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# Novel Tumor Subgroups of Urothelial Carcinoma of the Bladder Defined by Integrated Genomic Analysis

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# Abstract

**Purpose**—There is a need for improved subclassification of urothelial carcinoma (UC) at diagnosis. A major aim of this study was to search for novel genomic subgroups.

**Experimental design**—We assessed 160 tumors for genome-wide copy number alterations and mutation in genes implicated in UC. These comprised all tumor grades and stages and included 49 high-grade stage T1 (T1G3) tumors.

**Results**—Our findings point to the existence of genomic subclasses of the "gold-standard" grade/ stage groups. The T1G3 tumors separated into 3 major subgroups that differed with respect to the type and number of copy number events and to *FGFR3* and *TP53* mutation status. We also identified novel regions of copy number alteration, uncovered relationships between molecular events, and elucidated relationships between molecular events and clinico-pathologic features. *FGFR3* mutant tumors were more chromosomally stable than their wild-type counterparts and a mutually exclusive relationship between *FGFR3* mutation and overrepresentation of 8q was observed in non-muscle-invasive tumors. In muscle-invasive (MI) tumors, metastasis was positively associated with losses of regions on 10q (including *PTEN*), 16q and 22q, and gains on 10p, 11q, 12p, 19p, and 19q. Concomitant copy number alterations positively associated with *TP53* mutation in MI tumors were losses on 16p, 2q, 4q, 11p, 10q, 13q, 14q, 16q, and 19p, and gains on 1p, 8q, 10q, and 12q. Significant complexity was revealed in events affecting chromosome 9.

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**Disclosure of Potential Confiicts of Interest** 

No potential conflicts of interest were disclosed.

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**Conclusions**—These findings may lead to improved biologic understanding and the development of prognostic biomarkers. Novel regions of copy number alteration may reveal potential therapeutic targets.

# Introduction

Urothelial carcinoma (UC) of the bladder is the 6th most common cancer in the United States and the United Kingdom (>70,000 and >10,000 new cases per annum, respectively). The majority of tumors (70%) are low-grade (grade 1/2), low-stage (Ta) lesions not penetrating the basement membrane, and these infrequently progress to muscle invasion (10%–15%). However, tumor recurrence is a major feature and the need for repeated cystoscopic monitoring places a great burden on both patients and healthcare resources. Muscle-invasive (MI) disease (Stages T2–T4) represents 20% of cases. Of these, approximately 50% develop metastases and 5-year survival is less than 50%. Stage T1 tumors that have penetrated the basement membrane but not invaded muscle represent 10% to 20% of cases. A significant proportion of these have potential to become invasive, with progression rates of up to 50% (1). High-grade T1 tumors (T1G3) in particular exhibit highly divergent behavior and their clinical management is challenging.

Prediction of risk of recurrence, invasion, and metastasis in individual patients with UC remain major goals. Histopathologic characteristics have limited ability to predict outcome for individual patients. Although some molecular features of UC show association with clinical phenotype, none are currently suitable for application as prognostic biomarkers. Frequent genomic alterations include copy number loss and/or LOH involving chromosome 9 in UC of all stages and grades, *FGFR3* and *PIK3CA* mutation in low-grade Ta tumors (2) and *TP53* mutation and inactivation of the retinoblastoma (RB) pathway in MI tumors (3, 4). High-throughput methodologies at the mRNA, microRNA, protein, epigenetic, and copy number levels have reported associations with clinico-pathologic characteristics. These include mRNA and microRNA expression signatures associated with distinct clinico-pathologic features (5, 6) and a range of aberrant methylation or histone modifications (e.g., 7, 8). Although some expression signatures have been validated in independent sample series (9), the use of such markers in the clinic remains unproven.

