# Soamtic mutation

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Taking publicly available dataset from Esophageal carcinoma, acute myeloid leukemia and breast invasive carcinoma the following analysis has been done. I try to include as much results possible as I can.

```
## -Reading
## -Validating
## -Silent variants: 475
## -Summarizing
## -Processing clinical data
## -Finished in 0.752s elapsed (1.067s cpu)
```

```
##
  An object of class MAF
##
                       ID
                                    summary Mean Median
##
              NCBI Build
                                               NA
##
                  Center genome.wustl.edu
                                               NA
                                                       NA
##
    3:
                 Samples
                                        193
                                               NA
                                                       NA
    4:
                                       1241
##
                  nGenes
                                               NΑ
                                                       NA
         Frame Shift Del
                                                        0
##
    5:
                                         52 0.271
         Frame Shift Ins
                                         91 0.474
                                                        0
##
    6:
            In Frame Del
##
   7:
                                         10 0.052
                                                        0
            In Frame Ins
                                         42 0.219
                                                        0
    9: Missense Mutation
                                       1342 6.990
                                                        7
## 10: Nonsense Mutation
                                        103 0.536
                                                        0
## 11:
             Splice_Site
                                         92 0.479
                                                        0
## 12:
                    total
                                       1732 9.021
                                                        9
```

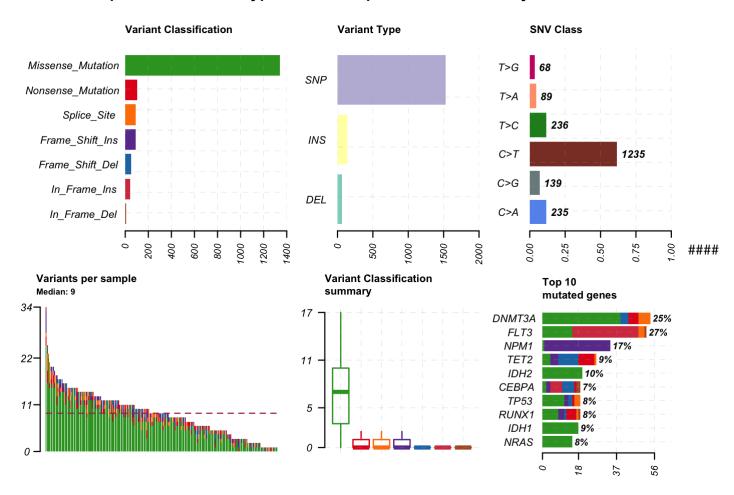
Tumor_Sample_Barcode <fctr></fctr>	Frame_Shift_Del <int></int>	Frame_Shift_Ins <int></int>	In_Frame_Del <int></int>	In_Frame_Ins <int></int>	Mi
TCGA-AB-3009	0	5	0	1	
TCGA-AB-2807	1	0	1	0	
TCGA-AB-2959	0	0	0	0	
TCGA-AB-3002	0	0	0	0	
TCGA-AB-2849	0	1	0	0	
TCGA-AB-2923	1	1	0	0	
TCGA-AB-2972	0	1	0	0	
TCGA-AB-2912	0	1	0	0	

Tumor_Sample_Barcode <fctr></fctr>	Frame_Shift_Del <int></int>	Frame_Shift_Ins <int></int>	In_F	_	_ <b>Del</b> cint>	ln,	_Frame_Ins <int></int>	Mi
TCGA-AB-2877	0	0			0		1	
TCGA-AB-2927	0	2			0		0	
1-10 of 192 rows   1-6 of 9 colu	ımns	Previous 1	2	3	4	5	6 20 Ne	ext

Hugo_Sym <chr></chr>	Frame_Shift_Del <int></int>	Frame_Shift_Ins <int></int>	In_Frame_Del <int></int>	In_Frame_Ins <int></int>	Missense_Mut
FLT3	0	0	1	33	
DNMT3A	4	0	0	0	
NPM1	0	33	0	0	
IDH2	0	0	0	0	
IDH1	0	0	0	0	
TET2	10	4	0	0	
RUNX1	1	3	1	0	
TP53	2	2	0	0	
NRAS	0	0	0	0	
CEBPA	6	2	2	6	
1-10 of 1,241 rov	ws   1-6 of 11 columns		Previous 1 2	3 4 5	6 125 Next

Tumor_Sample_Barcode <fctr></fctr>	<b>FAB_classification</b> <fctr></fctr>	days_to_last_followup <fctr></fctr>	Overall_Survival_Status <fctr></fctr>
TCGA-AB-2802	M4	365	1
TCGA-AB-2803	M3	792	1
TCGA-AB-2804	M3	2557	0
TCGA-AB-2805	MO	577	1
TCGA-AB-2806	M1	945	1
TCGA-AB-2807	M1	181	1
TCGA-AB-2808	M2	2861	0
TCGA-AB-2809	M3	62	1
TCGA-AB-2810	M2	31	1
TCGA-AB-2812	M2	366	1
1-10 of 193 rows		Previous 1 2 3	4 5 6 20 Next

# summary of the maf file, which displays number of variants in each sample as a stacked barplot and variant types as a boxplot summarized by Variant\_Classification

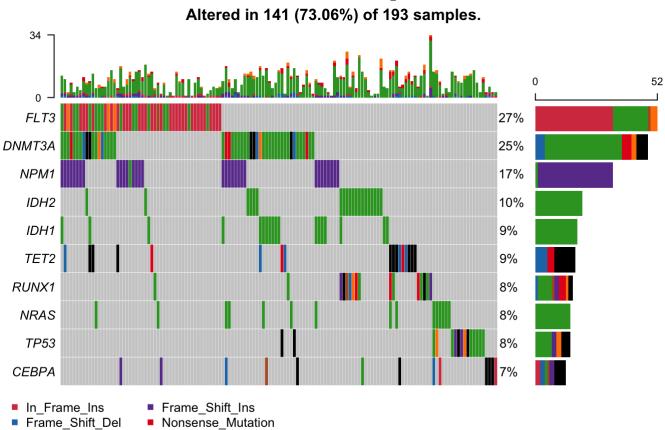


This is oncoplots, also known as waterfall plots.

