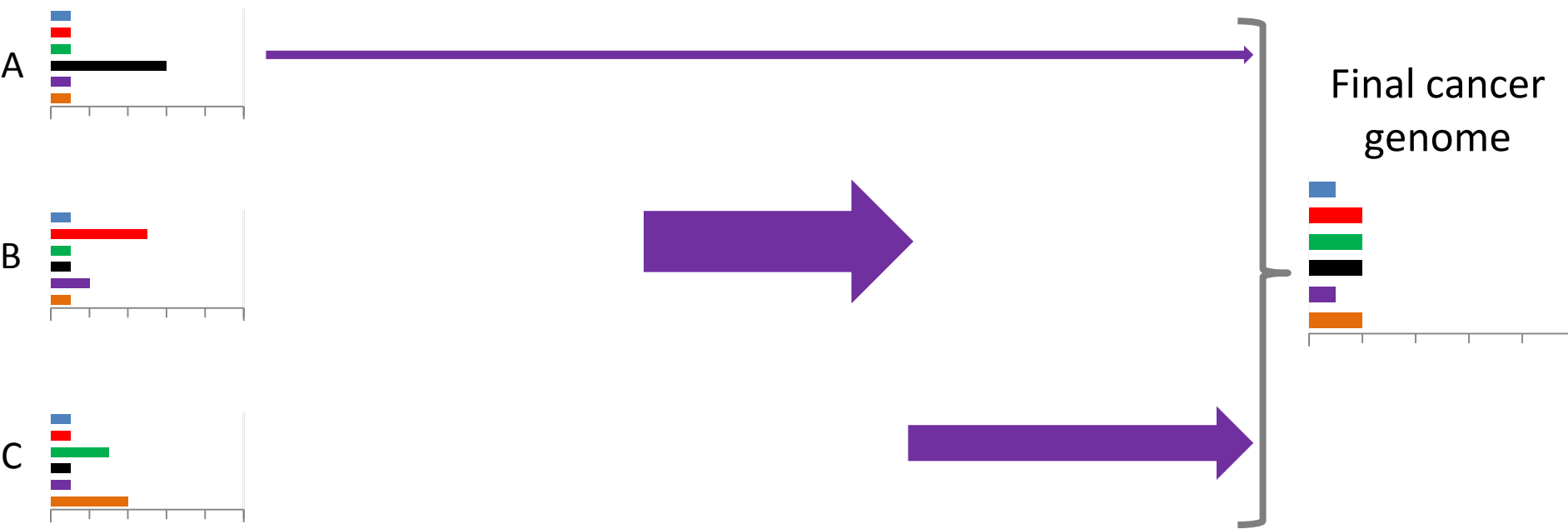
From fertilised egg to cancer cell



From fertilised egg to cancer cell



Mutational processes



Non-negative matrix factorization (NMF)

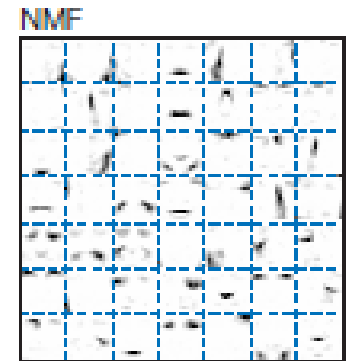
.....

Learning the parts of objects by non-negative matrix factorization

Daniel D. Lee* & H. Sebastian Seung*†

* Bell Laboratories, Lucent Technologies, Murray Hill, New Jersey 07974, USA

† Department of Brain and Cognitive Sciences, Massachusetts Institute of Technology, Cambridge, Massachusetts 02139, USA



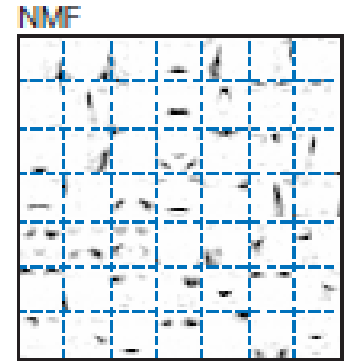
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Learning the parts of objects by non-negative matrix factorization

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Cell

Mutational Processes Molding the Genomes of 21 Breast Cancers

Serena Nik-Zainal,¹ Ludmil B. Alexandrov,¹ David C. Wedge,¹ Peter Van Loo,^{1,2,3} Christopher D. Greenman,^{1,4,5}



Cell Reports
Resource

Deciphering Signatures of Mutational Processes Operative in Human Cancer

Ludmil B. Alexandrov,¹ Serena Nik-Zainal,¹ David C. Wedge,¹ Peter J. Campbell,^{1,2,3} and Michael R. Stratton^{1,*}

ARTICLE

doi:10.1038/nature12477

Signatures of mutational processes in human cancer

A list of authors and their affiliations appears at the end of the paper

Classification of base substitution mutations

C>T

C>A

C>G

T>A

T>C

T>G

6 mutation classes

Classification of base substitution mutations

.....ATCGGGAAT**C**GGACCCGATG.....
 ↓
.....ATCGGGAAT**T**GGACCCGATG.....

Classification of base substitution mutations

.....ATCGGGAA**TC**GGACCCGATG.....
 ↓
ATCGGGAA**TT**GGACCCGATG.....

Classification of base substitution mutations

.....ATCGGGAA**TC**GGACCCGATG.....



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Classification of base substitution mutations

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.....ATCGGGA**TT**GGACCCGATG.....

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T>G

6 mutation classes

ACA>ATA

ACC>ATC

ACG>ATG

ACT>ATT

CCA>CTA

CCC>CTC

CCG>CTG

CCT>CTT

GCA>GTA

GCC>GTC

GCG>GTG

GCT>GTT

TCA>TTA

TCC>TTC

TCG>TTG

TCT>TTT

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C>A

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GCG>GTG
GCT>GTT
TCA>TAA
TCC>TAC
TCG>TAG
TCT>TAT

ACA>AAA
ACC>AAC
ACG>AAG
ACT>AAT
CCA>CAA
CCC>CAC
CCG>CAG
CCT>CAT
GCA>GAA
GCC>GAC
GCG>GAG
GCT>GAT
TCA>TAA
TCC>TAC
TCG>TAG
TCT>TAT

ACA>AGA
ACC>AGC
ACG>AGG
ACT>AGT
CCA>CGA
CCC>CGC
CCG>CGG
CCT>CGT
GCA>GGA
GCC>GGC
GCG>GGG
GCT>GGT
TCA>TGA
TCC>TGC
TCG>TGG
TCT>TGT

ATA>AAA
ATC>AAC
ATG>AAG
ATT>AAT
CTA>CAA
CTC>CAC
CTG>CAG
CTT>CAT
GTA>GAA
GTC>GAC
GTG>GAG
GTT>GAT
TTA>TAA
TTC>TAC
TTG>TAG
TTT>TAT

ATA>ACA
ATC>ACC
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ATT>ACT
CTA>CCA
CTC>CCC
CTG>CCG
CTT>CCT
GTA>GCA
GTC>GCC
GTG>GCG
GTT>GCT
TTA>TCA
TTC>TCC
TTG>TCG
TTT>TCT

ATA>AGA
ATC>AGC
ATG>AGG
ATT>AGT
CTA>CGA
CTC>CGC
CTG>CGG
CTT>CGT
GTA>GGA
GTC>GGC
GTG>GGG
GTT>GGT
TTA>TGA
TTC>TGC
TTG>TGG
TTT>TGT

96 mutation classes

Extracting mutational signatures from human cancers

7,042 cancer cases of 30 cancer types

Extracting mutational signatures from human cancers

7,042 cancer cases of 30 cancer types



7,042 mutation catalogues = 4,942,984 somatic mutations

Extracting mutational signatures from human cancers

7,042 cancer cases of 30 cancer types



7,042 mutation catalogues = 4,942,984 somatic mutations



Apply Non-negative Matrix Factorisation (NMF)

Extracting mutational signatures from human cancers

7,042 cancer cases of 30 cancer types



7,042 mutation catalogues = 4,942,984 somatic mutations



Apply Non-negative Matrix Factorisation (NMF)



Extract mutational signatures

Extracting mutational signatures from human cancers

7,042 cancer cases of 30 cancer types



7,042 mutation catalogues = 4,942,984 somatic mutations



Apply Non-negative Matrix Factorisation (NMF)



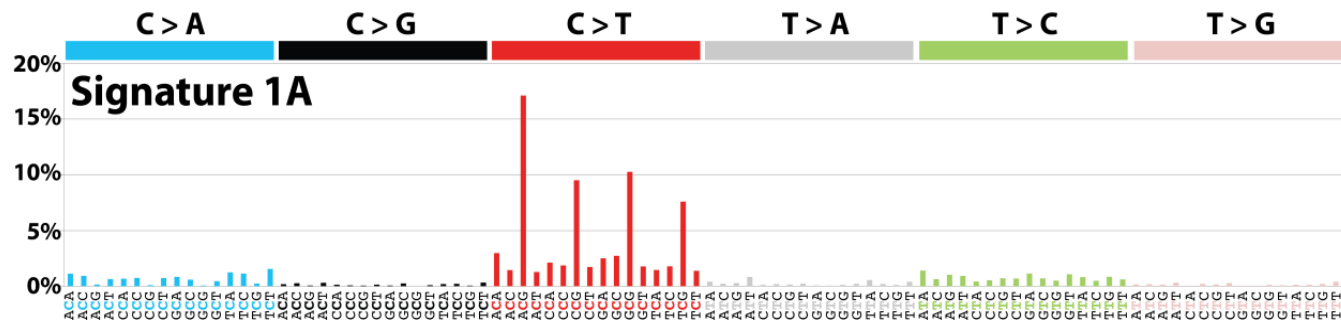
Extract mutational signatures



Estimate the contribution of each mutational signature to the mutational catalogue of each of the 7,042 cancer genomes