DNA copy number differences underlie a significant proportion of differences in gene expression detected between cancer subtypes and studies in other tumor types have described prognostic subtypes based on DNA copy number alterations. In addition, DNA represents a more stable template for marker assessment than RNA. The use of DNA copy number profiles to define molecular subtypes of UC, and the relationships between copy number, mutational events, and clinico-pathologic data have not been fully assessed. Genome-wide analysis of copy number aberrations and LOH using array-based comparative genomic hybridisation (CGH) or single-nucleotide polymorphism array profiling have revealed regions of alteration (10–15). In general, fewer copy number alterations are found in low-stage and low-grade tumors, and more complex patterns in MI tumors. Several regions of high-level amplification have been identified (14, 16) and integration of copy number and expression data has identified candidate genes (14). A few studies have searched for concomitant copy number events (14, 17), or have combined assessment of copy number

alterations with mutation status of *FGFR3* or *TP53* and found differences in chromosomal stability relating to mutation (11, 18). Copy number alterations have been associated with stage, grade, recurrence, carcinoma *in situ* (CIS), and outcome (12, 13, 19, 20), but few studies have conducted in-depth correlations of findings with clinico-pathologic information, and where this has been done, mutation status was not assessed (21), full copy number information was not included in the analysis (22), or tumors of all stages and grades together were subdivided on the basis of gene expression profiles before copy number analysis (23).

We predict that further genomic subdivision of UC remains to be revealed, and that this may be achieved through integrated analysis of genomic events in large panels of tumors. Here, we assessed 160 bladder tumors, including the largest panel of T1G3 tumors analyzed to date (n = 49), for both genome-wide copy number alterations and mutation of 8 key genes implicated in UC. We identified concomitant molecular events and assessed the relationships of molecular alterations to clinico-pathologic data. Potential subclasses of the "goldstandard" grade/stage groups of UC defined by DNA copy number and mutation status have been identified.

## **Materials and Methods**

#### Patient samples and clinical information

Study approval was granted by the Leeds-East Research Ethics Committee and informed consent obtained from all patients. Cold cup biopsies were snap-frozen and stored in liquid nitrogen and the remainder of the sample embedded in paraffin for diagnostic assessment (24, 25). The sample set consisted of 3 TaG1, 39 TaG2, 16 TaG3, 11 T1G2, 49 T1G3, and 42 T2 (all grades) tumors (Supplementary Table S1). Median follow-up time was 6 years.

#### Nucleic acid isolation

DNA was extracted from frozen sections containing at least 70% tumor cells using the QIAamp DNA Mini Kit (Qiagen). DNA was extracted from venous blood using a Nucleon DNA extraction kit (Nucleon Biosciences) or by salt precipitation. Total RNA was extracted using the Pico-Pure RNA Isolation Kit (Nikon UK Limited).

#### Array CGH

Two types of 1-Mb resolution CGH array were used; Centre for Microarray Resources (CMR; University of Cambridge, Cambridge, UK) and Sanger (26). Coverage on the 2 arrays was essentially the same (details available on request). Hybridization was as described (16). Reference samples were paired normal DNA from blood. In 54 cases blood DNA was not available at the time of CGH analysis and an unmatched lymphoblastoid cell line was used. BlueFuse software (BlueGnome) was used to define spots, subtract background, and calculate normalized fluorescence intensities. Breakpoints and regions of gain and loss were detected using the BlueFuse software aCGH-smooth algorithm (27) with calling thresholds for determining copy number gain and loss set to  $\pm 0.15 \log_2$  ratio (test/ reference) for CMR arrays or  $\pm 0.2$  for Sanger arrays. These thresholds were determined by observation of normal samples and samples with known changes. Alterations were confirmed visually by 2 observers. Amplifications and homozygous deletions (HD) were

defined where the log<sub>2</sub> ratio was 1.2 and 1.2, respectively. Physical positions of clones are according to hg18/NCBI Build 36 (March 2006). Fraction of genome altered (FGA) was defined as the percentage of clones reporting significantly altered copy number.

#### **Mutation analysis**

High-resolution melting (HRM) curve analysis was used to screen for mutations in *FGFR3*, *PIK3CA*, *HRAS*, *KRAS*, and *NRAS* (28). Fluorescent single-stranded conformational polymorphism analysis or HRM analysis was used to screen *TSC1* (28) and *TP53*. *AKT1* mutations were detected as described (29). *GRIN2A* was analyzed using HRM analysis or direct sequencing. Potential mutations were confirmed by sequencing tumor and matched blood samples to establish somatic mutation status. Primer sequences and protocols are available for *TP53* and *GRIN2A* on request.