#oncoplot for top ten mutated genes.
oncoplot(maf = laml, top = 10)

Splice\_Site

■ Multi\_Hit

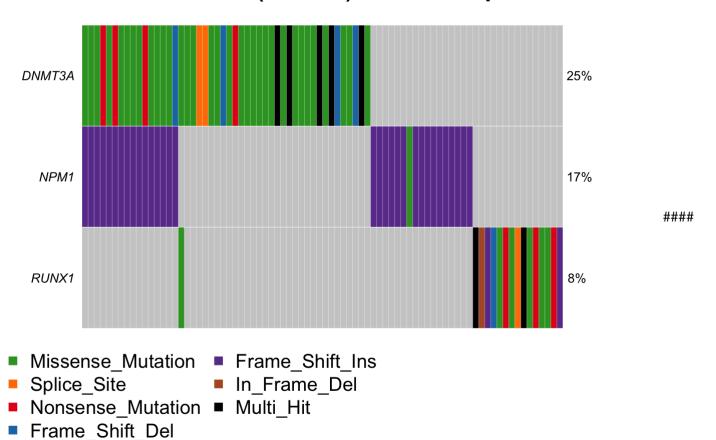


### Mutations in each sample

Missense\_Mutation

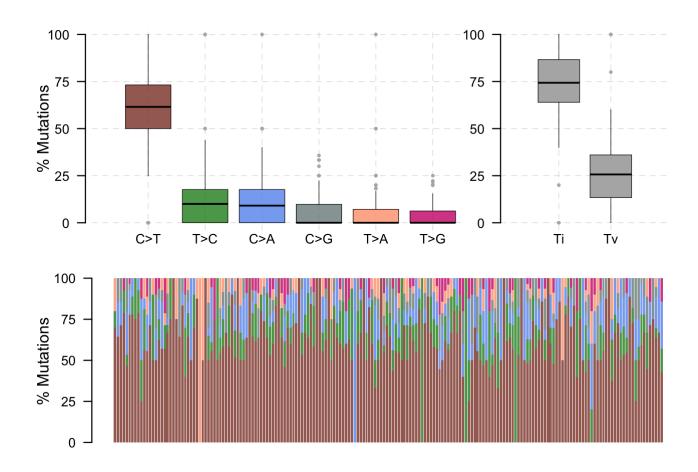
In\_Frame\_Del

## Altered in 80 (41.45%) of 193 samples.



Classifies SNPs into Transitions and Transversions and returns a list of summarized tables in various ways

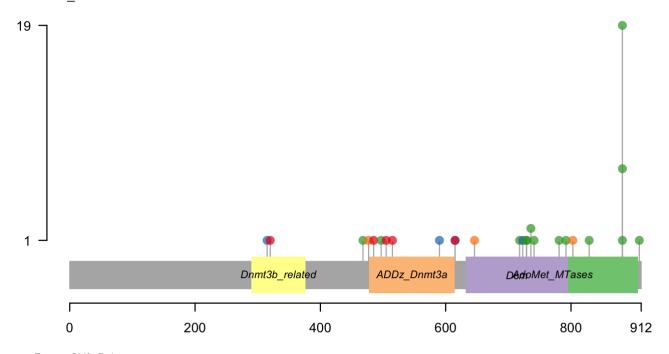
boxplot showing overall distribution of six different conversions and as a stacked barplot showing fraction of conversions in each sample.



Lollipop plots are simple and most effective way showing mutation spots on protein structure. Many oncogenes have a preferential sites which are mutated more often than any other locus. These spots are considered to be mutational hot-spots and lollipop plots can be used to display them along with rest of the mutations.

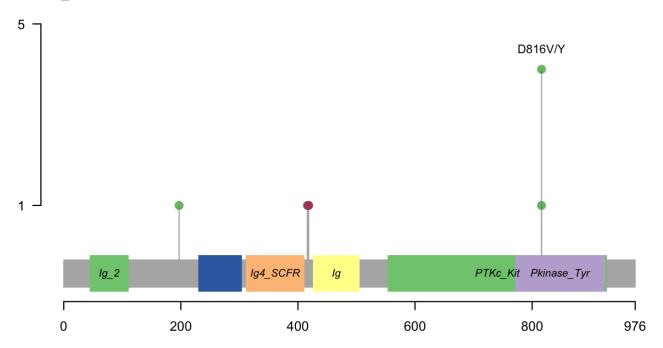
```
## HGNC refseq.ID protein.ID aa.length
## 1: DNMT3A NM_175629 NP_783328 912
## 2: DNMT3A NM_022552 NP_072046 912
## 3: DNMT3A NM_153759 NP_715640 723
```

*DNMT3A*: [Somatic Mutation Rate: 24.87%] NM\_175629



- Frame\_Shift\_Del
- Nonsense\_Mutation
- Missense\_Mutation
- Splice\_Site

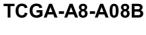
KIT: [Somatic Mutation Rate: 4.15%]
NM\_000222