The landscape of mutational signatures across human cancer

Mutational signatures in human cancer



Mutational signatures in human cancer



Mutational signatures in human cancer



Mutational signatures in human cancer



Mutational signatures in human cancer



Mutational signatures in human cancer



Mutational signatures in human cancer



Mutational signatures in human cancer



Mutational signatures in human cancer



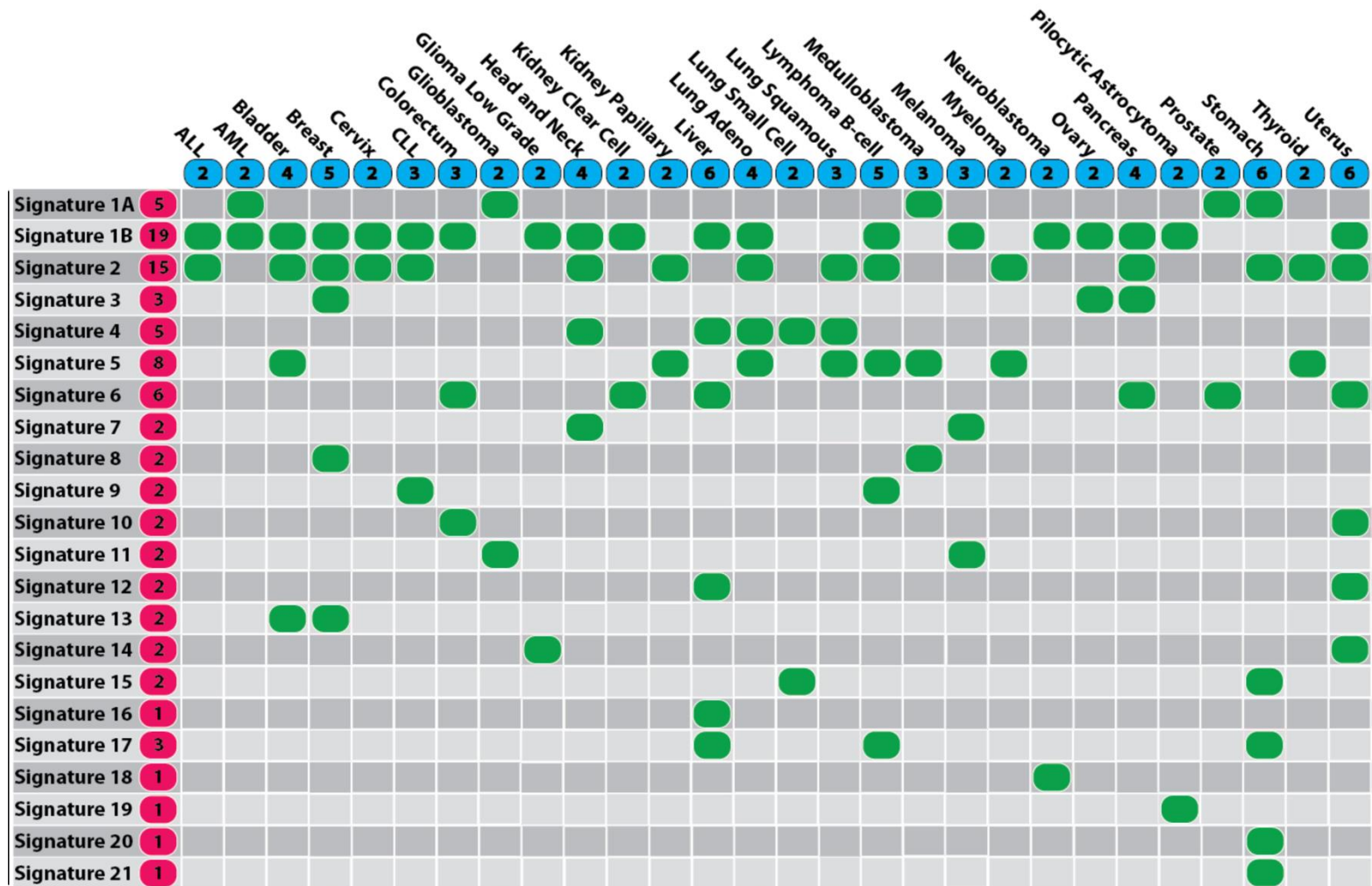
Mutational signatures in human cancer



