

# In-silico identification of Prognostically Inversely Correlated miRNAs and mRNAs (PIC's) in multiple cancers

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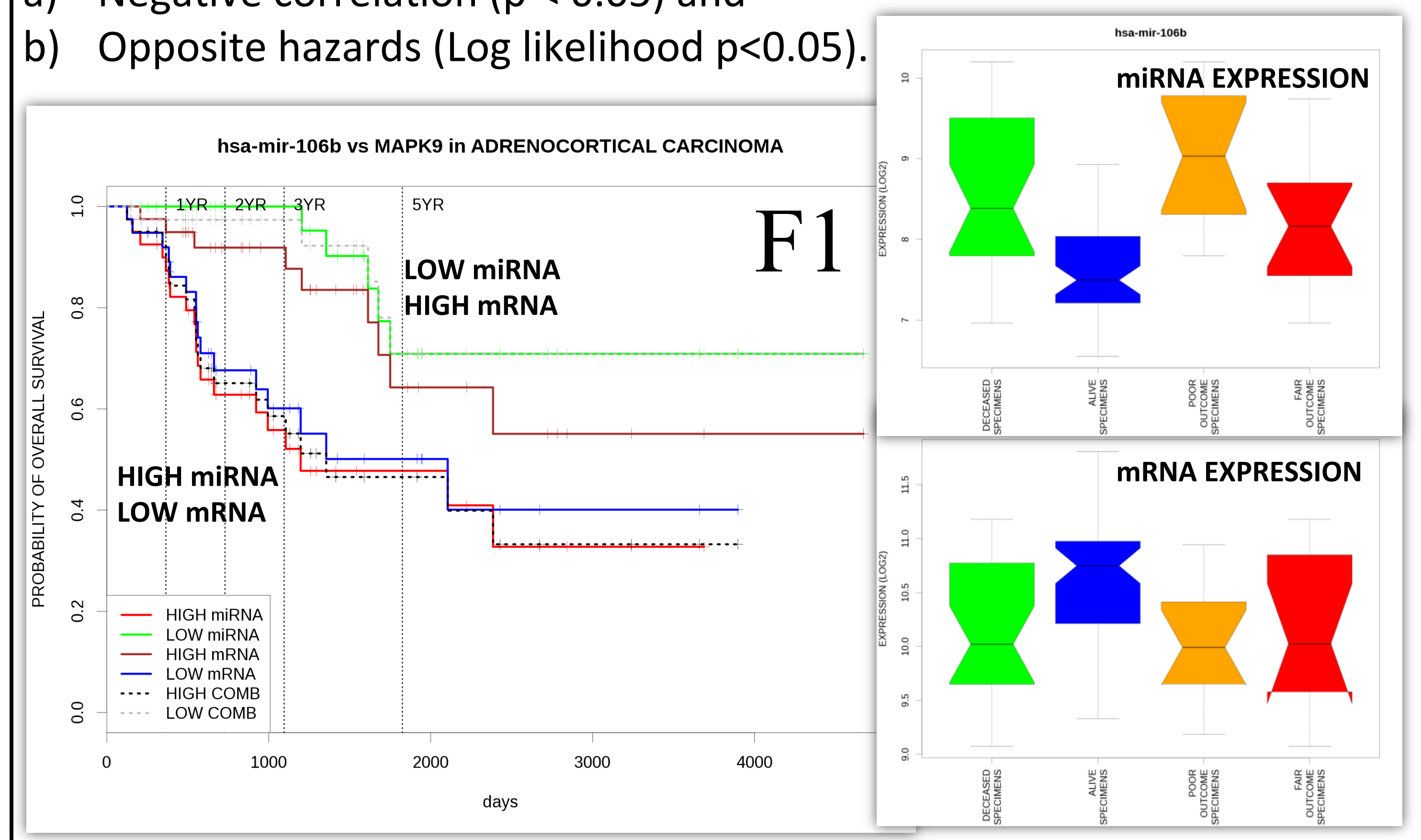
## ABSTRACT