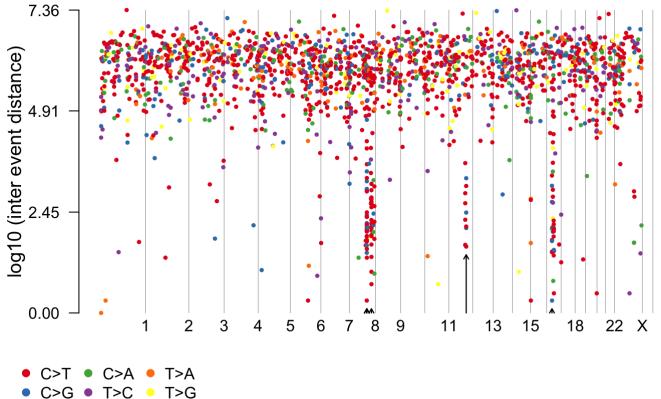


- Missense\_Mutation
- Frame\_Shift\_Del
- Frame\_Shift\_Ins
- In\_Frame\_Ins

Cancer genomes, especially solid tumors are characterized by genomic loci with localized hyper-mutations 5. Such hyper mutated genomic regions can be visualized by plotting inter variant distance on a linear genomic scale. These plots generally called rainfall plots

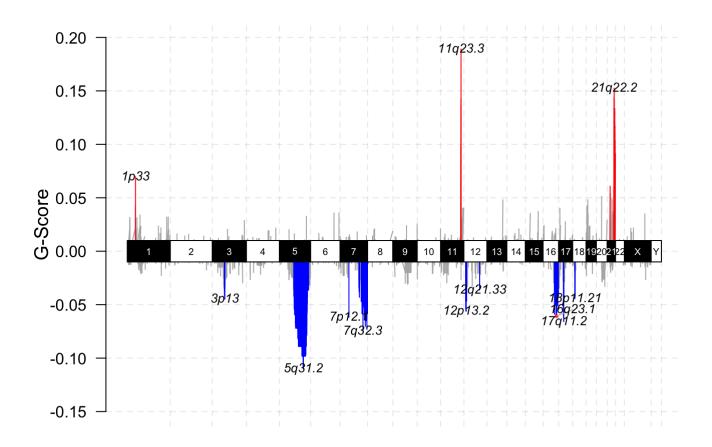
#		Chromosome	Start_Position	End_	_Position	nMuts	Avg_intermutation_dist	
##	1:	8	98129391		98133560	6	833.8000	
##	2:	8	98398603		98403536	8	704.7143	
##	3:	8	98453111		98456466	8	479.2857	
##	4:	8	124090506	:	124096810	21	315.2000	
##	5:	12	97437934		97439705	6	354.2000	
##	6 <b>:</b>	17	29332130		29336153	7	670.5000	
##		Size Tumor_	_Sample_Barcode	C>G	C>T			
##	1:	4169	TCGA-A8-A08B	4	2			
##	2:	4933	TCGA-A8-A08B	1	7			
##	3:	3355	TCGA-A8-A08B	NA	8			
##	4:	6304	TCGA-A8-A08B	1	20			
##	5:	1771	TCGA-A8-A08B	3	3			
##	6:	4023	TCGA-A8-A08B	4	3			



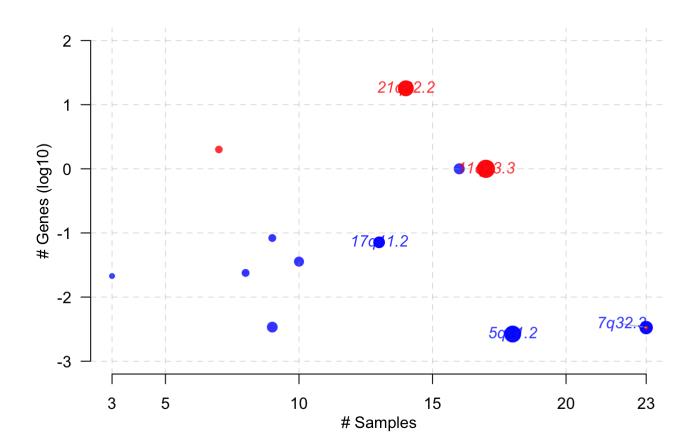


### Genome plots

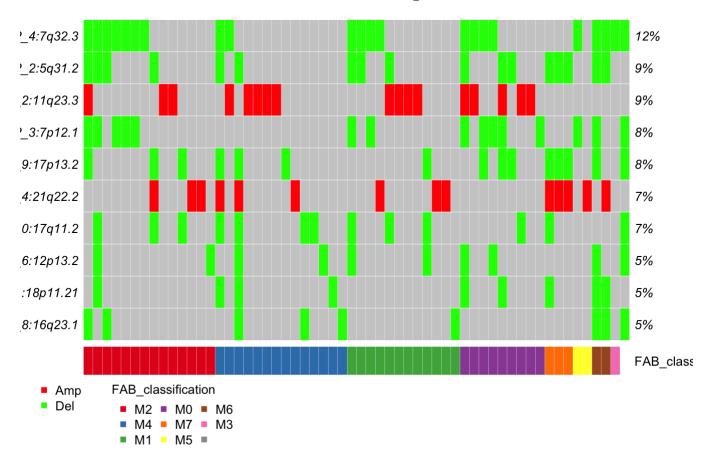
```
## An object of class GISTIC
##
             ID summary
## 1:
        Samples
                     191
  2:
                    2622
##
         nGenes
  3: cytoBands
                      16
                     388
            Amp
  5:
                   26481
##
            Del
## 6:
                   26869
          total
```