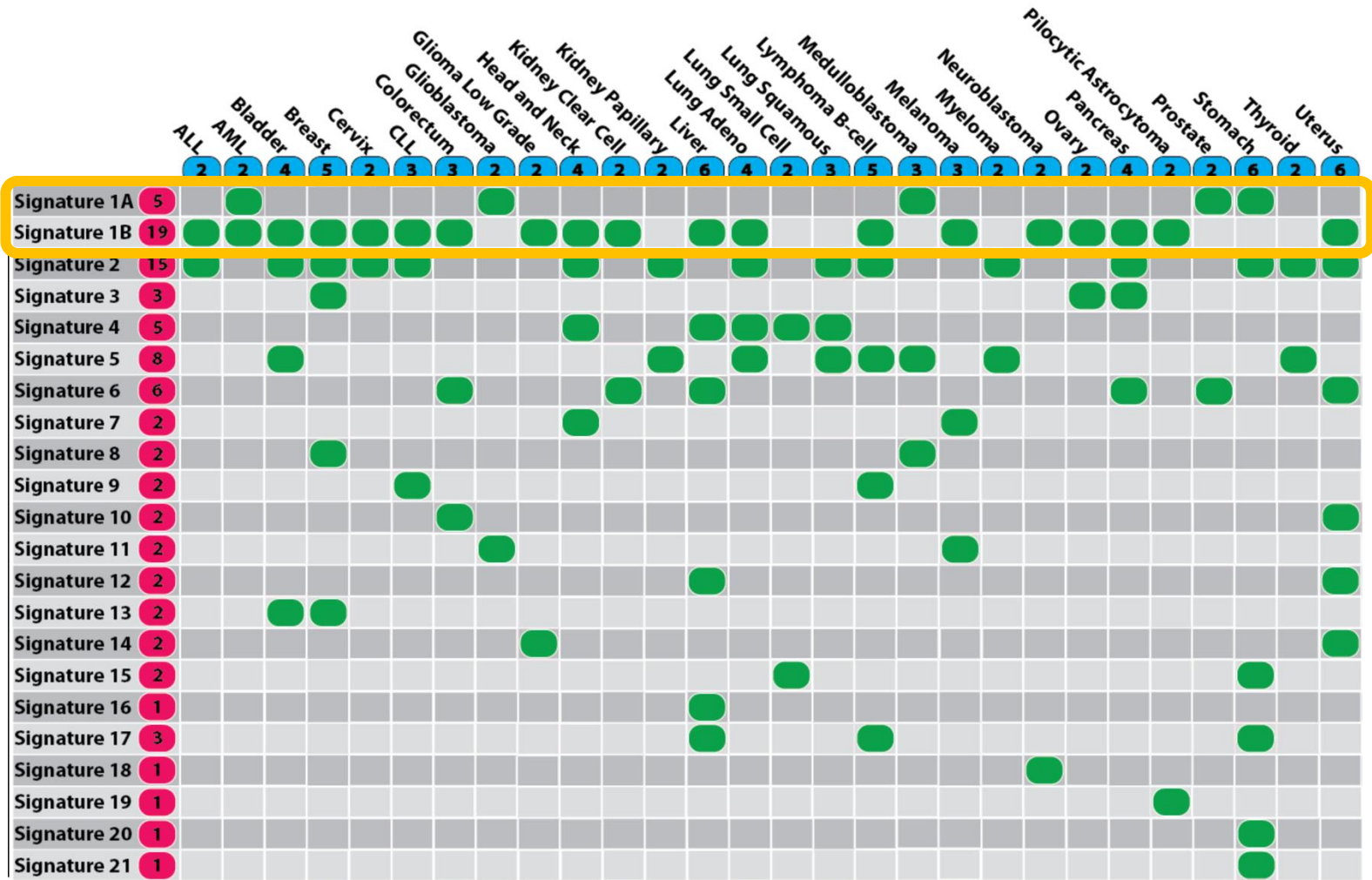
Mutational signatures in human cancer



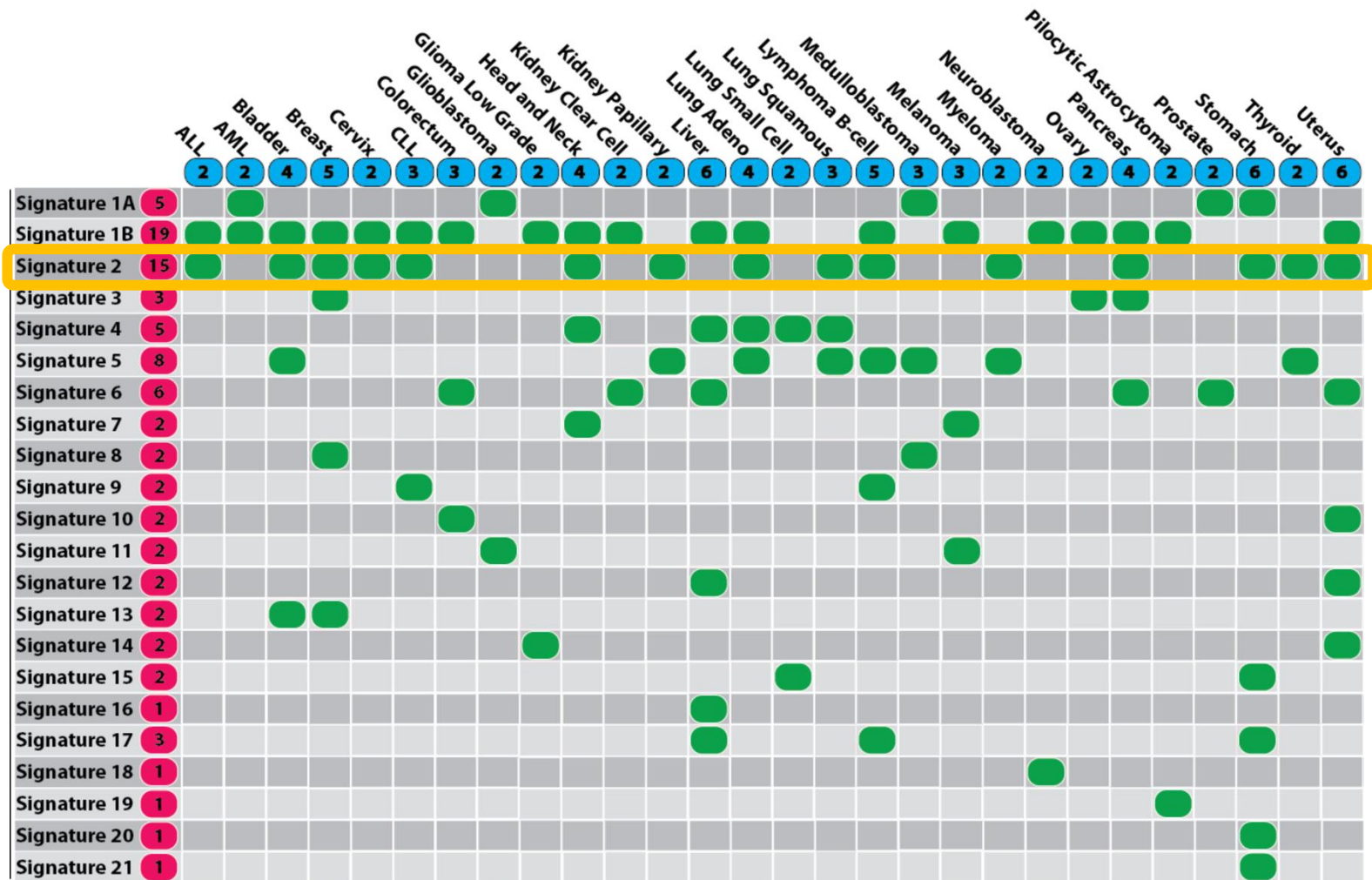
Mutational signatures by cancer type



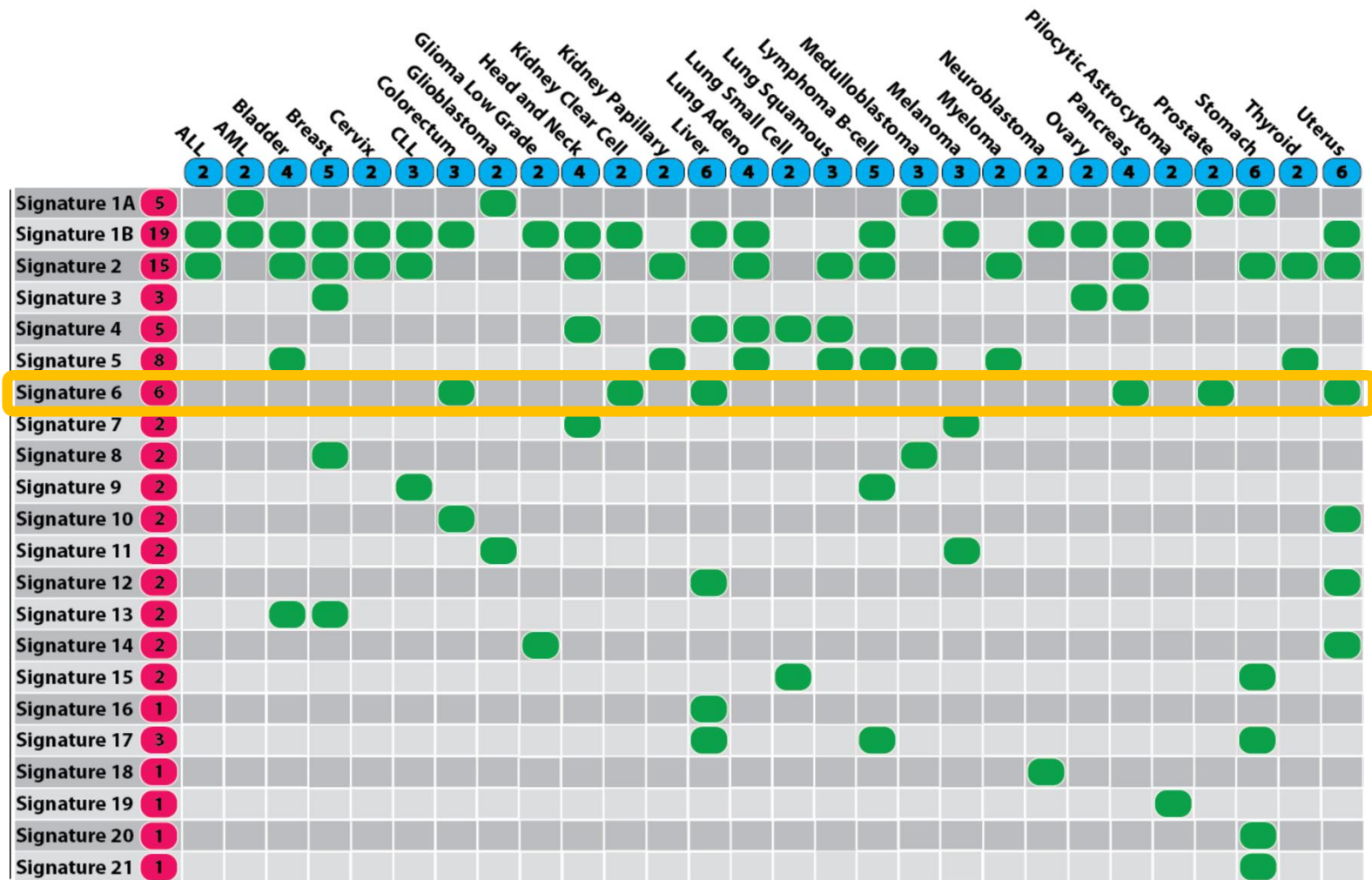
Mutational signatures by cancer type



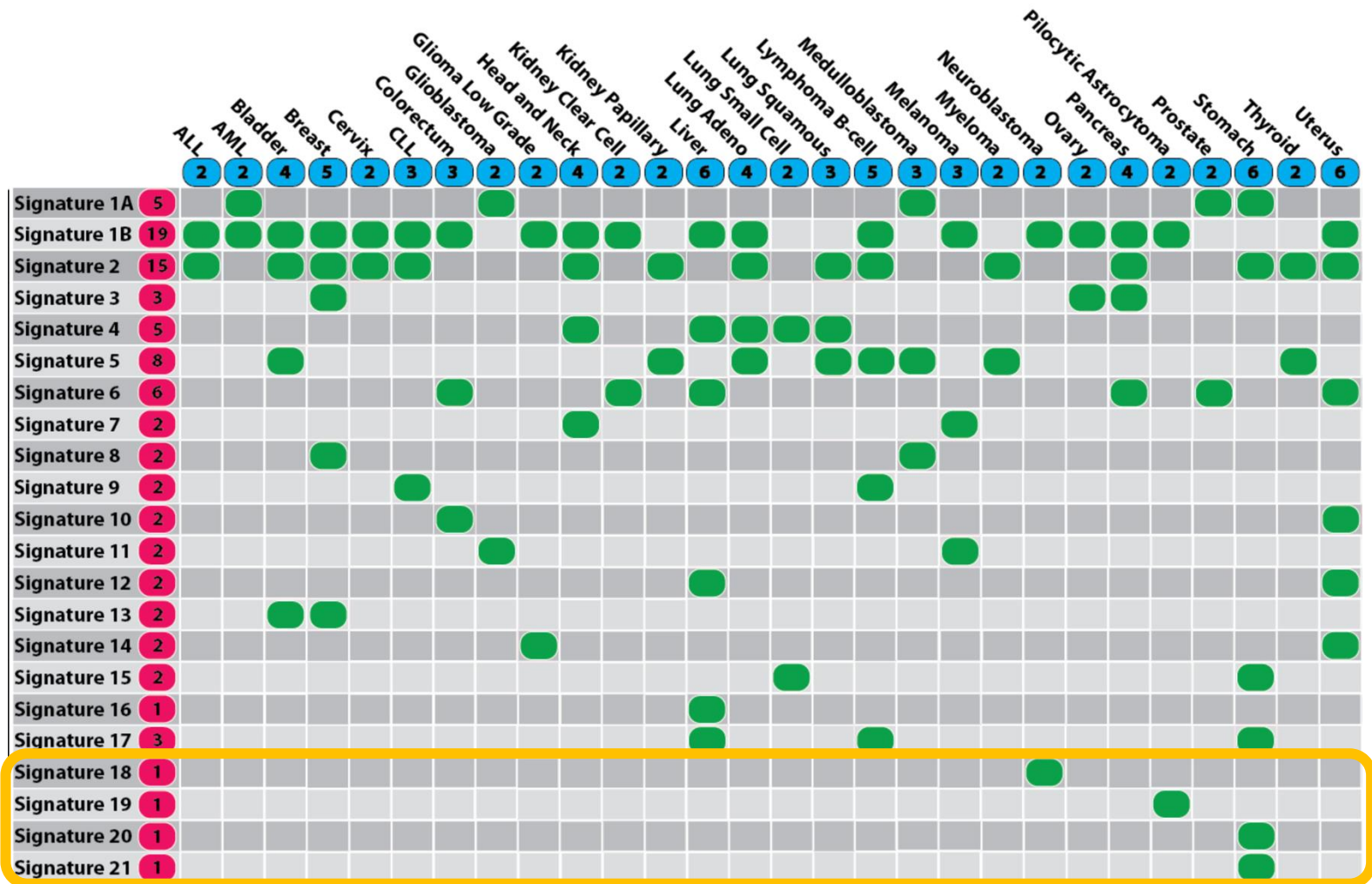
Mutational signatures by cancer type



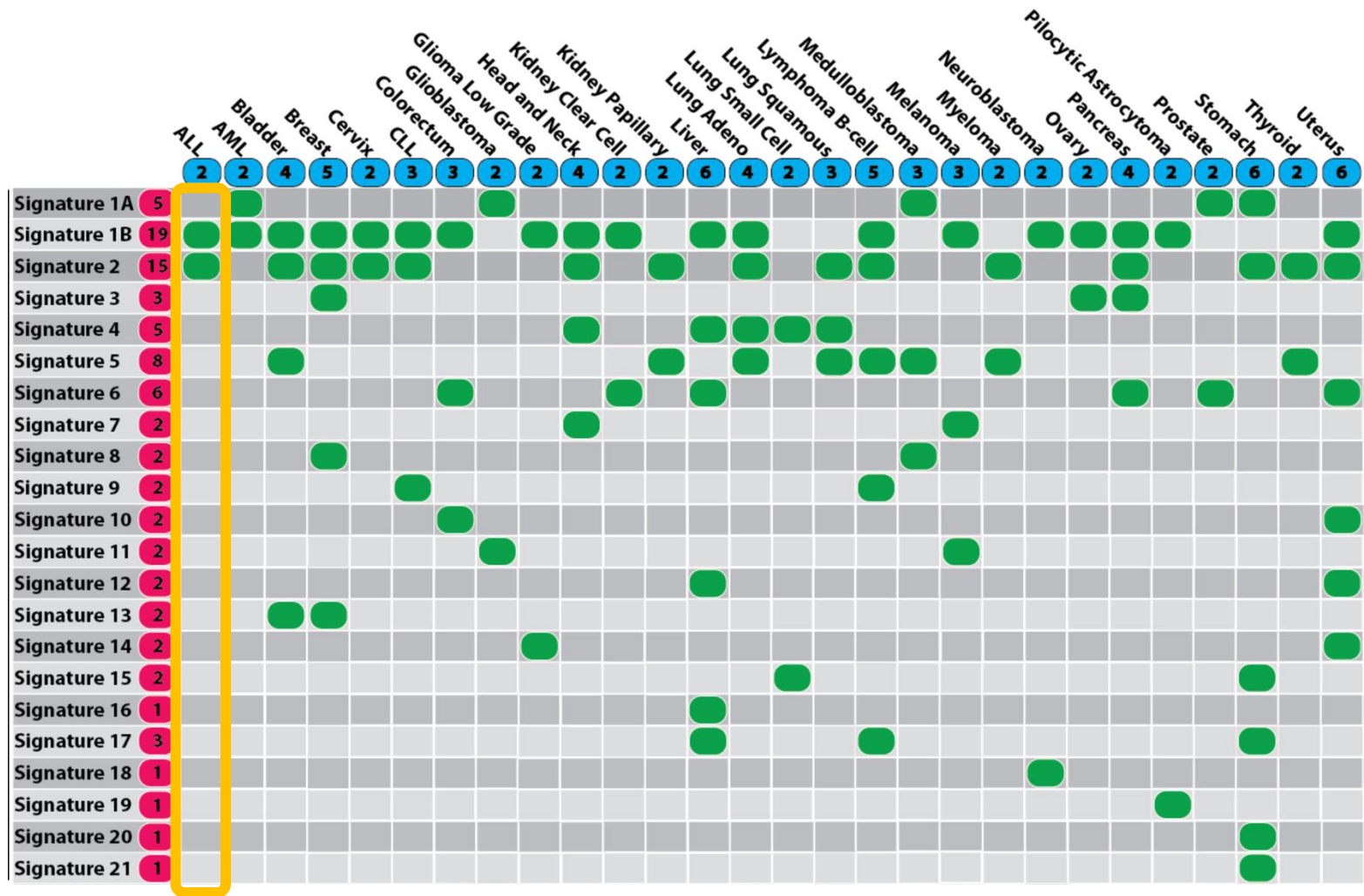
Mutational signatures by cancer type



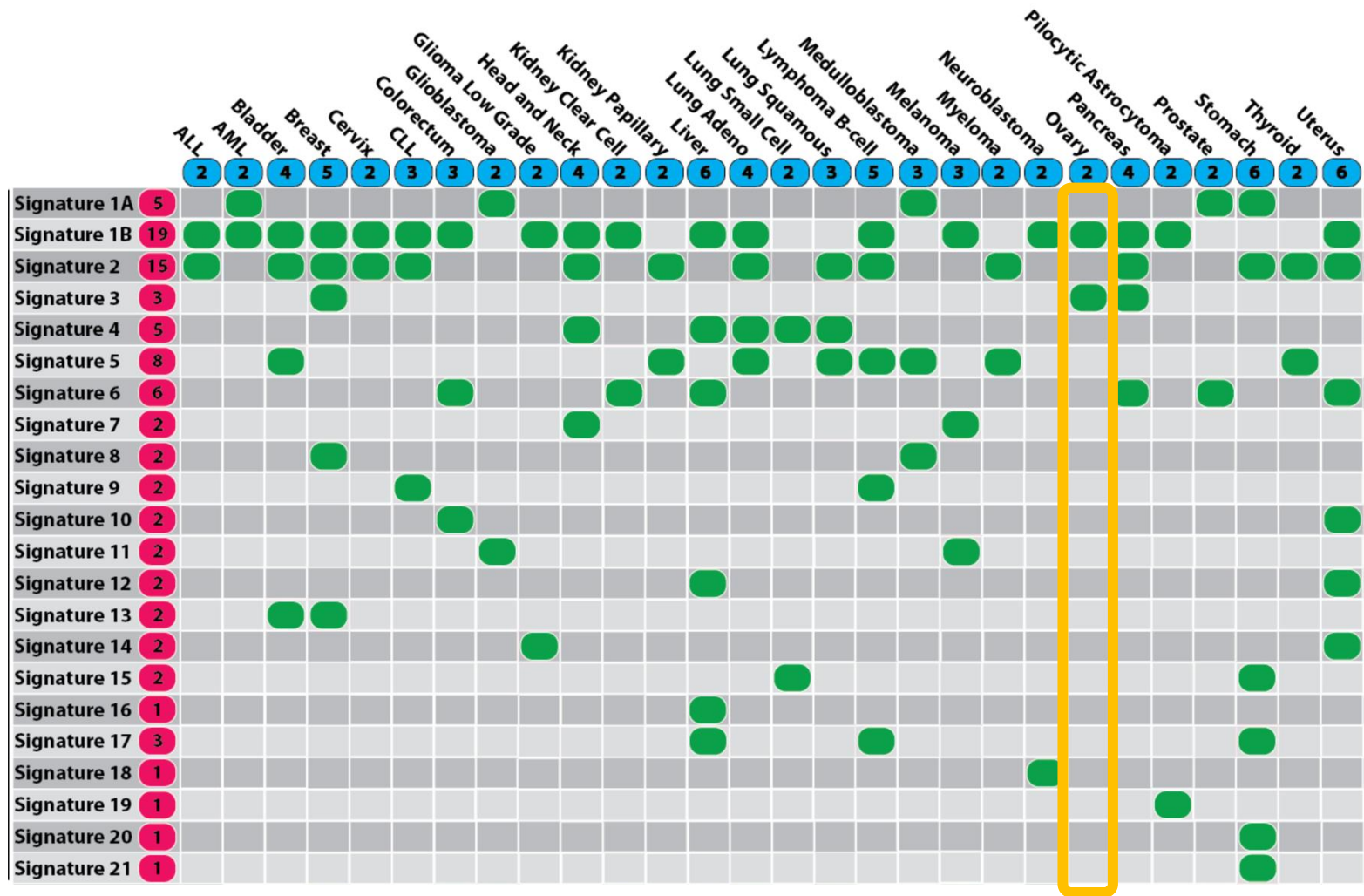
Mutational signatures by cancer type



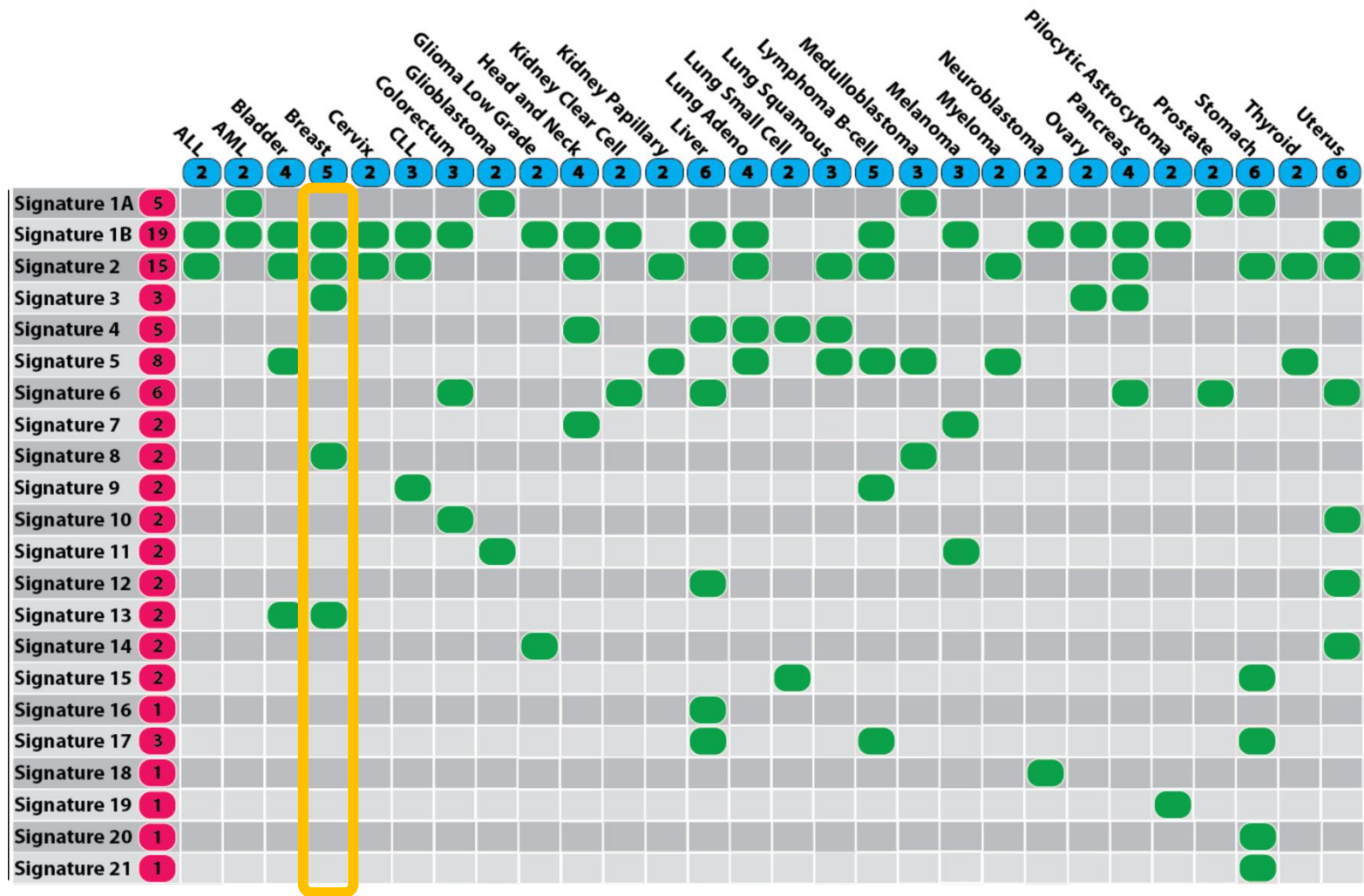
