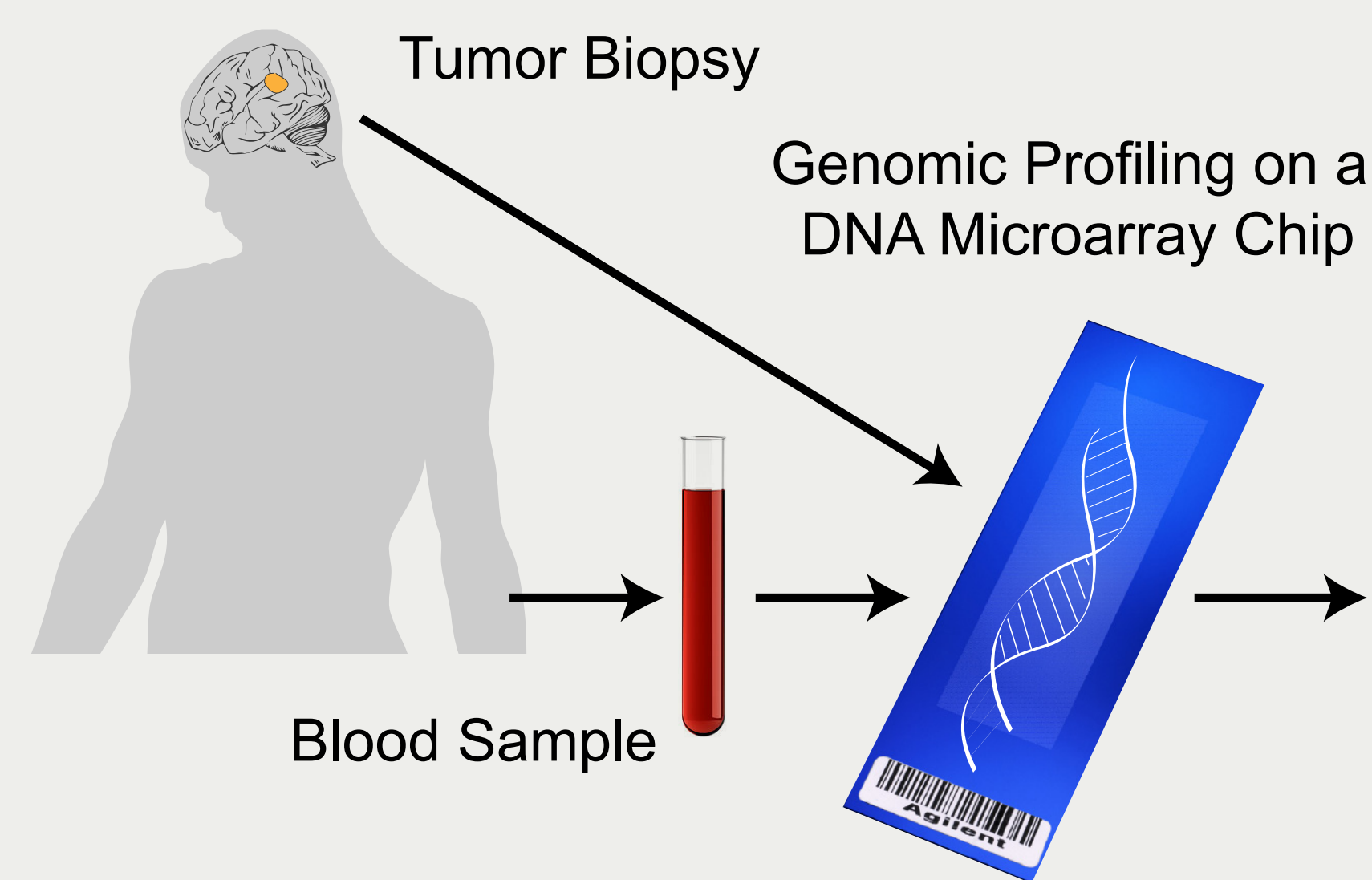


# Novel Cancer Drug Targets from Comparison of Patient-Matched Genomic Profiles

Preethi Sankaranarayanan, Benjamin O. Alpert and Orly Alter

## Introduction

The Cancer Genome Atlas (TCGA)<sup>1</sup> is a national effort to accelerate cure for cancer. This initiative chose to study Glioblastoma multiforme (GBM), a fast-growing and most common brain tumor in adults. Patients with GBM have a poor prognosis and usually survive less than 15 months following diagnosis. Currently there are no effective long-term treatments for this disease.



$$D_1 = U_1 \Sigma_1 V^T = \sum_{n=1}^N \sigma_{1,n} u_{1,n} \otimes v_n^T$$

$$D_2 = U_2 \Sigma_2 V^T = \sum_{n=1}^N \sigma_{2,n} u_{2,n} \otimes v_n^T$$

Drug Discovery and Prognosis

We describe the Generalized Singular Value Decomposition<sup>2</sup> (GSVD) comparative modeling of TCGA patient-matched GBM and DNA copy-number profiles that discovers novel cancer drug targets.