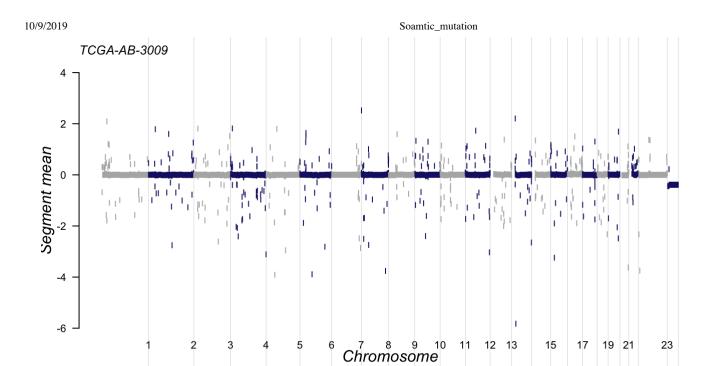
### **Bubble plot**



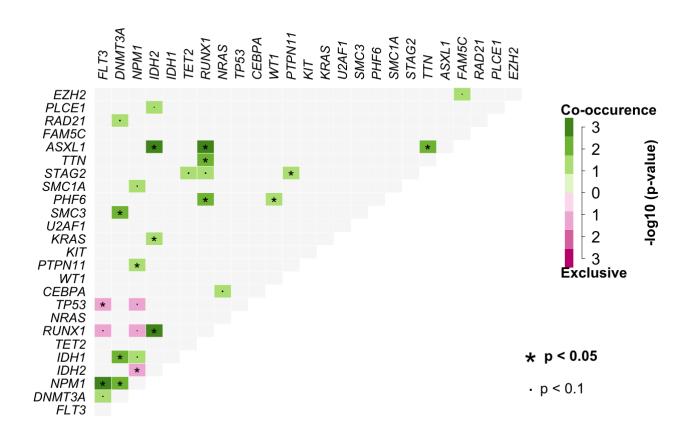
Oncoplot sorted according to FAB classification



## NULL



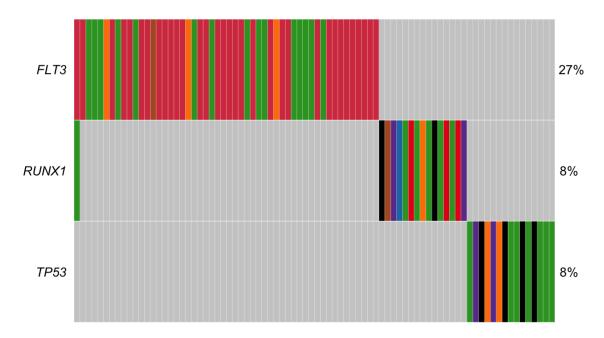
Many disease causing genes in cancer are co-occurring or show strong exclusiveness in their mutation pattern. Such mutually exclusive or co-occurring set of genes were detected by pair-wise Fisher's Exact test



```
## Checking for Gene sets
## ------
## genes: 5
## geneset size: 3
## 10 combinations
```

```
##
  $pairs
##
                            pValue oddsRatio
        gene1
               gene2
                                               00 11 01 10
                                                                          Event
##
    1:
        ASXL1
               RUNX1 0.0001541586 55.215541 176
                                                    4
                                                     12
                                                          1
                                                                  Co Occurence
    2:
                                                    7
##
         IDH2
               RUNX1 0.0002809928
                                    9.590877 164
                                                       9
                                                         13
                                                                  Co Occurence
##
    3:
         IDH2
               ASXL1 0.0004030636 41.077327 172
                                                         16
                                                                  Co Occurence
##
    4:
         FLT3
                NPM1 0.0009929836
                                     3.763161 125 17 16
                                                                  Co_Occurence
##
    5:
         SMC3 DNMT3A 0.0010451985 20.177713 144
                                                                  Co Occurence
                                    3.733141 128 16 17
##
    6:
       DNMT3A
                NPM1 0.0014582861
                                                                  Co_Occurence
##
    7:
       DNMT3A
                IDH1 0.0033807043
                                     4.462201 137 10
                                                         38
                                                                  Co_Occurence
##
    8:
        ASXL1
                  TTN 0.0077607658 28.459418 184
                                                    2
                                                       4
                                                          3
                                                                  Co_Occurence
               RUNX1 0.0081059811 12.967042 174
##
    9:
         PHF6
                                                    3 13
                                                          3
                                                                  Co Occurence
## 10:
               RUNX1 0.0081059811 12.967042 174
                                                   3 13
          TTN
                                                          3
                                                                  Co_Occurence
                                    0.000000 126 NA 15 52 Mutually_Exclusive
## 11:
         FLT3
                TP53 0.0125113481
##
  12:
        STAG2 PTPN11 0.0263964643 12.391225 180
                                                    2
                                                       7
                                                          4
                                                                  Co Occurence
##
  13:
         IDH2
                NPM1 0.0277733049
                                    0.000000 140 NA 33 20 Mutually Exclusive
## 14:
         IDH2
                KRAS 0.0382620610
                                    5.832674 168
                                                       5
                                                         17
                                                                  Co Occurence
## 15:
          WT1
                PHF6 0.0463612252
                                    8.623360 177
                                                    2
                                                       4
                                                         10
                                                                  Co_Occurence
## 16:
         NPM1 PTPN11 0.0479288542
                                    4.230142 155
                                                    4
                                                       5
                                                         29
                                                                  Co_Occurence
##
               PLCE1 0.0540565743
                                    9.280043 171
  17:
         IDH2
                                                   2
                                                       2
                                                         18
                                                                  Co_Occurence
## 18: DNMT3A
                FLT3 0.0630630121 1.951476 111 18 34 30
                                                                  Co Occurence
## 19:
         NPM1
               SMC1A 0.0635083207
                                    5.167266 157
                                                    3
                                                       3 30
                                                                  Co_Occurence
##
  20:
                NRAS 0.0678045968
                                    4.149259 168
        CEBPA
                                                    3 12 10
                                                                  Co Occurence
  21:
##
        RUNX1
                FLT3 0.0740850163
                                    0.165692 126
                                                    1 51
                                                         15 Mutually Exclusive
## 22:
         EZH2
               FAM5C 0.0761095136 21.701827 186
                                                   1
                                                       4
                                                          2
                                                                  Co Occurence
## 23:
         TP53
                NPM1 0.0785739379
                                    0.000000 145 NA 33 15 Mutually_Exclusive
## 24:
         NPM1
               RUNX1 0.0787933378
                                    0.000000 144 NA 16 33 Mutually Exclusive
## 25:
        RUNX1
               STAG2 0.0795738073
                                    6.066792 173
                                                    2
                                                       4 14
                                                                  Co Occurence
##
  26:
         TET2
               STAG2 0.0888875052
                                    5.638415 172
                                                   2
                                                       4 15
                                                                  Co Occurence
                NPM1 0.0914621351
##
  27:
         IDH1
                                    2.722302 148
                                                    6 27 12
                                                                  Co Occurence
##
  28:
        RAD21 DNMT3A 0.0993846041
                                    4.719039 143
                                                   3 45
                                                                  Co Occurence
##
        gene1
               gene2
                            pValue oddsRatio 00 11 01 10
                                                                          Event
##
## $gene sets
## Empty data.table (0 rows and 2 cols): gene set,pvalue
```