Mutational signatures by cancer type



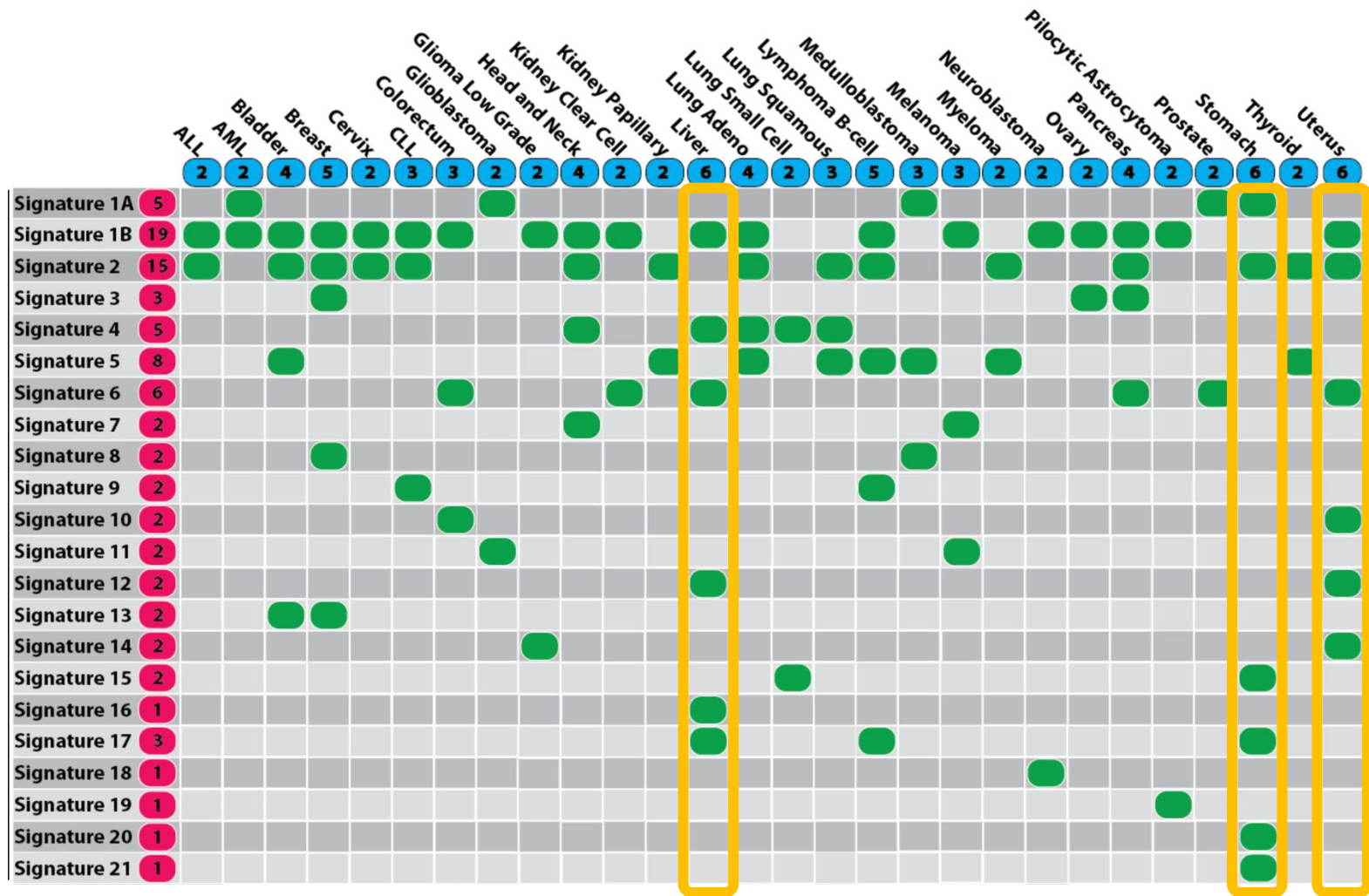
Mutational signatures by cancer type



Mutational signatures by cancer type

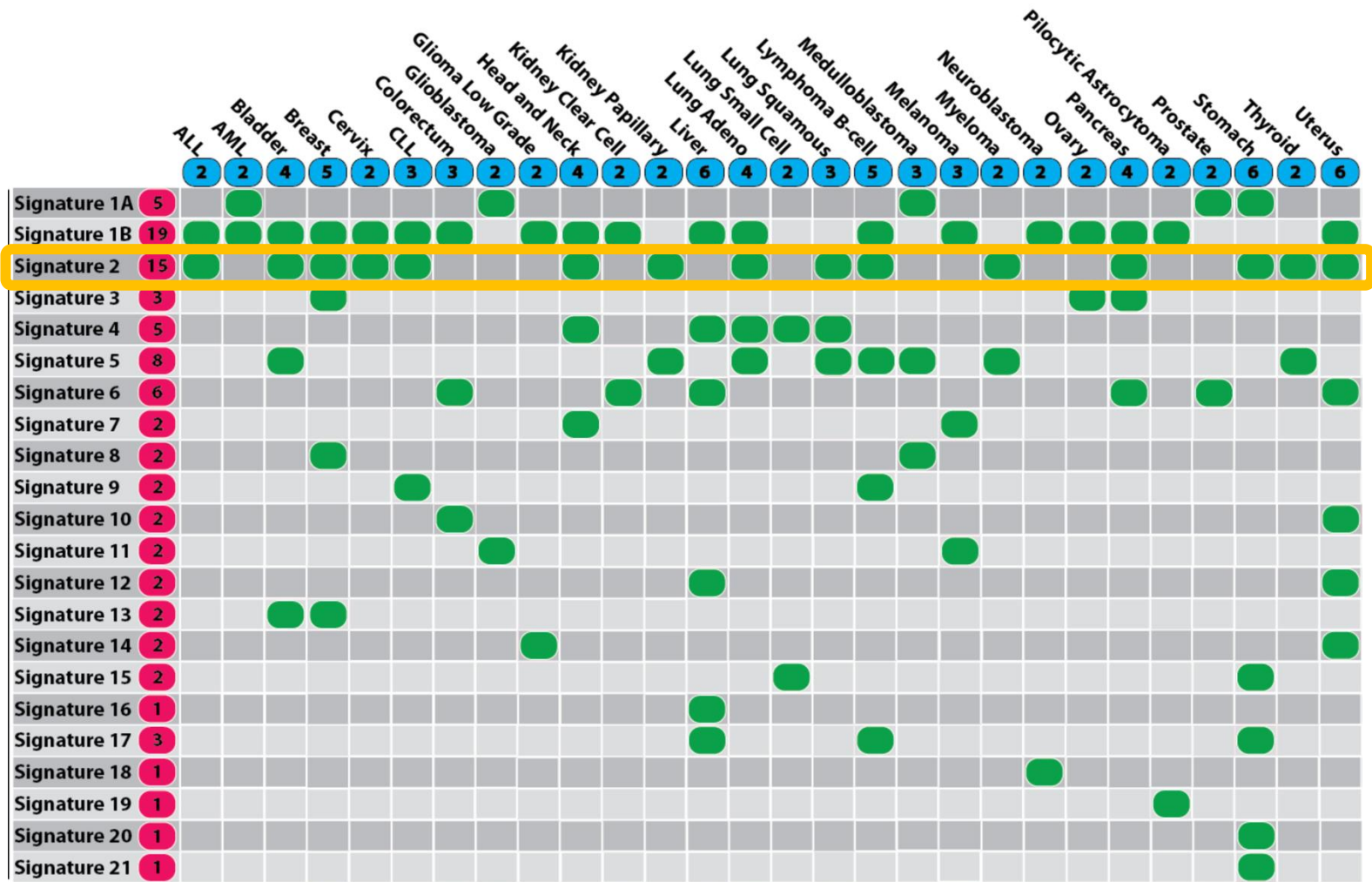


Mutational signatures by cancer type

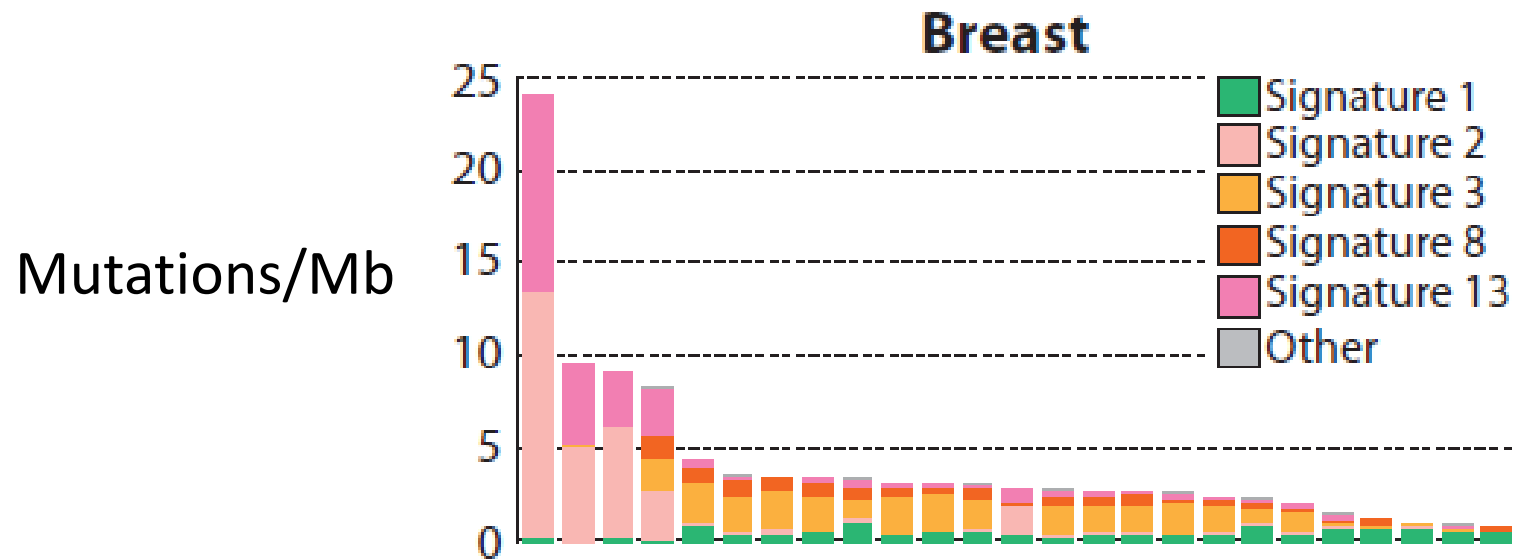


Mutational processes underlying mutational signatures

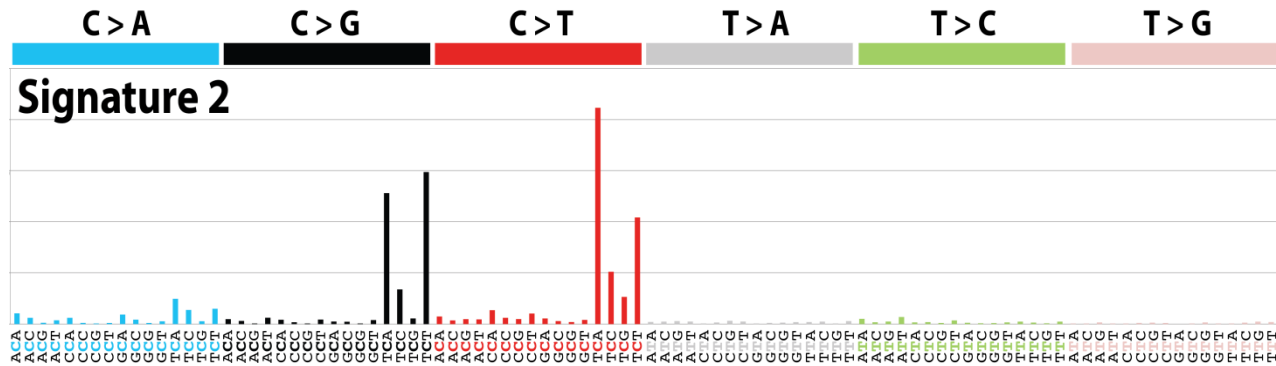
Etiologies of mutational signatures



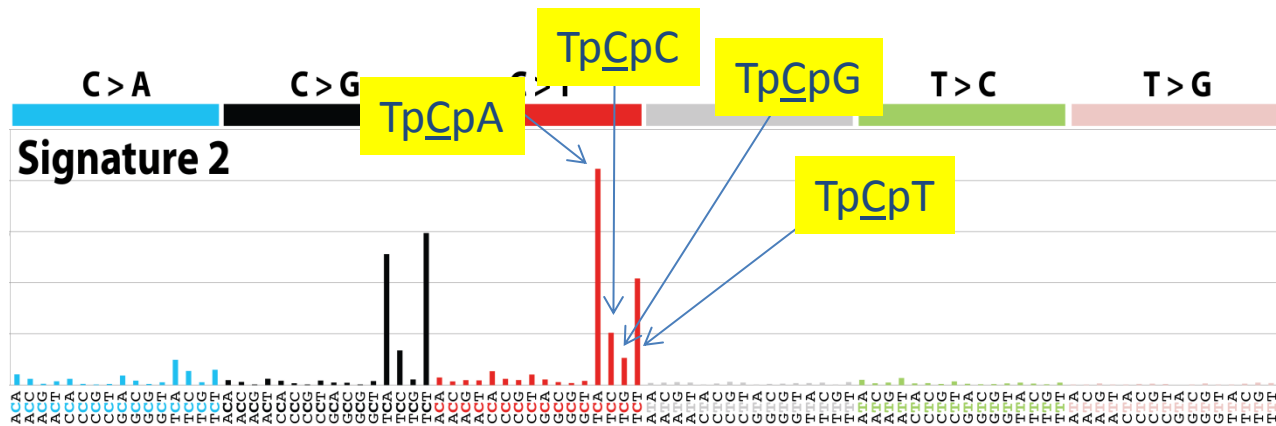
Contributions of mutation signatures to individual cancer cases