## Mathematical Method: GSVD

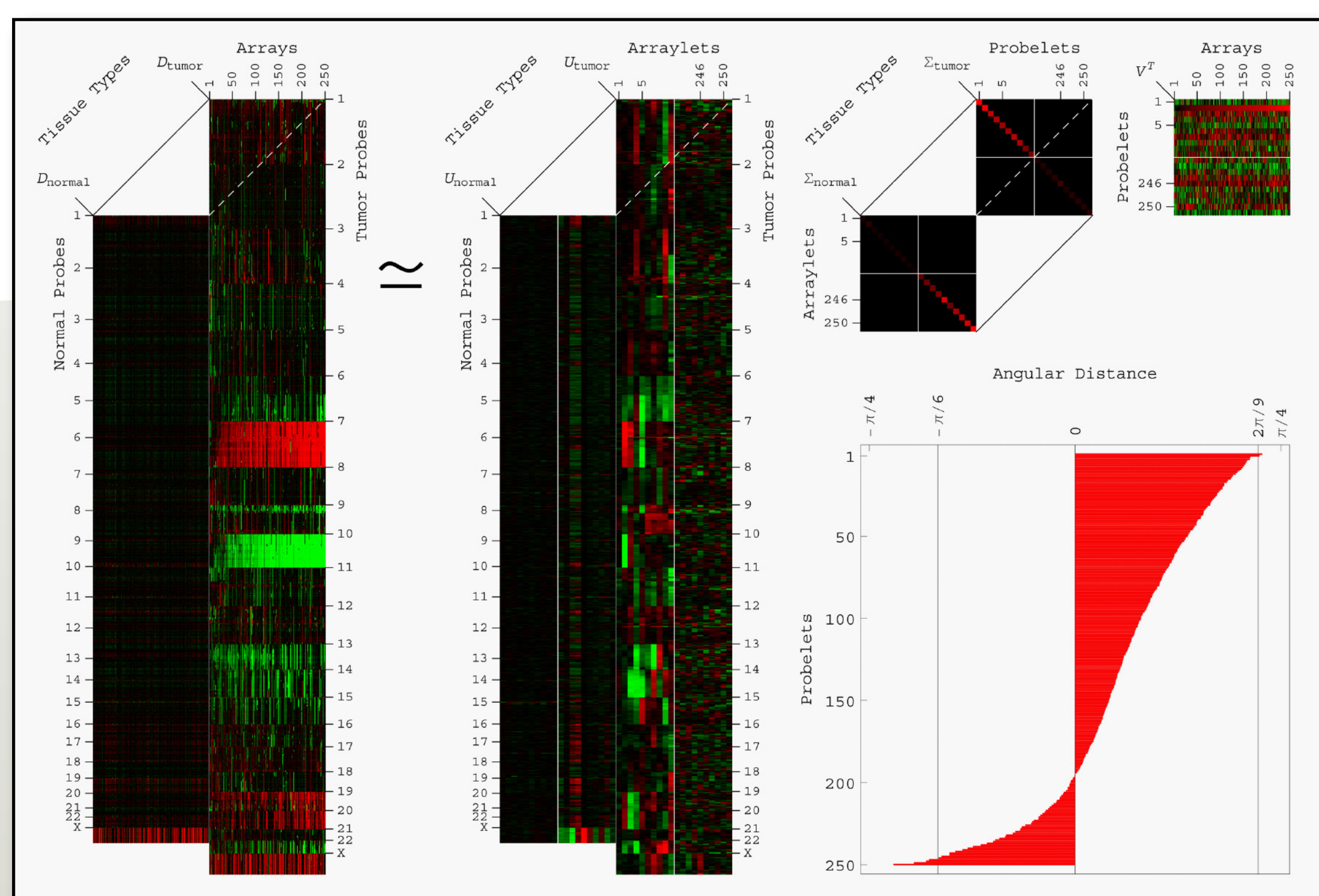


Figure 1: GSVD

## GSVD Identifies and Removes Experimental Variations

The GSVD removes from the global pattern copy-number variations that occur in the normal human genome, e.g., female-specific X chromosome amplification (Fig. 2 d-f), and experimental variations, (Fig. 3) without a-priori knowledge of these variations.