# Altered in 82 (42.49%) of 193 samples.



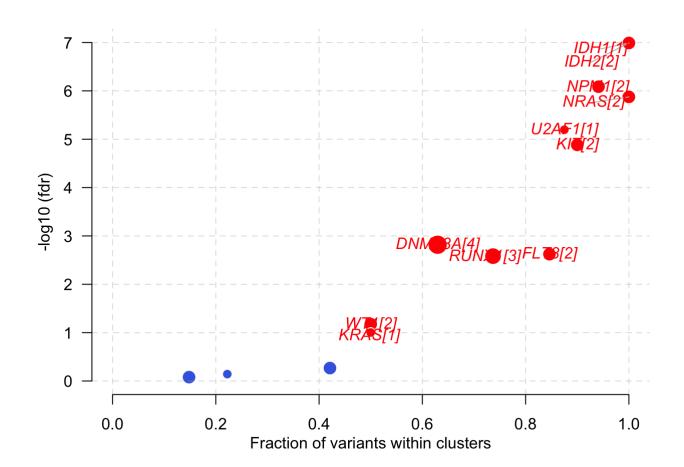
- In\_Frame\_Ins
- Splice\_Site
- In Frame Del
- Nonsense\_Mutation
- Missense\_MutationFrame\_Shift\_Ins
  - Frame Shift Del
  - Multi Hit

Detecting cancer driver genes based on positional clustering

	Sounde_induction	
##		
		0 %
	===	4%
	=====	9%
	=======	13%
	=======================================	17%
	=======================================	22%
	=======================================	26%
	=======================================	30%
	=======================================	35%
	=======================================	39%
	=======================================	43%
	=======================================	48%
	=======================================	52%
	=======================================	57%
	=======================================	61%
		65%
		70%
		74%
		78%
		83%
		87%
		91%
		96%
		100%

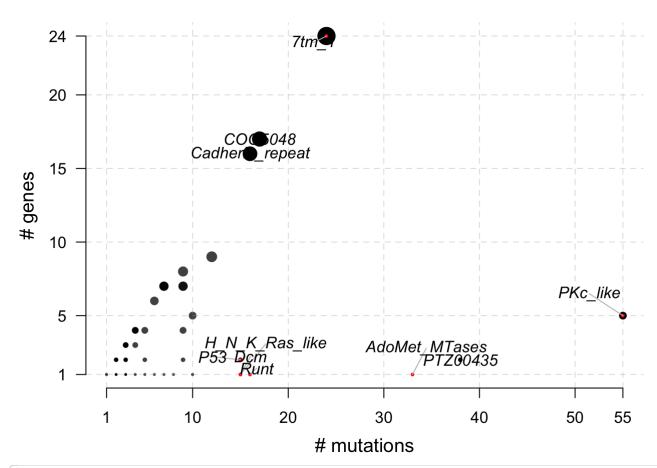
Hugo_Sym	Frame_Shift_Del	Frame_Shift_Ins	In_Frame_Del	In_Frame_Ins	Missense_Muta
<fctr></fctr>	<int></int>	<int></int>	<int></int>	<int></int>	

Hugo_Sym <fctr></fctr>	Frame_Shift_Del <int></int>	Frame_Shift_Ins <int></int>	In_Frame_Del <int></int>	In_Frame_Ins <int></int>	Missense_Muta
IDH1	0	0	0	0	
IDH2	0	0	0	0	
NPM1	0	33	0	0	
NRAS	0	0	0	0	
U2AF1	0	0	0	0	
KIT	1	1	0	1	
6 rows   1-6 of 19	9 columns				



### Adding and summarizing pfam domains

```
## Warning in pfamDomains(maf = laml, AACol = "Protein_Change", top = 10):
## Removed 50 mutations for which AA position was not available
```