Despite numerous methods available to identify potential mRNA targets for miRNAs, prognostic relationship of these molecules in diseases like cancers where deregulation of gene expression is a major pathogenic factor, has not yet been emphasized. We performed in-silico identification of prognostically inversely correlated miRNA - mRNA pairs (PIC's) in multiple cancers using expression data from The Cancer Genome Atlas. Partners in a PIC show inverse correlation of expression and opposite hazard implication. Using a three step approach, we identified a total of 1,253,443 PIC's from 23 cancer types, several of which have previously been shown to have a predicted or experimentally validated relationship. A maximum 375,621 PICs were identified in Lower Grade Gliomas, while a minimum 300 PICs were identified in Prostate adenocarcinoma. Four miRNA-mRNA pairs were identified as PICs in 7 different cancer types. Two miRNA-mRNA pairs were identified as PICs in 5 different cancer types where the mRNA is also a validated target of miRNA. Organ specific analysis was performed to identify PICs common to cancers from same or related tissue of origin. We have also developed a database PROGTar for hosting our analysis results. PROGTar is available freely for non-commercial use at [www.xvm145.jefferson.edu/progtar](http://www.xvm145.jefferson.edu/progtar). We believe our method and analysis results will provide a novel prognostically relevant, pan-cancer perspective to study of miRNA-mRNA interactions and miRNA target validation.

## METHODOLOGY

Detailed methodology for identification of PICs is provided in Poster 18 "PROGTar: A database of prognostically inversely correlated miRNA and Genes in multiple cancers". Briefly, For each cancer type, pair-wise correlations of miRNA and mRNA expressions were performed using sequencing data. Cox proportional hazard analysis was performed separately for miRNAs and mRNAs using clinical survival related data and expression data. Correlation and Proportional hazard results were then merged to identify miRNA-mRNA pairs which showed

- Negative correlation ( $p < 0.05$ ) and
- Opposite hazards (Log likelihood  $p < 0.05$ ).



Pairs were then ranked and annotated. We used TargetScan and miRWALK databases to annotate the pair with predicted/validated target information.