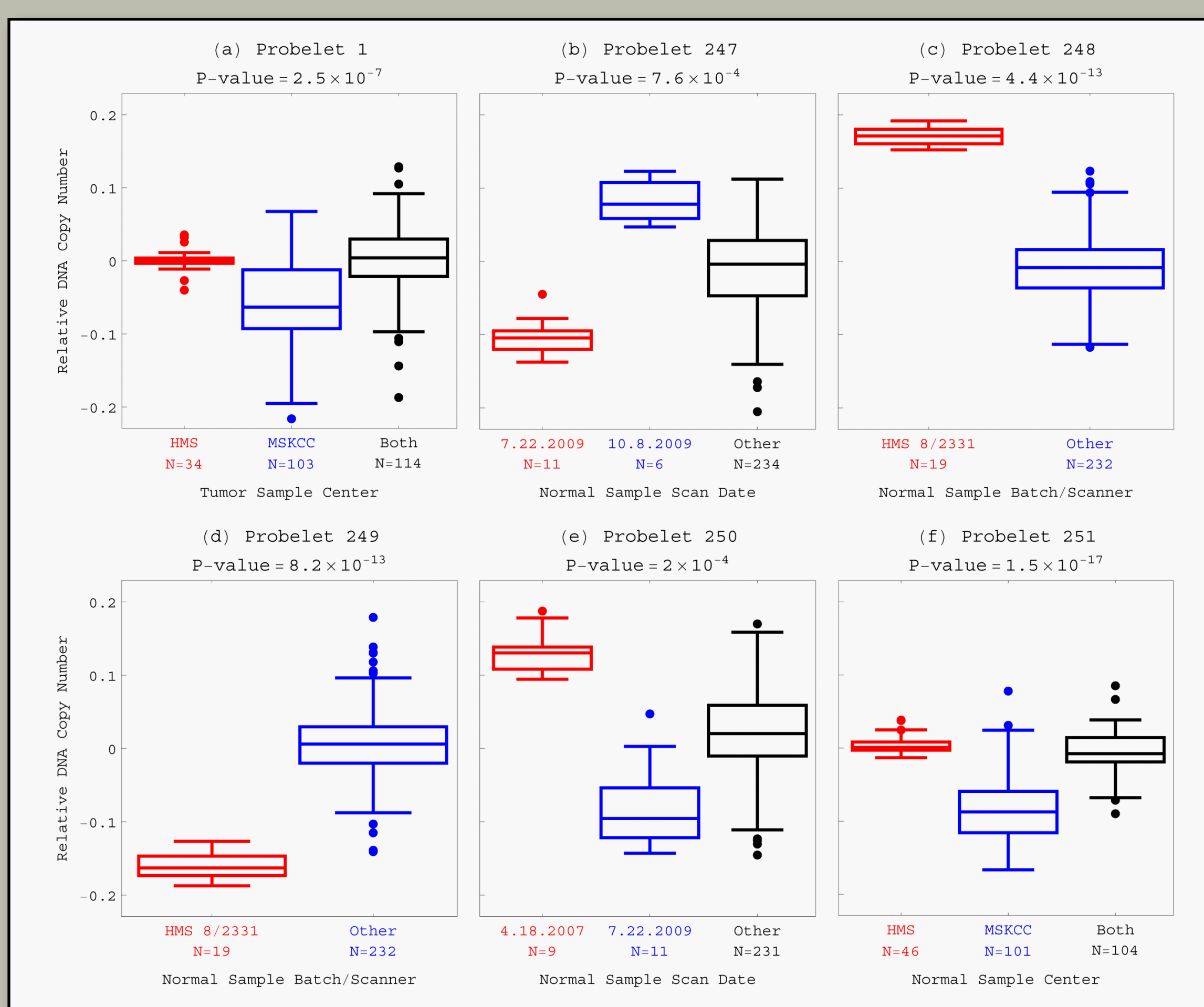


Figure 3: Boxplots visualization of the experimental variations

## GSVD Discovers Novel Drug Targets

The GSVD uncovers one global pattern of tumor-exclusive co-occurring copy-number alterations (CNAs) that is correlated, possibly coordinated, with GBM survival and response to chemotherapy (Fig. 2 a-c, Fig. 4).