Signature 2 is characterised by C>T and C>G substitutions



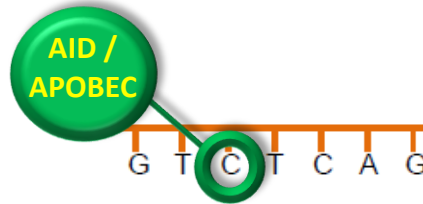
Signature 2 is characterised by C>T and C>G substitutions at TpCpN trinucleotides



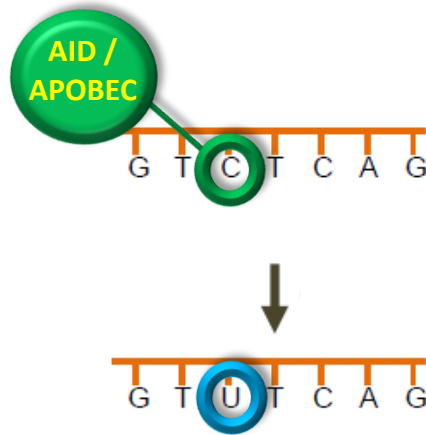
What is the mutational process underlying Signature 2?

- Deamination of cytosine by one of the family of AID/APOBEC enzymes?
- The family includes
 - AID
 - APOBEC1
 - APOBEC2
 - APOBEC3A-H
 - APOBEC4

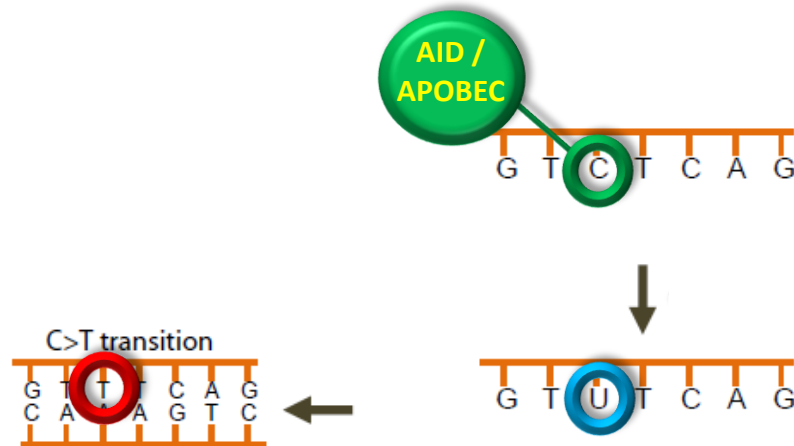
DNA editing by the AID/APOBEC family of cytidine deaminases