## RESULTS

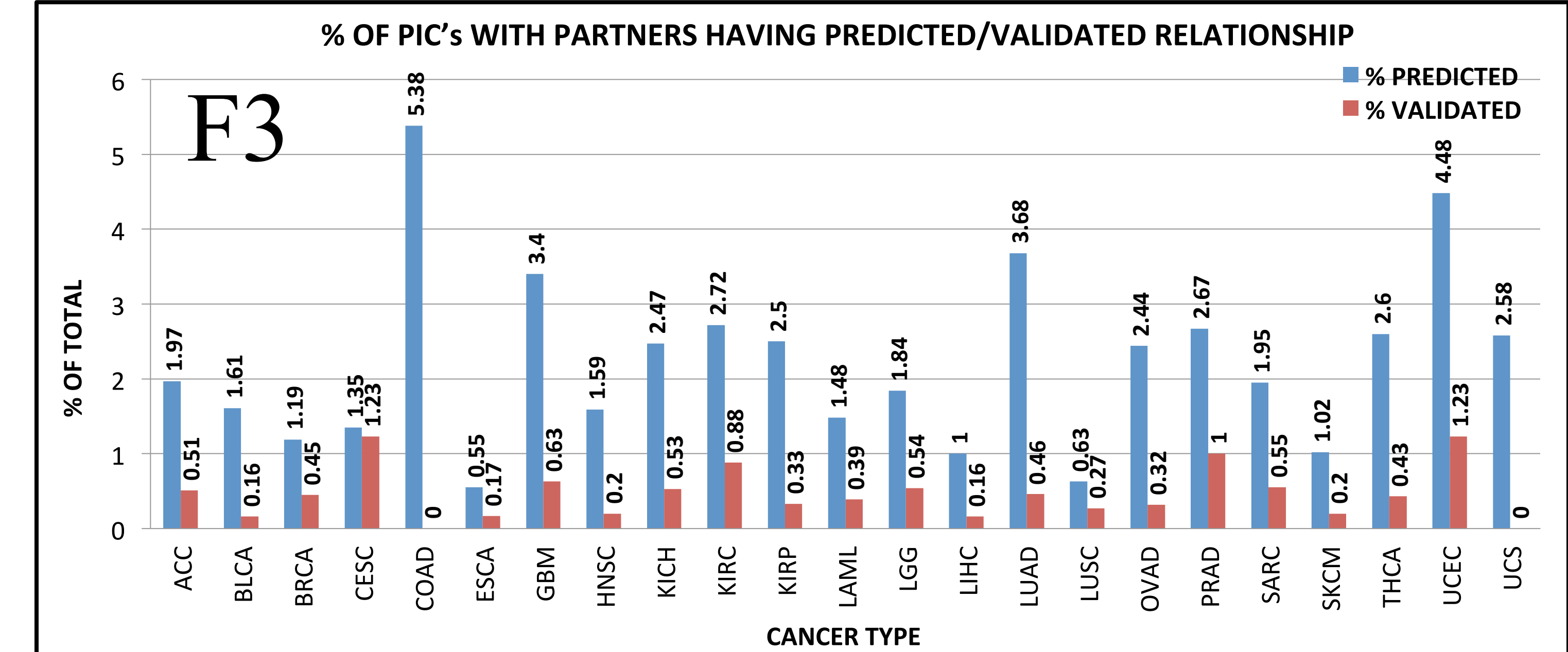
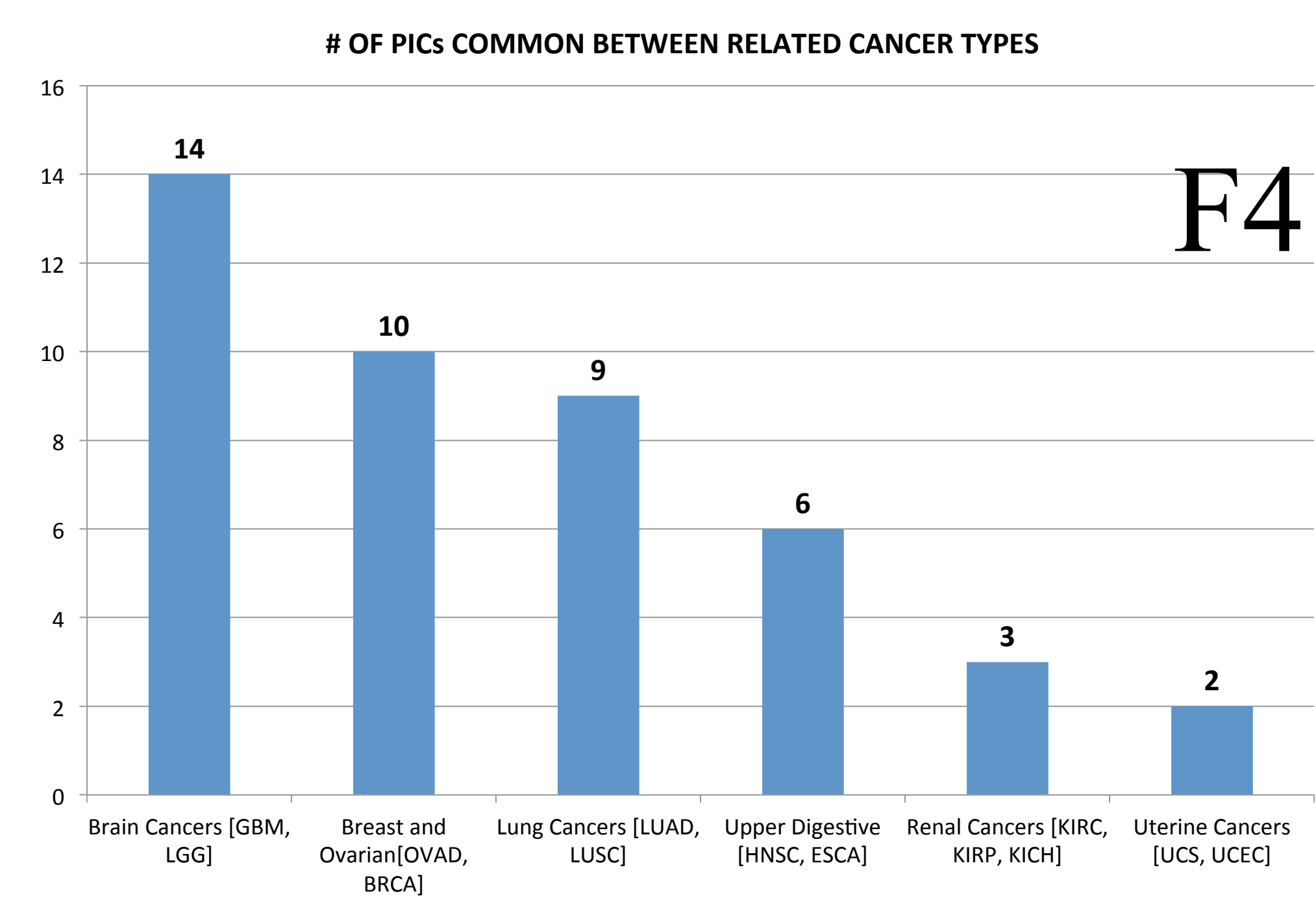
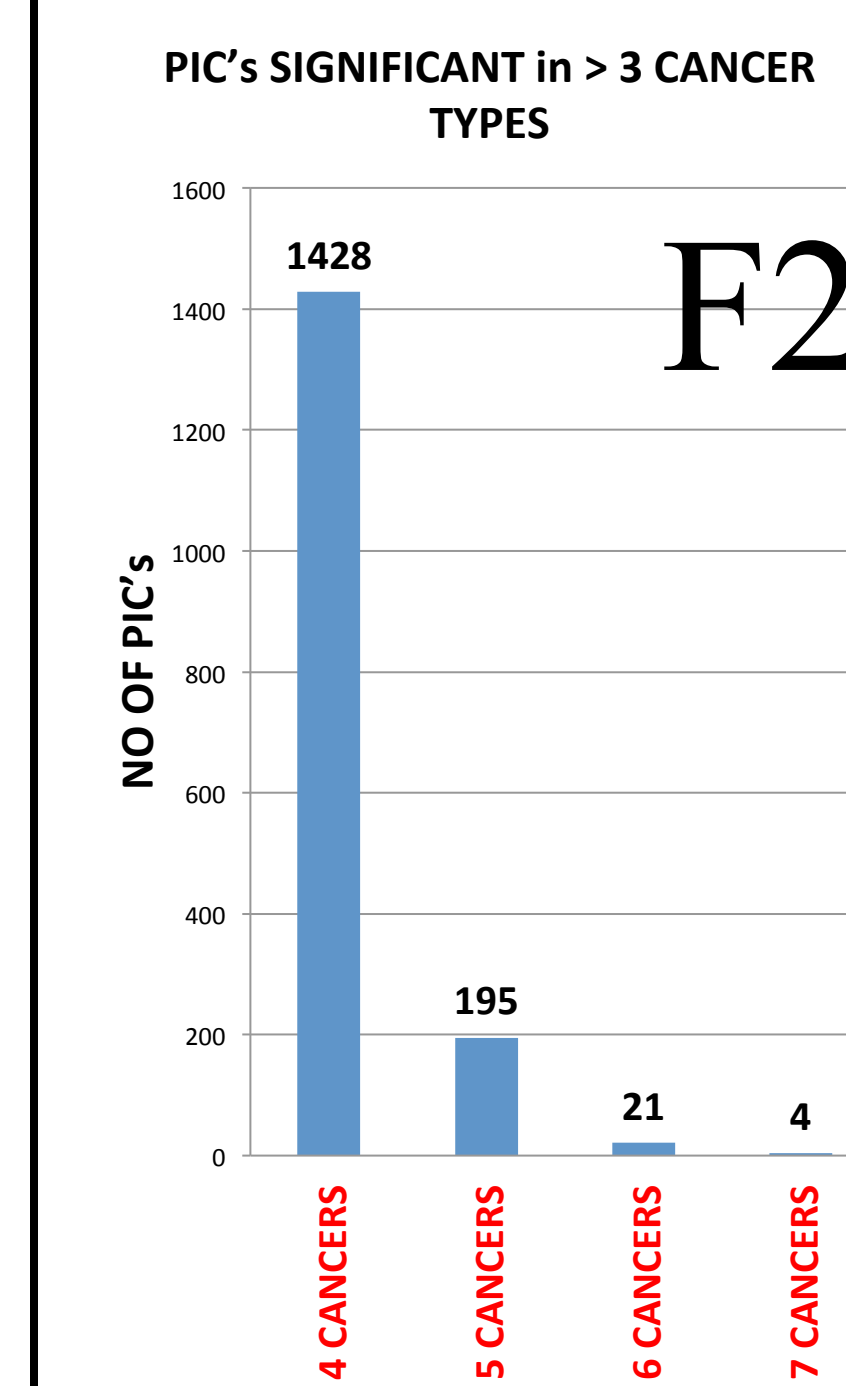
Table 1 shows the cancer types that were included in our analysis along with # of specimens available, # of PICs identified, # of unique miRNA and mRNA identifies, and # of PICs where partners have a predicted or/and validated relationship per cancer type. PICs show inverse correlation of expression between partners and opposite hazards. An example PIC with corresponding expression boxplots is shown in Figure F1. Several PICs identified in our analysis were prognostically relevant in more than one cancer type. Figure F2 shows no of PICs that were identified as significant in more than 3 cancer types.