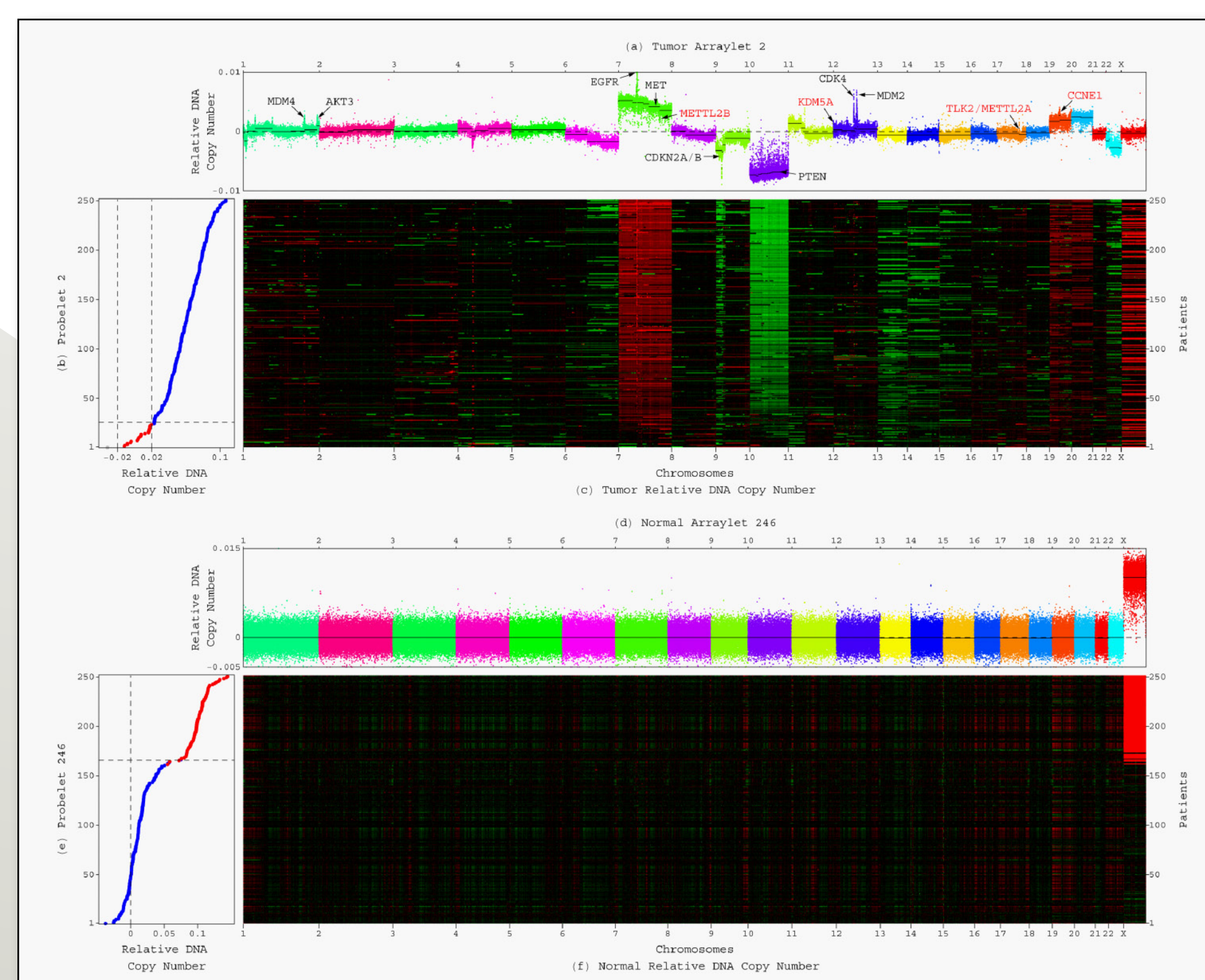


Figure 2: Global patterns of CNAs revealed by GSVD

- The pattern reveals novel CNAs including the cell cycle-regulated serine/threonine kinase encoding *TLK2*, the cyclin E1-encoding *CCNE1* which has been linked with many cancers but not GBM, and the Rb-binding protein-encoding *KDM5A* which has been recently implicated in cancer drug tolerance.

- Amplification of *TLK2*, which encodes for a biochemically putative drug target, has been correlated with overexpression in several other cancers.<sup>3,4</sup> The Kaplan-Meier<sup>5</sup> median survival time with *TLK2/METTLL2A* amplification is 5 months longer than that for the remaining patients, suggesting that drug-targeting the kinase that *TLK2* encodes may affect not only the pathogenesis but also the prognosis of GBM<sup>6,7</sup>.

## Acknowledgements

This research was supported by the Utah Science Technology and Research (USTAR) Initiative, National Human Genome Research Institute R01 Grant HG-004302 and National Science Foundation CAREER Award DMS-0847173.