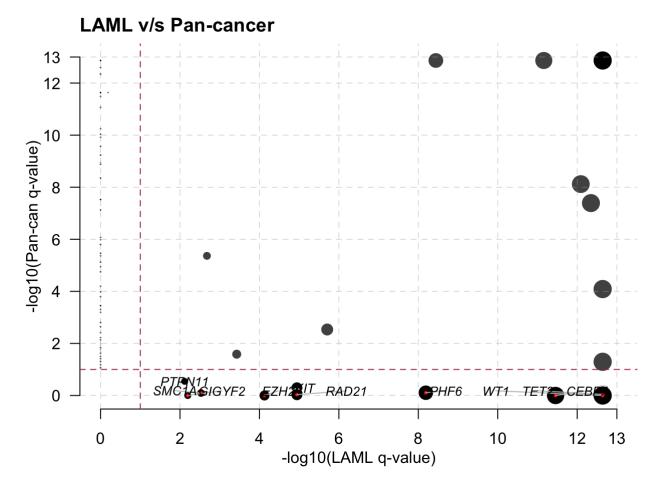
HGNC <chr></chr>		Variant_Classification <fctr></fctr>	N d <int×< th=""><th>total :dbl&gt;</th><th></th><th><b>DomainLabel</b> <chr></chr></th></int×<>	total :dbl>		<b>DomainLabel</b> <chr></chr>
DNMT3A	882	Missense_Mutation	27	54	0.50000000	AdoMet_MTases
IDH1	132	Missense_Mutation	18	18	1.00000000	PTZ00435
IDH2	140	Missense_Mutation	17	20	0.85000000	PTZ00435
FLT3	835	Missense_Mutation	14	52	0.26923077	PKc_like
FLT3	599	In_Frame_Ins	10	52	0.19230769	PKc_like
U2AF1	34	Missense_Mutation	7	8	0.87500000	zf-CCCH
NRAS	61	Missense_Mutation	6	15	0.40000000	H_N_K_Ras_like
KIT	816	Missense_Mutation	5	10	0.50000000	PTKc_Kit
NRAS	13	Missense_Mutation	5	15	0.33333333	H_N_K_Ras_like
FLT3	601	In_Frame_Ins	4	52	0.07692308	PKc_like
1-10 of 1,51	6 rows			Prev	rious <b>1</b> 2	3 4 5 6 152 Next

DomainLabel	nMuts	nGenes
<chr></chr>	<int></int>	<int></int>

DomainLabel <chr></chr>	nMuts <int></int>	nGenes <int></int>
PKc_like	55	5
PTZ00435	38	2
AdoMet_MTases	33	1
7tm_1	24	24
COG5048	17	17
Cadherin_repeat	16	16
Runt	16	1
Dcm	15	1
H_N_K_Ras_like	15	1
P53	15	2
1-10 of 503 rows	Previous <b>1</b> 2 3 4 5 6 5	1 Next

#### Pan-Cancer comparison

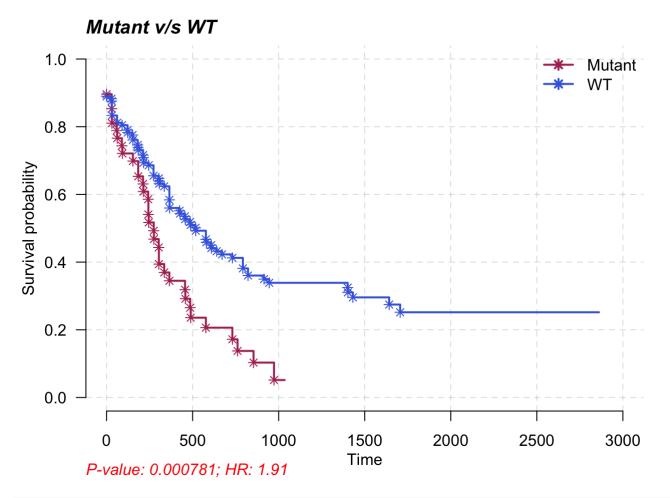
```
##
         gene pancan
                                 q nMut log_q_pancan
                                                          log_q
        CEBPA 1.000 3.500301e-12
                                          0.00000000 11.455895
##
                                     13
    2:
                                                       4.127055
##
         EZH2
               1.000 7.463546e-05
                                      3
                                          0.00000000
##
    3: GIGYF2
              1.000 6.378338e-03
                                      2
                                          0.00000000
                                                       2.195292
          KIT
               0.509 1.137517e-05
##
    4:
                                      8
                                          0.29328222
                                                       4.944042
##
    5:
         PHF6
              0.783 6.457555e-09
                                      6
                                          0.10623824
                                                       8.189932
    6: PTPN11
               0.286 7.664584e-03
                                      9
##
                                          0.54363397
                                                       2.115511
##
        RAD21
              0.929 1.137517e-05
                                      5
                                          0.03198429
                                                       4.944042
##
        SMC1A
               0.801 2.961696e-03
                                      6
                                          0.09636748
                                                       2.528460
    9:
         TET2
               0.907 2.281625e-13
                                     17
                                          0.04239271 12.641756
##
## 10:
          WT1
               1.000 2.281625e-13
                                     12
                                           0.00000000 12.641756
```



gene <chr></chr>	pancan <dbl></dbl>	<b>q</b> <dbl></dbl>	nMut <int></int>		log_q_p	ancan <dbl></dbl>	log_q <dbl></dbl>
ACVR1B	6.11e-02	1.000000e+00	0		1.213	95879	0.0000000
AKT1	2.68e-10	1.000000e+00	0		9.571	86521	0.0000000
APC	1.36e-13	1.000000e+00	0		12.866	46109	0.0000000
APOL2	7.96e-03	1.000000e+00	0		2.099	08693	0.0000000
ARHGAP35	2.32e-12	1.000000e+00	1		11.634	51202	0.0000000
ARID1A	2.32e-12	1.000000e+00	1		11.634	51202	0.0000000
ARID2	1.03e-06	1.000000e+00	1		5.987	'16278	0.0000000
ASXL1	4.33e-06	2.098493e-03	5		5.363	51210	2.6780925
ASXL2	8.18e-02	1.000000e+00	1		1.087	24670	0.0000000
ATM	5.85e-10	1.000000e+00	0		9.232	84413	0.0000000
1-10 of 124 rows			Previous	1	2 3	4 5	6 13 Next