We used TargetScan and MirWALK databases to identify how many PICs identified in our analysis have previously been shown to have predicted or/and validated relationship between partner miRNA and mRNA. Figure F3 shows for each cancer, percentage of total PICs identified for the cancer type where partners have a predicted and/or validated relationship. A maximum of 5.38% of total PICs in COAD had mRNA as predicted target for miRNA in the pair, while a maximum of 1.23% PICs in CESC had mRNA as validated target for mRNA in the pair.

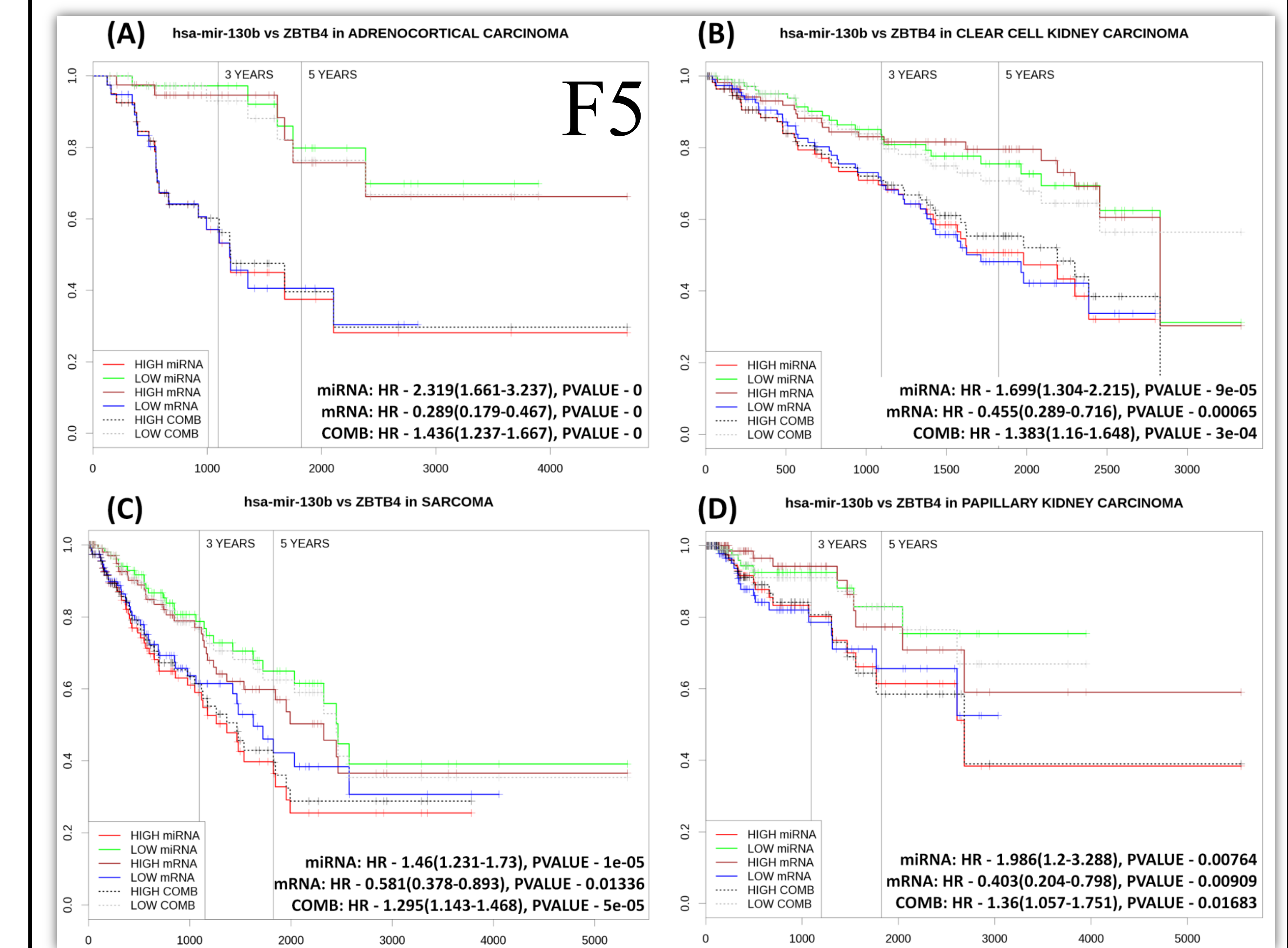
Table 1: Cancer types analyzed

| CANCER   | # SAMPLES | # PIC's | # miRNA | # mRNA | P*   | V*   | P+V |
|--|-----------|---------|---------|--------|------|------|-----|
| Adrenocortical carcinoma [ACC]   | 79        | 136463  | 143     | 5069   | 2686 | 695  | 140 |
| Bladder Urothelial Carcinoma [BLCA]                                    | 317       | 31466   | 77      | 2336   | 506  | 49   | 6   |
| Breast invasive carcinoma [BRCA]                                       | 656       | 137788  | 100     | 5168   | 1636 | 619  | 64  |
| Cervical squamous cell carcinoma and endocervical adenocarcinoma[CESC] | 281       | 17595   | 92      | 2329   | 238  | 217  | 15  |
| Colon adenocarcinoma [COAD]  | 224       | 502     | 11      | 259    | 27   | 0    | 0   |
| Esophageal carcinoma [ESCA]  | 180       | 2378    | 42      | 494    | 13   | 4    | 1   |
| Glioblastoma multiforme [GBM]  | 534       | 46068   | 57      | 3482   | 1569 | 287  | 86  |
| Head and Neck squamous cell carcinoma [HNSC]                           | 448       | 24935   | 76      | 2269   | 396  | 49   | 5   |
| Kidney Chromophobe [KICH]  | 66        | 37525   | 93      | 2494   | 925  | 198  | 35  |
| Kidney renal clear cell carcinoma [KIRC]                               | 234       | 140965  | 108     | 6888   | 3830 | 1240 | 219 |
| Kidney renal papillary cell carcinoma [KIRP]                           | 220       | 65222   | 87      | 4028   | 1630 | 213  | 66  |
| Acute Myeloid Leukemia [LAML]  | 84        | 18774   | 46      | 2860   | 278  | 74   | 15  |
| Brain Lower Grade Glioma [LGG]   | 416       | 375621  | 182     | 8169   | 6903 | 2010 | 208 |