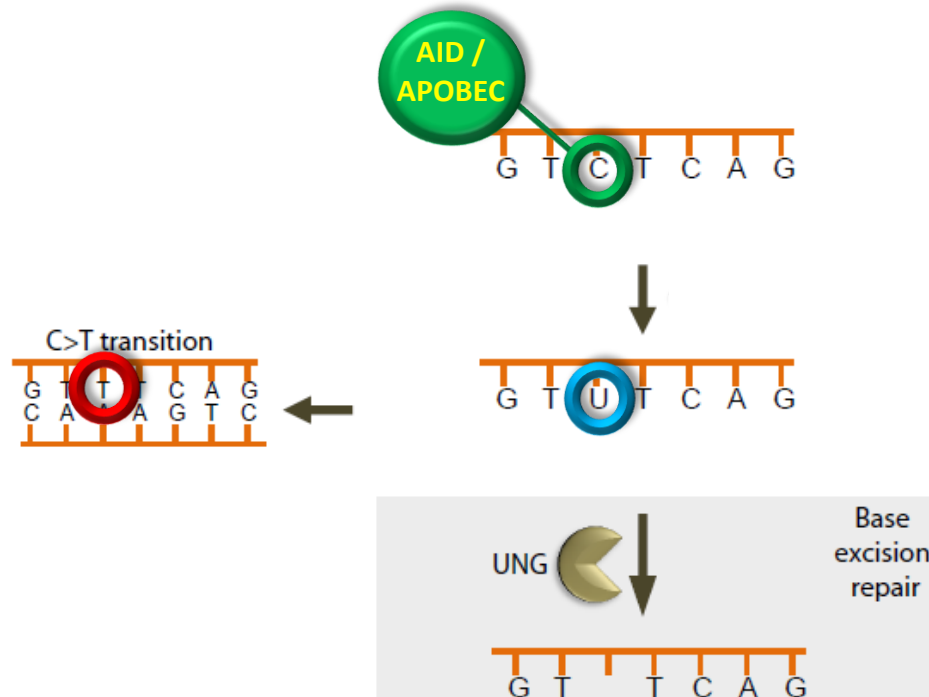
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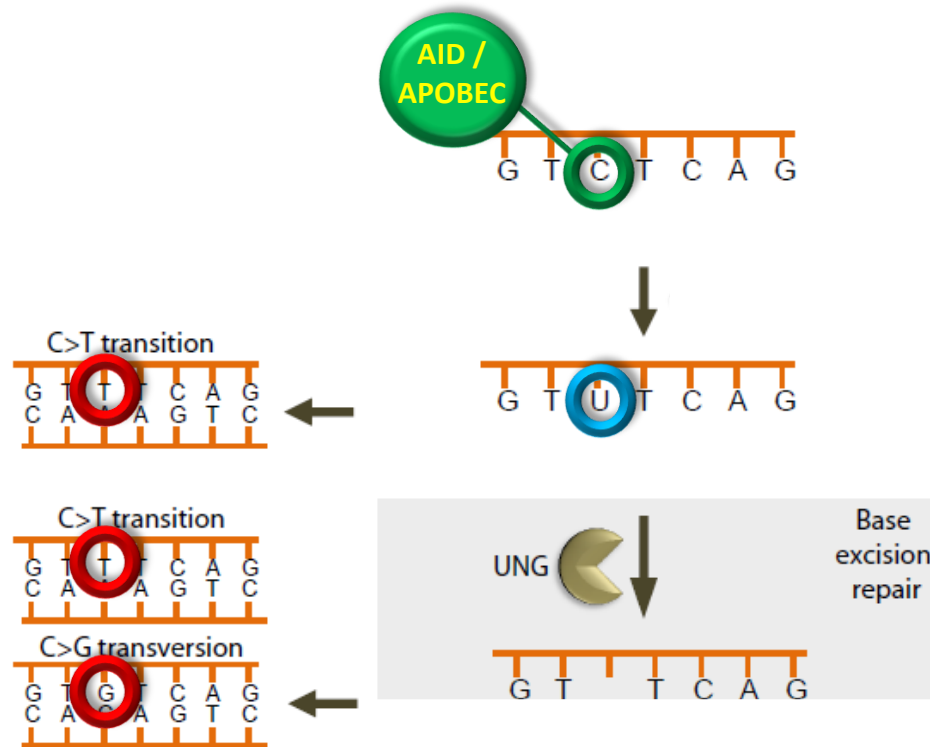
DNA editing by the AID/APOBEC family of cytidine deaminases



DNA editing by the AID/APOBEC family of cytidine deaminases



DNA editing by the AID/APOBEC family of cytidine deaminases



The AID / APOBEC family of cytidine deaminases have normal functions that require DNA editing

- AID plays a central role in somatic hypermutation and class switch recombination at the immunoglobulin loci
- APOBEC3A-H mutate HIV, Hepatitis B virus and retrotransposons to restrict their activity and replication

Which member(s) of the family is responsible
for Signature 2?

~~AID~~

APOBEC1

APOBEC2

APOBEC3A

APOBEC3B

APOBEC3C

APOBEC3DE

APOBEC3F

APOBEC3G

APOBEC3G

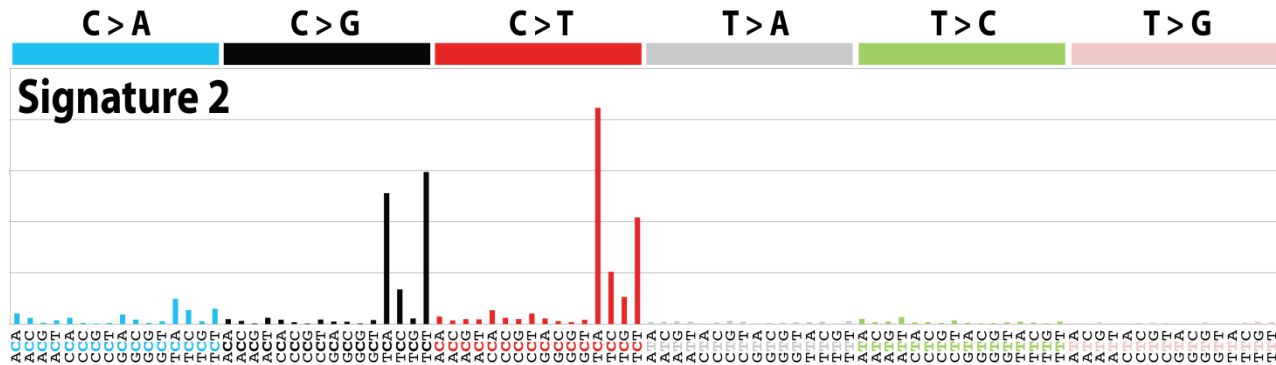
APOBEC3H

APOBEC4

What switches on intense APOBEC activity?

- Mutation or amplification of the APOBEC genes?
- Overexpression of APOBECs?
- Response to viral entry, retrotransposon movement or inflammation?

Is Signature 2 collateral damage on the cellular genome of APOBEC activation due to foreign DNA?



Known or speculative causes of mutational signatures

Deamination
of 5-methyl
cytosine, age



Known or speculative causes of mutational signatures



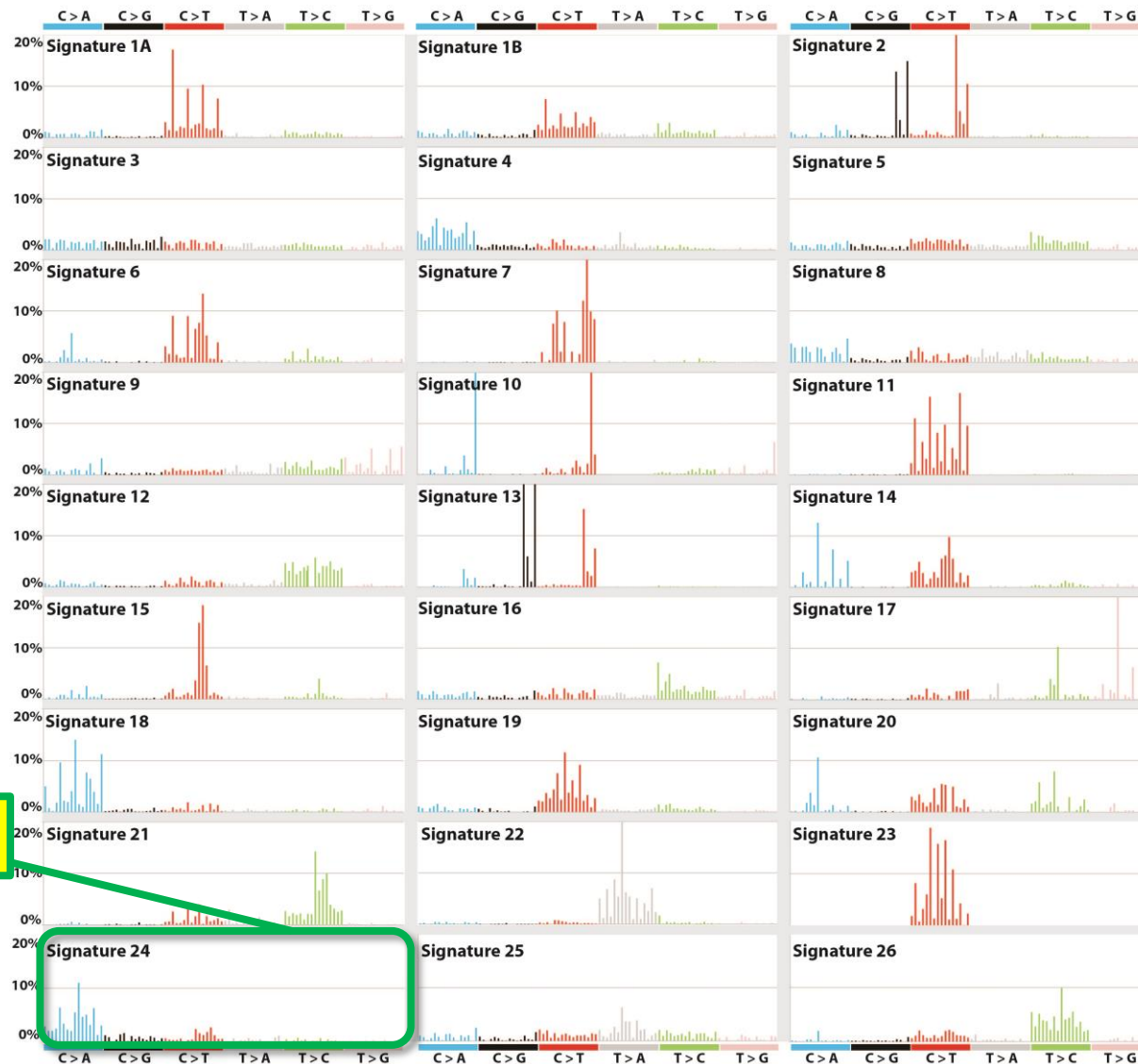
Tobacco

Known or speculative causes of mutational signatures



Ultraviolet
light

Known or speculative causes of mutational signatures



Aflatoxin

Known or speculative causes of mutational signatures



Aristolochic acid

Known or speculative causes of mutational signatures



Temozolomide

Known or speculative causes of mutational signatures



Defective DNA mismatch repair

Known or speculative causes of mutational signatures



Defective
BRCA1, BRCA2,
homologous
recombination
repair

Known or speculative causes of mutational signatures

Defective
polymerase
epsilon activity



Known or speculative causes of mutational signatures



Known or speculative causes of mutational signatures

Unknown



Elucidating the mutational processes underlying mutational signatures

Association of a signature with other features of the cancer:

- epidemiology
- gene expression
- mutated genes

Elucidating the mutational processes underlying mutational signatures

Association of a signature with other features of the cancer:

