Uncertainty Quantification in the Radiogenomics modeling of EGFR Amplification in Glioblastoma

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Supplemental Table S1: Patient demographics for the 25 untreated high-grade glioma tumors in the training set. Patients labeled A through Y. M=male, F=female. Patient L on histology was diagnosed as Grade III Anaplastic Astrocytoma, although molecular features were consistent with Glioblastoma (e.g., EGFR amplification). NA = not available. Wt = wild type. aCGH = array comparative genomic hybridization; WES = whole exome sequencing

| Patient | Туре | Pathology | IDH.status | Sequenced |
|---------|------------------------|-----------|------------|-----------|
| А | Glioblastoma | primary | NA | aCGH |
| В | Glioblastoma | primary | NA | aCGH |
| С | Glioblastoma | primary | NA | aCGH |
| D | Glioblastoma | primary | NA | aCGH |
| E | Glioblastoma | primary | NA | aCGH |
| F | Glioblastoma | primary | NA | aCGH |
| G | Glioblastoma | primary | NA | aCGH |
| Н | Glioblastoma | primary | NA | aCGH |
| I | Glioblastoma | primary | NA | aCGH |
| J | Glioblastoma | primary | NA | aCGH |
| К | Glioblastoma | primary | NA | aCGH |
| L | Anaplastic Astrocytoma | primary | NA | aCGH |
| M | Glioblastoma | primary | NA | aCGH |
| N | Glioblastoma | primary | wt | WES |

| 0 | Glioblastoma | primary | wt | WES |
|---|--------------|---------|-------------|------|
| Р | Glioblastoma | primary | wt | WES |
| Q | Glioblastoma | primary | V178I/G105G | WES |
| R | Glioblastoma | primary | wt | WES |
| S | Glioblastoma | primary | R132H | WES |
| Т | Glioblastoma | primary | wt | WES |
| U | Glioblastoma | primary | NA | aCGH |
| V | Glioblastoma | primary | wt | WES |
| W | Glioblastoma | primary | wt | WES |
| Х | Glioblastoma | primary | V178I | WES |
| Υ | Glioblastoma | primary | wt | WES |
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Supplemental Table S2: Patient demographics for the 7 untreated high-grade glioma tumors in the validation set. Patients labeled AA through GG. M=male, F=female. NA = not available. Wt = wild type. aCGH = array comparative genomic hybridization; WES = whole exome sequencing

| Patient | Туре | Pathology | IDH.status | Sequenced |
|---------|------------------------|-----------|------------|-----------|
| AA | Anaplastic Astrocytoma | primary | WT | WES |
| АВ | Anaplastic Astrocytoma | primary | WT | WES |
| AC | Glioblastoma | primary | WT | WES |
| AD | Anaplastic Astrocytoma | primary | WT | WES |
| AE | Glioblastoma | primary | WT | WES |
| AF | Glioblastoma | primary | WT | WES |
| AG | Anaplastic Astrocytoma | primary | WT | WES |