| Liver hepatocellular carcinoma [LIHC]                                  | 293       | 7528    | 56      | 1399   | 75   | 12   | 3   |
| Lung adenocarcinoma [LUAD]   | 371       | 50828   | 68      | 3675   | 1869 | 234  | 63  |
| Lung squamous cell carcinoma [LUSC]                                    | 283       | 2557    | 45      | 630    | 16   | 7    | 0   |
| Ovarian serous cystadenocarcinoma [OVAD]                               | 300       | 3805    | 27      | 1138   | 93   | 12   | 3   |
| Prostate Adenocarcinoma [PRAD]   | 413       | 300     | 8       | 218    | 8    | 3    | 1   |
| Sarcoma [SARC]   | 242       | 54862   | 98      | 2639   | 1072 | 301  | 57  |
| Skin Cutaneous Melanoma [SKCM]   | 373       | 26203   | 59      | 3981   | 268  | 53   | 10  |
| Thyroid carcinoma [THCA]   | 476       | 16669   | 71      | 1577   | 434  | 72   | 20  |
| Uterine Corpus Endometrial Carcinoma [UCEC]                            | 143       | 2278    | 21      | 561    | 102  | 28   | 6   |
| Uterine Carcinosarcoma [UCS]   | 55        | 969     | 27      | 409    | 25   | 0    | 0   |

\* P = PREDICTED, V = VALIDATED



Since miRNAs are expressed in heavily organ specific manner, we looked into PICs common between cancers of same/related tissues of origin. We found that several PICs were common in cancers from same organ/related cancers (See Figure F4). Figure F5 shows an example PIC which is significant in 4 different cancer types where mRNA (ZBTB4) in the partner is a predicted as well as validated target of the miRNA (mir-130b).



## CONCLUSIONS

We have performed in-silico identification of Prognostically relevant interplay of miRNAs and mRNAs in multiple cancers. We have also created a web application to host results generated from our analysis. We believe the web application will be useful for the scientific community in pursuing molecules of their interest, or for identifying novel targets for hypothesis generation studies.

We also believe that our analysis results will provide a new direction to validation of miRNA target information. Results generated from our analysis may facilitate generation of novel prognostic and predictive signatures and miRNA directed therapeutics.