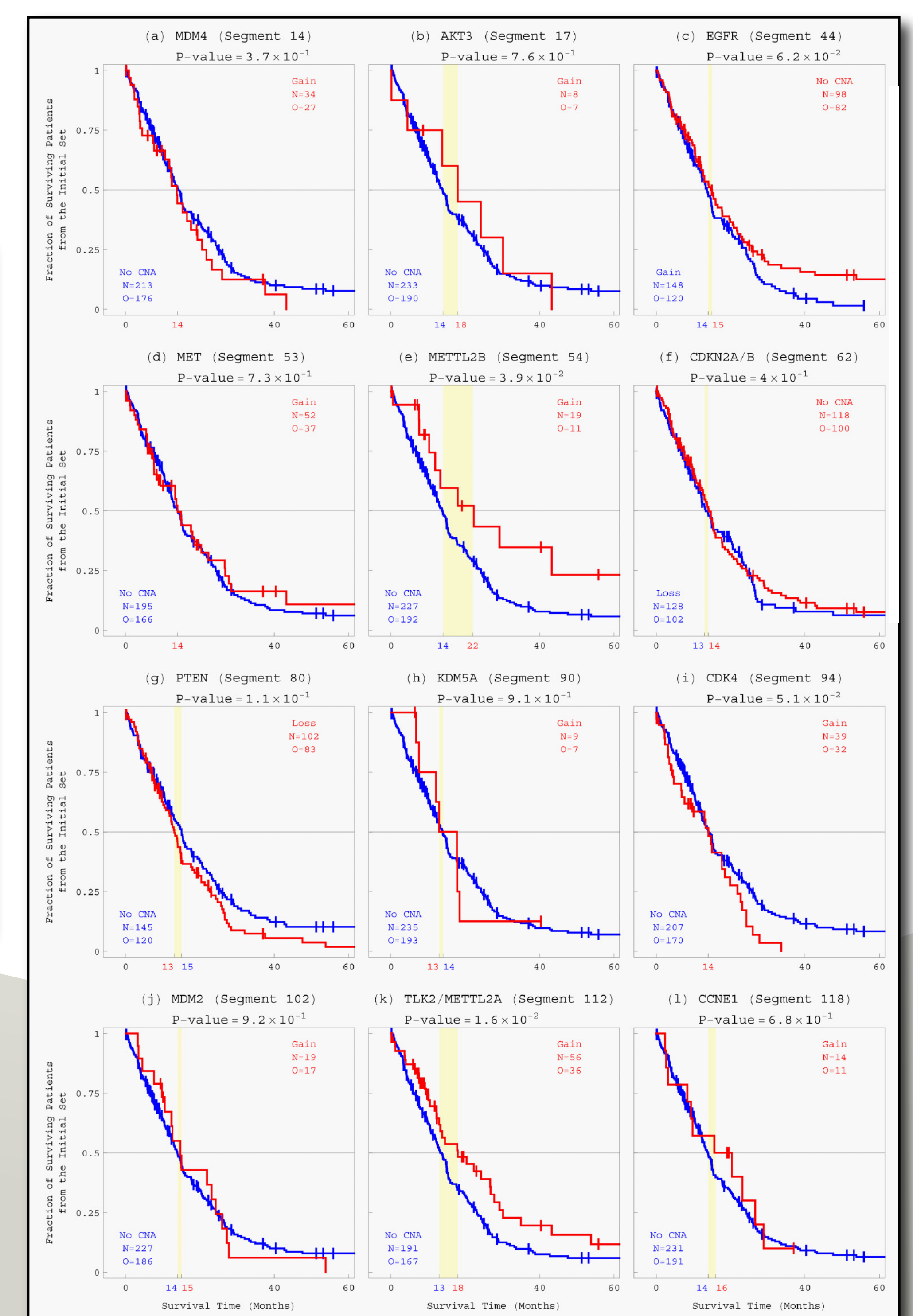


Figure 4: Kaplan-Meier survival curves

## Conclusion

The global pattern revealed by GSVD includes most known GBM-associated changes in chromosome numbers and focal CNAs and uncovers several previously unreported CNAs, including the biochemically putative drug target-encoding *TLK2*.

## References

- TCGA Research Network (2008), Nature 455: 1061-1068.
- Alter, Brown & Botstein (2003), PNAS USA 100: 3351-3356.
- Heidenblad et al. (2005), Oncogene 24: 1794-1801.
- Wang et al. (2006), Cancer Res 66: 6050-6062.
- Kaplan & Meier (1958), J Amer Statist Assn 53: 457-481.
- Alpert, Sankaranarayanan, Lee & Alter (2011), World DNA Day, China.
- Lee, Alpert, Sankaranarayanan & Alter, under review