#### Loss of heterozygosity analysis

Microsatellite markers in the *CDKN2A* region (D9S1748, D9S1749), *TSC1* region (D9S1830, D9S1199, D9S149, D9S66), and the *PTEN* region (D10S1765, D10S215, D10S541) were used. Forward primers were fluorescently labeled, products run on an ABI 3130 sequencer (Applied Biosystems), and analyzed using GeneMapper v3.7 software (Applied Biosystems). LOH was scored as a reduction of at least 60% signal from 1 allele.

#### Immunohistochemistry

Sections were stained for FGFR3 (1:200; B9; Santa Cruz), PTEN (1:100; 9559; Cell Signaling Technology), p53 (1:100; 18-01; Novacastra), and USP7 (1:100; IHC-00018; Bethyl Laboratories Inc.). All runs included a no primary antibody control.

#### Statistics and cluster analysis

Smoothed log<sub>2</sub> ratio values were used for frequency plot visualization and statistical comparisons of frequency data within the Nexus Copy Number Professional 3.1 Software (BioDiscovery). Using the Comparisons function, a Fishers Exact test (P = 0.05; differential threshold 25%) was conducted to determine significant differences between sample subgroups. Hierarchical clustering, Kruskal-Wallis tests, Pearson correlations, and Kaplan-Meier survival analysis were conducted using the Partek Genomics Suite 6.5 (Partek Inc.). To conduct cluster analysis, each individual BAC (Bacterial Artificial Chromosome) array clone was assigned a copy number class (0 = no copy number aberration; 1 = gain; -1 =loss; 2 = high-level gain; -2 = high-level loss) for each sample. One-way unsupervised hierarchical clustering was conducted using Euclidean distance and the Ward method of linkage. The Kruskal-Wallis test was used to test for significant differences in FGA between tumor subgroups and bootstrap analysis was applied to test the robustness of the data set.  $\chi^2$ tests were conducted to test associations with stage and grade. Pearson correlations were carried out between DNA copy number (0 = no copy number alteration; 1 = gain; 2 = highlevel amplification) and gene expression levels for 8q22.2-q22.3 candidate genes as determined by quantitative real-time PCR (qRT-PCR).

#### cDNA synthesis and qRT-PCR

cDNA was synthesized using Superscript II (Invitrogen) according to the manufacturer's instructions. Candidate gene expression was assessed by RT-PCR using TaqMan assays (Applied Biosystems) for *YWHAZ*(Hs01122445\_g1), *ANKRD46*(Hs01569215\_m1), *SNX31* (Hs00381645\_m1), *ZNF706* (Hs00706404\_s1), *NACAP1* (Hs04233493\_sH), *GRHL2* (Hs00227745\_m1), and *GRIN2A* (Hs00168219\_m1). Levels of expression were normalized to *SDHA* (Hs00417200\_m1) and measured relative to a pool of uncultured normal human urothelial cells isolated from human ureters obtained at nephrectomy (30).

# Results

#### Relationship of genome-wide copy number alterations to tumor stage and grade

1Mb-resolution array-CGH was used to assess copy number alterations in 160 UC samples. Tumor grade and stage currently form a major component in assessment of risk of progression in non-MI bladder cancer (31). Thus, we first constructed frequency plots of DNA copy number alterations according to stage and grade (Fig. 1). We next examined whether the proportions of different types of alteration (i.e., those involving whole chromosomes, chromosome arms, or smaller regions) differed between stages and grades. No significant differences were observed but the frequencies of such alterations increased with stage and grade (Table 1).

#### Molecular alterations involving chromosome 9

Deletion of all or part of chromosome 9 is common in UC and critical regions have been identified at 9p21.3 (*CDKN2A*, *CDKN2B*), 9q22 (*PTCH*), 9q33 (*DBC*1), and 9q34 (*TSC1*). HD at 9p21.3 was detected in 16 tumors and in most cases included *CDKN2A*. In 6 samples, deletion did not include *CDKN2A*. Two had deletion of a more distal region containing 15 genes (*IFN1a* cluster, *IFNE*, *KLHL9*, *miR-31*) and 4 had deletion proximal to *CDKN2A* containing *ELAVL2* only. Four other HD were detected, each in a single tumor; 9q32-q33 (*DBC1*, *ASTN*, and part of *TLR2*); 9p24.2-p24.3 (*DOCK8-SMARCA2*), 9p22.2-p22.3 (*SNAPC3-BNC2*), and 9q21.33 (*DAPK1*).