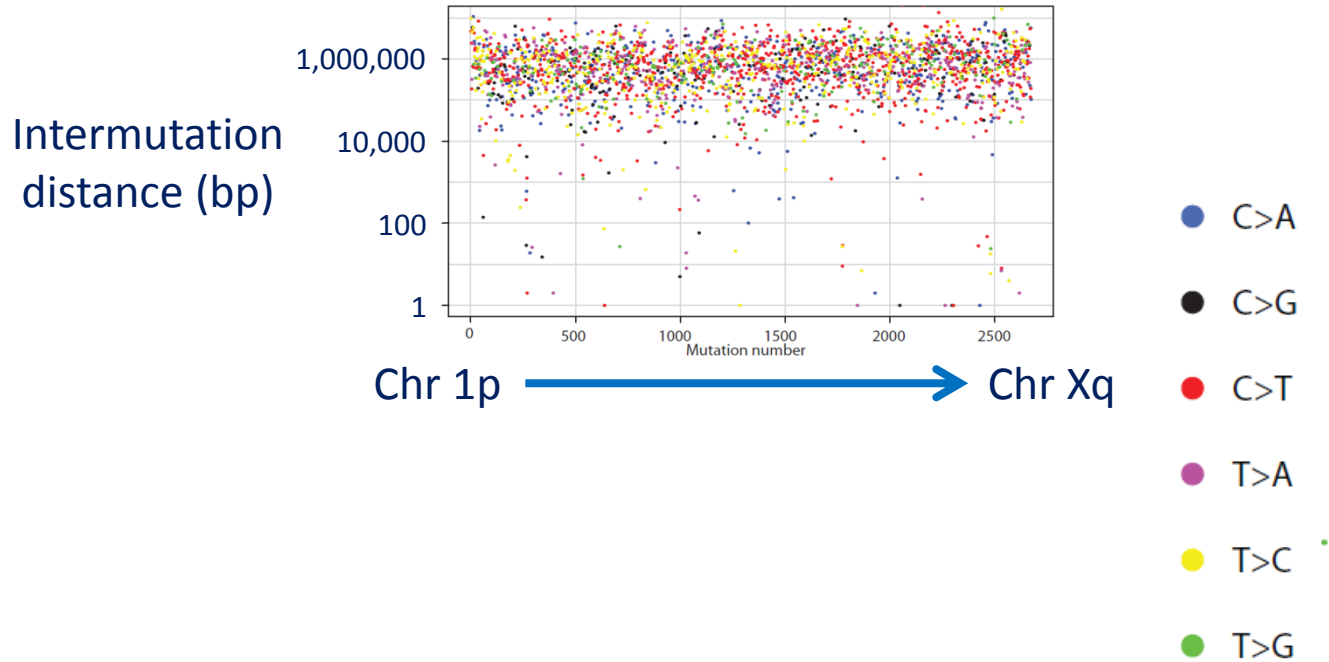
- epidemiology
- gene expression
- mutated genes

Acquiring a compendium of signatures from known exposures in experimental systems:

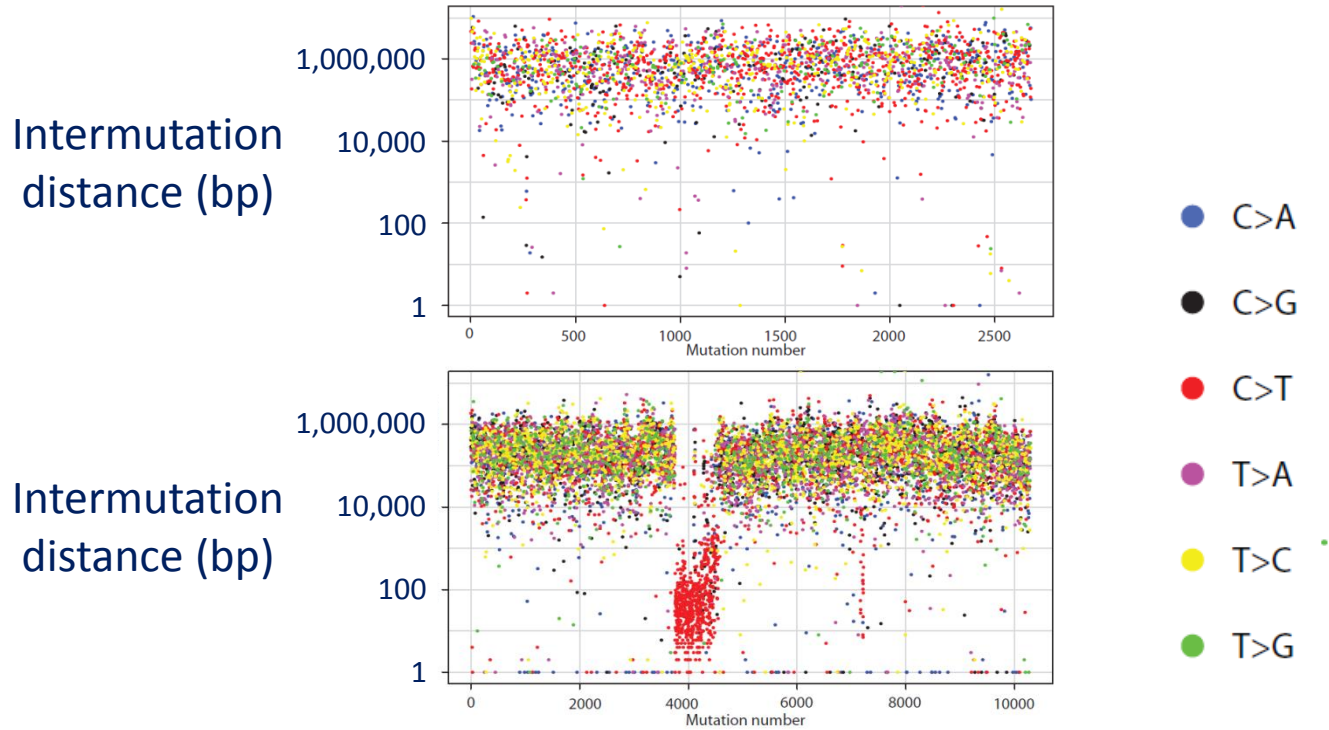
- mutagens
- defective DNA maintenance

Localised hypermutation: *kataegis*

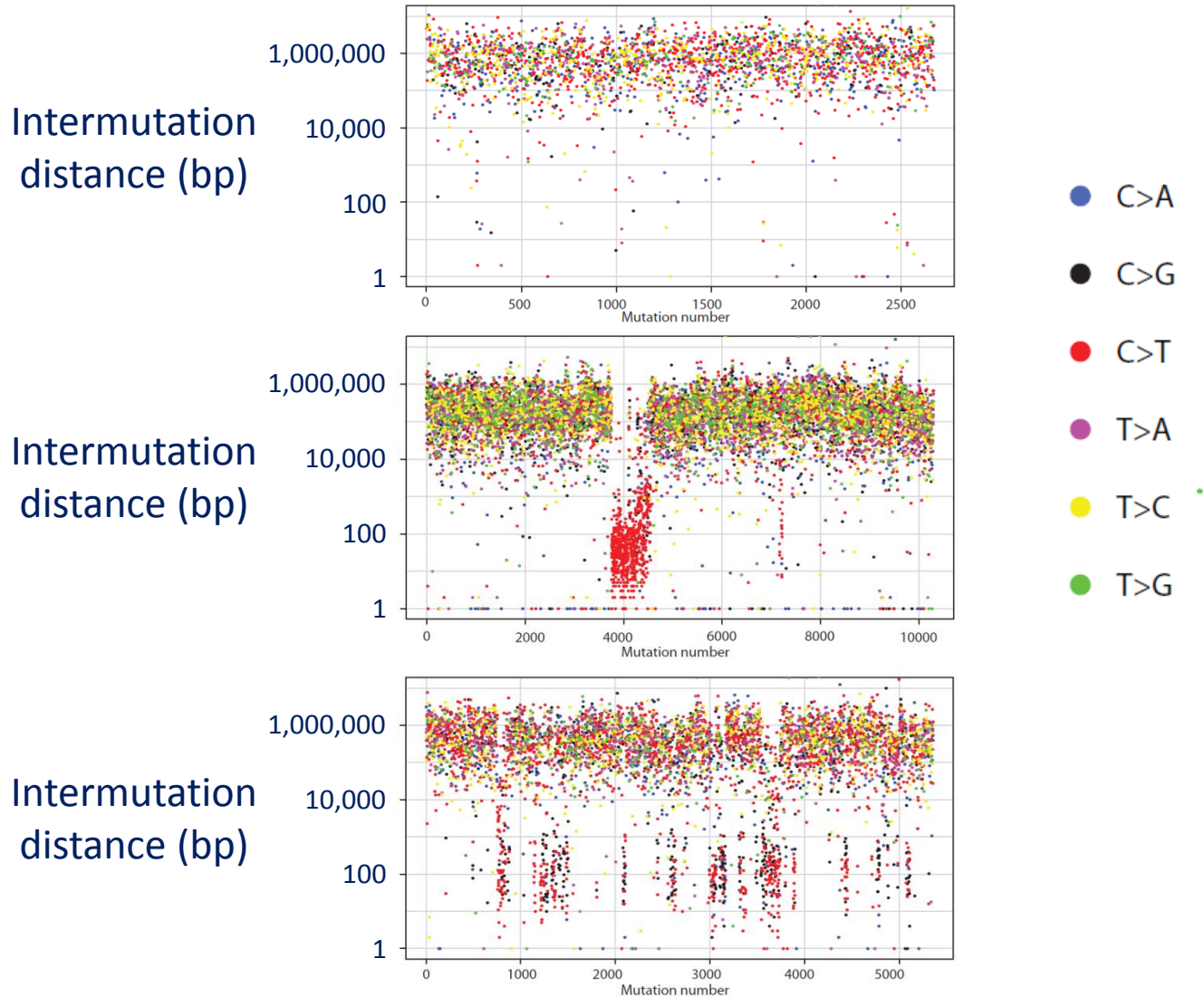
Foci of substitution hypermutation, *kataegis*, occur in cancer genomes



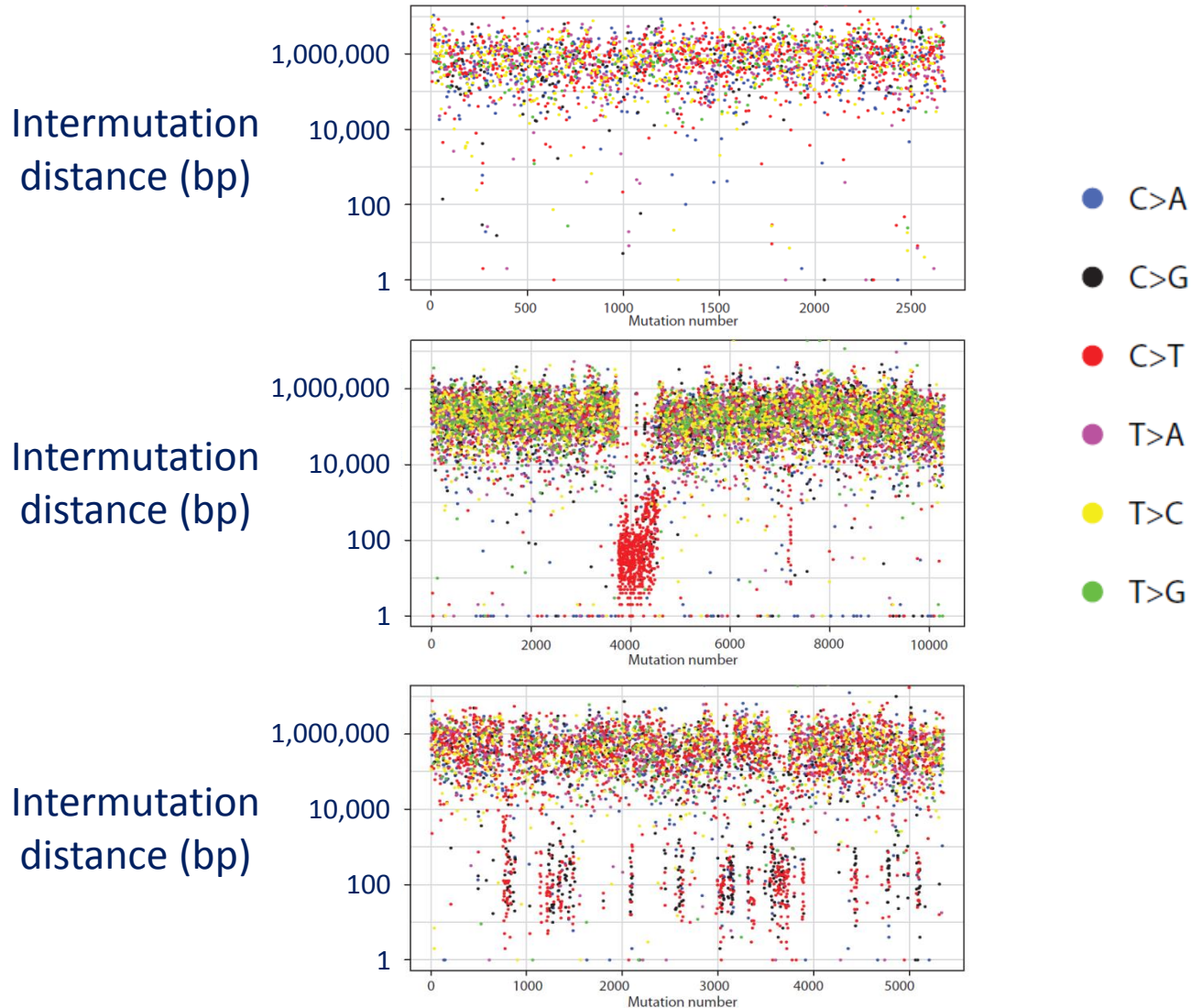
Foci of substitution hypermutation, *kataegis*, occur in cancer genomes