## Survival analysis

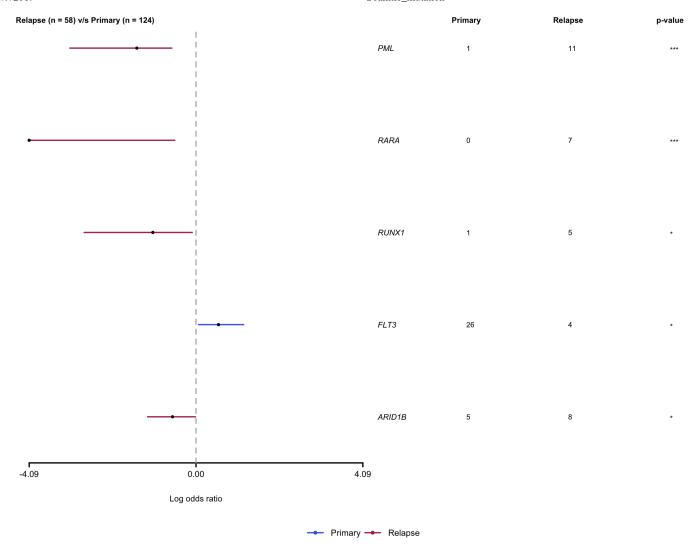
```
## DNMT3A
## 48
## Group medianTime N
## 1: Mutant 243 48
## 2: WT 366 145
```

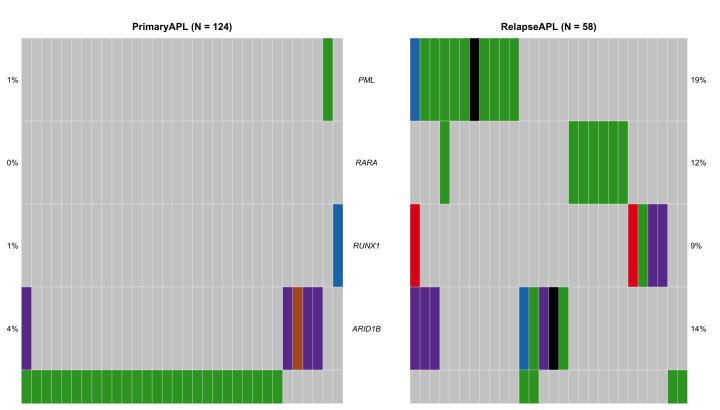


```
## -Reading
## -Validating
## --Non MAF specific values in Variant_Classification column:
## ITD
## -Silent variants: 45
## -Summarizing
## -Processing clinical data
## --Missing clinical data
## -Finished in 0.085s elapsed (0.153s cpu)
```

```
## -Reading
## -Validating
## --Non MAF specific values in Variant_Classification column:
## ITD
## -Silent variants: 19
## -Summarizing
## -Processing clinical data
## --Missing clinical data
## --Finished in 0.073s elapsed (0.127s cpu)
```

```
## $results
##
      Hugo_Symbol Primary Relapse
                                           pval
                                                         or
                                                                  ci.up
## 1:
                         1
                                11 1.529935e-05 0.03537381
              PML
                                                              0.2552937
## 2:
                         0
                                 7 2.574810e-04 0.00000000
                                                              0.3006159
             RARA
                         1
## 3:
                                 5 1.310500e-02 0.08740567
            RUNX1
                                                              0.8076265
                                 4 1.812779e-02 3.56086275
## 4:
                        26
                                                             14.7701728
             FLT3
                        5
                                 8 2.758396e-02 0.26480490
## 5:
           ARID1B
                                                              0.9698686
## 6:
              WT1
                        20
                                14 2.229087e-01 0.60619329
                                                              1.4223101
## 7:
             KRAS
                         6
                                 1 4.334067e-01 2.88486293 135.5393108
                        15
                                 4 4.353567e-01 1.85209500
## 8:
             NRAS
                                                              8.0373994
                                 4 7.457274e-01 0.80869223
## 9:
           ARID1A
                        7
                                                              3.9297309
##
           ci.low
                        adjPval
## 1: 0.000806034 0.0001376942
## 2: 0.00000000 0.0011586643
## 3: 0.001813280 0.0393149868
## 4: 1.149009169 0.0407875250
## 5: 0.064804160 0.0496511201
## 6: 0.263440988 0.3343630535
## 7: 0.337679367 0.4897762916
## 8: 0.553883512 0.4897762916
## 9: 0.195710173 0.7457273717
##
## $SampleSummary
       Cohort SampleSize
##
## 1: Primary
                      124
## 2: Relapse
                       58
```





FLT3

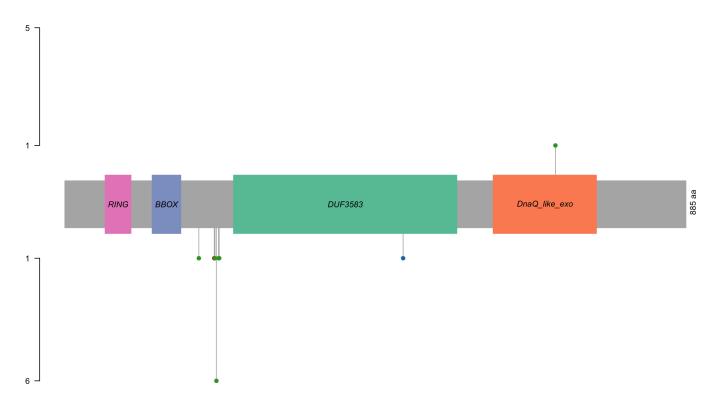




Missense\_Mutation
 In\_Frame\_Del
 Frame\_Shift\_Ins
 Frame\_Shift\_Del
 Multi\_Hit
 Nonsense\_Mutation