9p21.3 deletions were associated with high stage (P = 0.01) and grade (P = 0.02). In T2 tumors, deletions on 6p, 6q, 9p, 9q, 11p, 13q, and 17p, and gains on 1q, 4q, 7p, 7q, 8p, 17q, and 20q were positively associated with copy number loss in the *CDKN2A* region (Fig. 2A). In other tumor groups, the same chromosome regions were associated with *CDKN2A* deletion, but the association did not reach significance. *TSC1* LOH (9q34) was associated with grade (P = 0.005) but not with stage. No associations between *TSC1* copy number loss and stage, grade or other copy number alterations were observed.

A region of high-level amplification at 9p24.3 (*FOXD4-DMRT2*) was present in one tumor and a larger region of amplification containing 38 genes from *SMARCA2* to *PTPRD* (9p23p24.3) in another. Two discrete regions of gain were detected at 9p13.3-p21 (*TMEM215-C9orf25*) in 2 tumors and 9q21.12 (*C9orf135-TRPM3*) in one tumor.

#### Other regions of HD and high-level amplification

Fifty-one HD, including those on chromosome 9 were detected in 29 tumors (Table 2). These included 1p34.1 (*PTCH2*), 2q36.1-q36.3 (*CUL3*), 11p11.2 (*DDB2*), 18p11.22-p11.21 (*FAM38B*), and 19q12 (*TSHZ3*). One hundred and seventy-one high-level amplifications were detected in 54 tumors (3/42 TaG2, 5/16 TaG3, 20/49 T1G3, 1/11 T1G2, 25/42 T2; Table 2). The most frequent (n = 11) was on 11q13.2-q13.3 (containing *CCND1*). Other regions were 3p25.3-p25.1, 8q22.2-q22.3, and 12q15 (containing *RAF1*, *YWHAZ*, and *MDM2*, respectively). Concomitant amplification of *YWHAZ* and a paralogous gene *YWHAQ* (14-3-3-theta, 2p25), which has been reported in UC (14), was not observed here, but concomitant gain or amplification was observed for 3p25.3-p25.1 (*RAF1*) and 8q22.2-q22.3 in 21 tumors. Amplification of both regions was detected in 3 samples (2 T1G3, 1 T2G3), gain of 8q22.2-q22.3 in 6 samples with 3p25.3-p25.1 amplification (1 TaG2, 1 T1G3, 4 T2G3), gain of 3p25.3-p25.1 in 4 samples with 8q22.2-q22.3 amplification (2 T1G3, 2 T2G3), and gain of both regions in 8 samples (2 TaG3, 2 T1G3, 4 T2G3).

#### **Mutation status**

Mutation status of *FGFR3*, *TP53*, *PIK3CA*, *HRAS*, *KRAS*, *NRAS*, *AKT1*, and *TSC1* was determined (Supplementary Table S1). *FGFR3* mutation (n = 77) was associated with low stage (P < 0.0001) and grade (P < 0.0001) and *TP53* mutation (n = 44) with high stage (P < 0.0001) and grade (P < 0.0001). Eleven tumors had both *FGFR3* and *TP53* mutation. Fortyone *PIK3CA*, 22 *TSC1*, 7 *HRAS*, 7 *KRAS*, 1 *NRAS*, and 5 *AKT1* mutations were detected and had no association with stage or grade.

#### FGA

FGA was defined as the percentage of clones reporting significantly altered copy number and provides a measure of chromosomal instability. FGA groups A (<1%), B (1%– <10%), C (10%–<30%), and D ( 30%) were defined (Supplementary Table S1). Median FGA was higher in tumors of higher grade and stage (Supplementary Fig. S1). Some tumors exhibited few or no copy number alterations. Thirty-five had <5% FGA and 19 of these had <1% FGA. The majority of these chromosomally stable tumors were of low stage and grade (TaG1 n = 3; TaG2 n = 21; TaG3 n = 4; T1G2 n = 2; T1G3 n = 3; T3G3 n = 2). Fifty-eight mutations were detected in this subgroup (26 *FGFR3*; 2 *HRAS*; 3 *KRAS*; 20 *PIK3CA*; 2 *AKT1*; 5 *TP53*) with at least one mutation in each tumor.