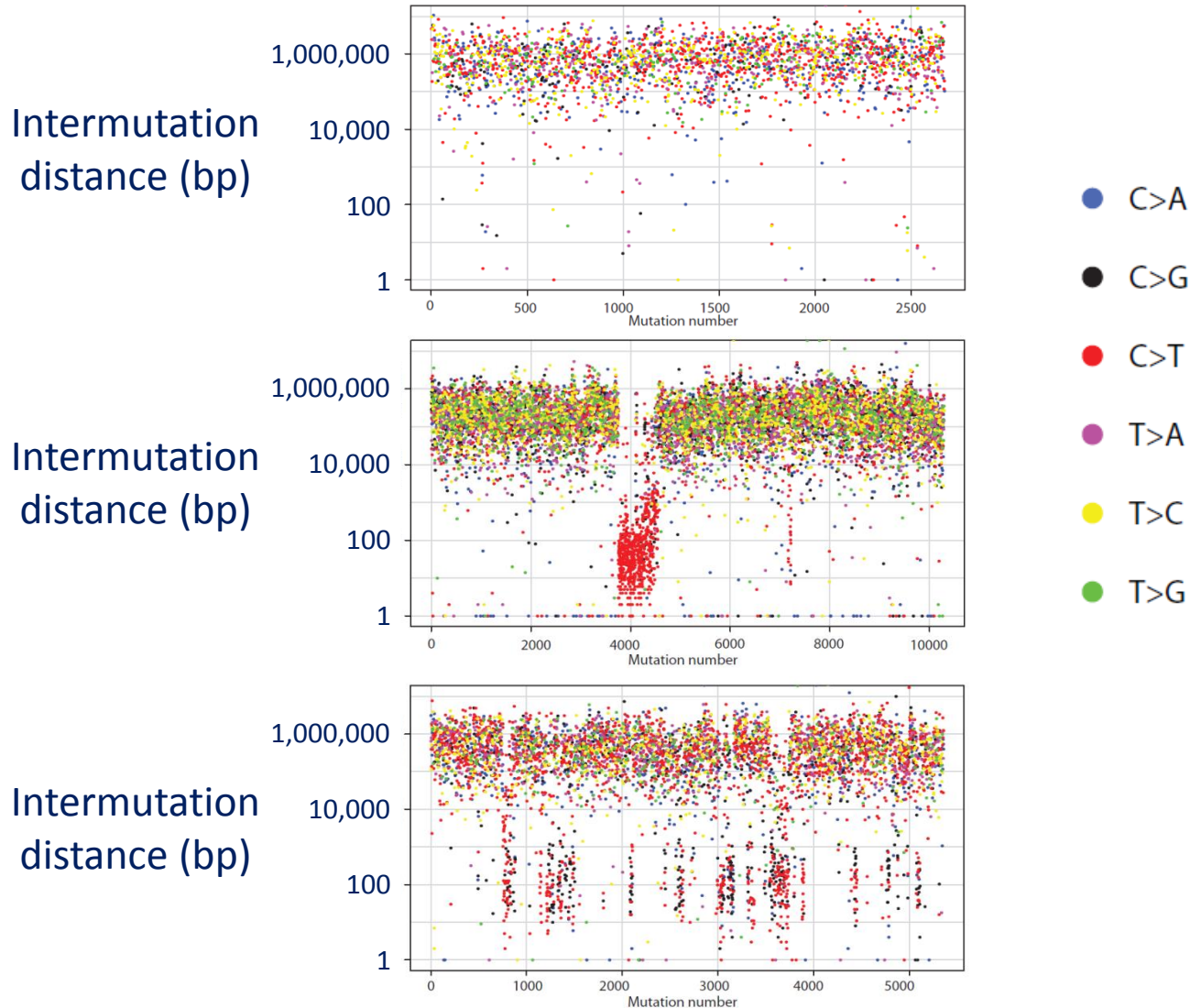
Foci of substitution hypermutation, *kataegis*, occur in cancer genomes



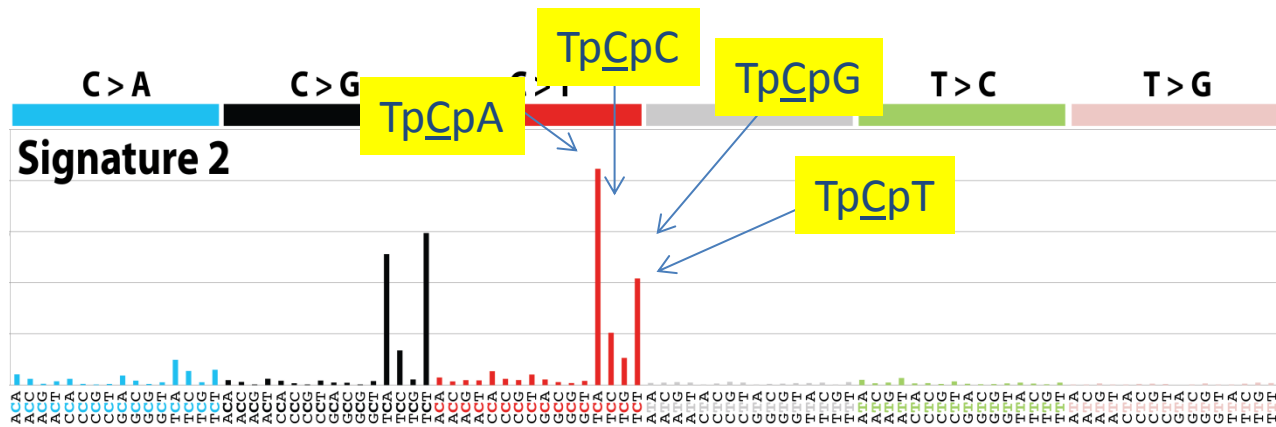
Mutations in regions of *kataegis* are almost all C>T or C>G



Mutations in regions of *kataegis* are almost all at TpCpN trinucleotides



Mutations in regions of *kataegis* are almost all at TpCpN trinucleotides



Are APOBECs responsible for *kataegis*?

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- Overexpression of APOBECs in yeast generates *kataegis*

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What directs an APOBEC to a particular part of the genome to generate *kataegis*?

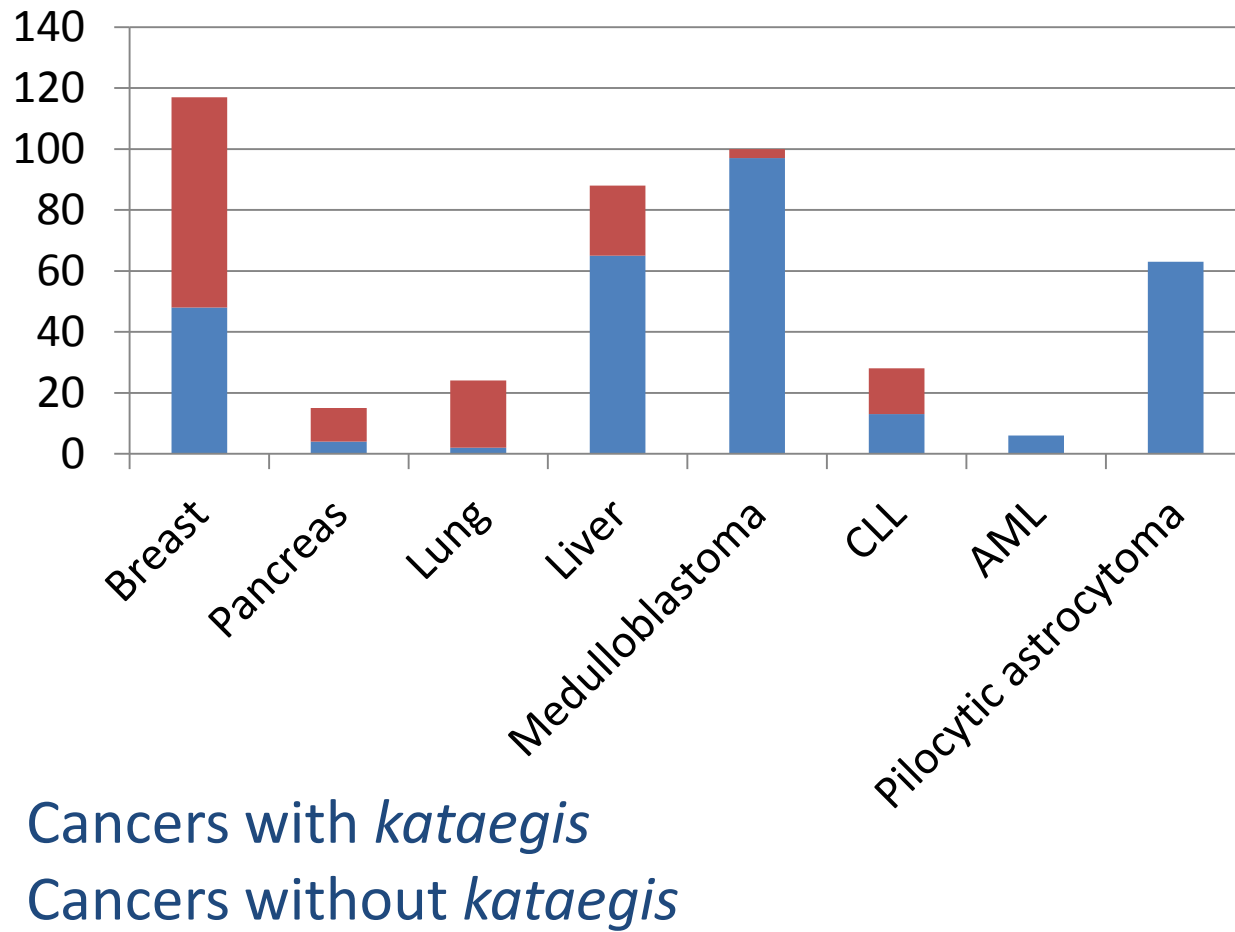
Are APOBECs responsible for *kataegis*?

- Overexpression of APOBECs in yeast generates *kataegis*

What directs an APOBEC to a particular part of the genome to generate *kataegis*?

- Introduction of a double strand break in yeast markedly increases the frequency of *kataegis* in the vicinity

Kataegis is present in many cancer types



Summary

- There are more than 20 genome-wide mutational signatures across human cancer
- A signature likely representing cytosine deamination due to APOBEC activity is common
- *Kataegis*, localised hypermutation, is found in many cancers
- Some signatures are due to known mutagenic exposures or known defects in DNA maintenance but the cause of many is unknown
- Understanding of the mutational processes underlying these signatures will inform on cancer causation, prevention and treatment



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Ludmil Alexandrov



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International
Cancer Genome
Consortium

THE CANCER GENOME ATLAS