##		HGNC	refseq.ID	protein.ID	aa.length
##	1:	PML	NM_033238	NP_150241	882
##	2:	PML	NM_002675	NP_002666	633
##	3:	PML	NM_033249	NP_150252	585
##	4:	PML	NM_033247	NP_150250	435
##	5:	PML	NM_033239	NP_150242	829
##	6:	PML	NM_033250	NP_150253	781
##	7:	PML	NM_033240	NP_150243	611
##	8:	PML	NM_033244	NP_150247	560
##	9:	PML	NM_033246	NP_150249	423
##		HGNC	refseq.ID	<pre>protein.ID</pre>	aa.length
##	1:	PML	NM_033238	NP_150241	882
##	2:	PML	NM_002675	NP_002666	633
##	3:	PML	NM_033249	NP_150252	585
##	4:	PML	NM_033247	NP_150250	435
##	5:	PML	NM_033239	NP_150242	829
##	6:	PML	NM_033250	NP_150253	781
##	7:	PML	NM_033240	NP_150243	611
##	8:	PML	NM_033244	NP_150247	560
##	9:	PML	NM_033246	NP_150249	423

Primary [0.81%; N = 124] PML: NM\_033238

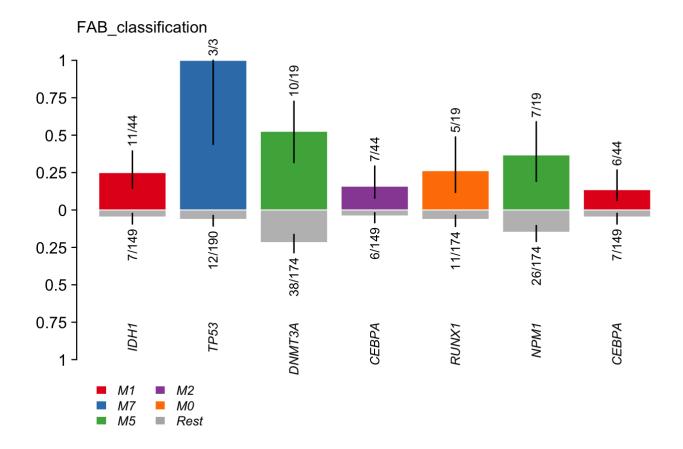


Relapse [18.97%; N = 58]

- Missense\_Mutation
- Nonsense\_Mutation
- Frame\_Shift\_Del

Hugo_Sym <chr></chr>	Gro <chr></chr>	Gro <chr></chr>	n_mutated_group1 <chr></chr>	n_mutated_group2 <chr></chr>	<b>p_value</b> <dbl></dbl>	<b>OR</b> <dbl></dbl>	OR
IDH1	M1	Rest	11 of 44	7 of 149	0.0002597371	0	0.392
TP53	M7	Rest	3 of 3	12 of 190	0.0003857187	0	0.13
DNMT3A	M5	Rest	10 of 19	38 of 174	0.0057610493	0	0.640
CEBPA	M2	Rest	7 of 44	6 of 149	0.0117352110	0	0.687
RUNX1	M0	Rest	5 of 19	11 of 174	0.0117436825	0	0.646
NPM1	M5	Rest	7 of 19	26 of 174	0.0248582372	0	0.834
CEBPA	M1	Rest	6 of 44	7 of 149	0.0478737468	0	0.986

7 rows



### Druggable categories

```
RNA DIRECTED DNA POLYMERASE [TP53]
 PROTEIN PHOSPHATASE [PTPN11]
 PHOSPHOLIPASE [KIT]
 EXTERNAL SIDE OF PLASMA MEMBRANE [KIT]
 CELL SURFACE [KIT]
 TRANSCRIPTION FACTOR COMPLEX [CEBPA,TP53]
 LIPID KINASE [FLT3,KIT]
HISTONE MODIFICATION [TET2,TP53]
DRUG RESISTANCE [DNMT3A,TP53]
 TRANSCRIPTION FACTOR BINDING [CEBPA, NPM1, TP53]
 TYROSINE KINASE [FLT3,KIT,NPM1,TTN]
DNA REPAIR [NPM1,SMC1A,SMC3,TP53]
SERINE THREONINE KINASE [CEBPA,FLT3,KIT,KRAS,PTPN11]
 TUMOR SUPPRESSOR [CEBPA,NPM1,PTPN11,SMC1A,SMC3]
KINASE [CEBPA,FLT3,KIT,KRAS,NPM1]
 DRUGGABLE GENOME [DNMT3A,FLT3,KIT,NPM1,PTPN11]
 CLINICALLY ACTIONABLE [CEBPA, DNMT3A, FLT3, IDH1, IDH2]
0
                                                                               16
```

# Genes

```
## Number of claimed drugs for given genes:
## Gene N
## 1: DNMT3A 7
```

Gene <chr></chr>	<pre>interaction_types <chr></chr></pre>	drug_name <chr></chr>	<pre>drug_claim_name <chr></chr></pre>
DNMT3A			N/A
DNMT3A		DAUNORUBICIN	Daunorubicin
DNMT3A		DECITABINE	Decitabine
DNMT3A		IDARUBICIN	IDARUBICIN
DNMT3A		DECITABINE	DECITABINE
DNMT3A	inhibitor	DECITABINE	CHEMBL1201129
DNMT3A	inhibitor	AZACITIDINE	CHEMBL1489

```
##
          Pathway N n_affected_genes fraction_affected
##
          RTK-RAS 85
                                     18
                                               0.21176471
    1:
                                      7
##
    2:
            Hippo 38
                                               0.18421053
    3:
            NOTCH 71
                                      6
                                               0.08450704
##
              MYC 13
                                      3
##
    4:
                                               0.23076923
                                      3
##
    5:
              WNT 68
                                               0.04411765
             TP53
                                      2
    6:
                                               0.33333333
##
                    6
                                      1
##
    7:
             NRF2 3
                                               0.33333333
    8:
             PI3K 29
                                      1
                                               0.03448276
##
    9: Cell_Cycle 15
                                      0
                                               0.0000000
##
         TGF-Beta 7
                                               0.0000000
## 10:
```