# Relationships between FGA, mutation status, copy number alterations, and clinicopathologic data

Lower median FGA was found in T1 (P= 0.005), T2 (P= 0.02), and grade 3 (P= 0.00002) tumors with *FGFR3* mutation (Fig. 3A; Supplementary Table S1). Interestingly, *FGFR3* wild-type Ta tumors commonly showed gain of the long arm of chromosome 8 (P< 0.0001). This inverse relationship was also found in *FGFR3* mutant (n = 22) and wild-type (n = 27) T1G3 tumors (P< 0.0001; Fig. 3B). In most cases, all of 8q was gained but 4 tumors showed focal amplification (Supplementary Fig. S2A). The minimal region (8q22.2-q22.3) contained 13 genes (*ANKRD46-KLF10*). A previous study at tiling path resolution identified a core region extending more than 1.8Mb from *POLR2K* to *NCALD* and revealed

strongest correlation between *YWHAZ* copy number and expression (14). Information from this and the present study defines a minimal region (*ANKRD46-NCALD*) (Supplementary Fig. S2B). We measured expression of *YWHAZ*, and 5 other genes (*ANKRD46, SNX31, ZNF706, NACAP1*, and *GRHL2*) in 46 T1G3 tumors, including those with amplification. *YWHAZ* showed the best correlation (r = 0.61554; P = 0.000005; Supplementary Fig. S2C).

*PIK3CA* and *FGFR3* mutation are commonly found together in UC (2). Compatible with this, we found that as for *FGFR3* mutation, *PIK3CA* mutation was associated with a lower FGA in Ta (P= 0.003), T1 (P= 0.02), G2 (P= 0.01), and G3 (P= 0.005) tumors. No relationships between *TSC1* or RAS gene mutation, FGA, and/or copy number events were observed.

Higher FGA was associated with *TP53* mutation in T1, T2, and grade 3 tumors (P = 0.006, 0.02, and 0.0003, respectively; Supplementary Fig. S1). However, some *TP53* mutant tumors had low FGA. A comparison of specific copy number alterations in *TP53* mutant (n = 24) and wild-type (n = 18) T2 samples revealed significant differences (Fig. 2B). Deletions on 2q, 4q, 11p, 10q, 13q, 14q, 16p, 16q, and 19p and gains on 1p, 8q, 10q, and 12q were positively associated with *TP53* mutation. A region extending from 16p13.2 to 16p13.3 (6,846,409-10,432,694bp) had the best *P* value, and contains 10 genes (*A2BP1-ATF7IP2*). The same association of 16p loss with *TP53* mutation was not detected in T1G3 tumors.

Two genes from 16p13.2-p13.3 (*USP7* and *GRIN2A*) were studied further. The deubiquitinating enzyme USP7 (HAUSP) was considered a good p53-related candidate, and *GRIN2A* (*NMDAR2A*) was recently proposed as a tumor suppressor gene in melanoma following detection of frequent mutations (32). USP7 expression examined by immunohistochemistry (IHC) did not correlate with 16p loss in the *TP53* mutant subgroup. Mutation scanning of 27 T2 tumors including 9 with *TP53* mutation and loss of 16p13.2-p13.3 revealed one missense mutation (p. R181S). As *GRIN2A* has been reported as a target for methylation (33), we measured GRIN2A mRNA expression in 26 stage T2 tumors. GRIN2A expression was low in normal human urothelium and the majority of tumors had comparable or lower expression. Expression did not correlate with *TP53* mutation status or 16p loss in T2 tumors and a similar pattern of expression was observed in 14 stage Ta tumors (data not shown).

FGA was not associated with metastasis or overall survival in T2 tumors (P > 0.05), but higher FGA was positively associated with progression in T1G3 tumors (P = 0.03). The presence of high-level amplification(s) did not correlate with outcome. In T2 tumors, deletions on 10q, 16q, and 22q, and gains on 10p, 11q, 12p, 19p, and 19q were independently associated with metastasis (Fig. 2C). *PTEN* is located on 10q23.3 and its inactivation is common in advanced bladder cancer and associated with poor outcome. Eleven of 14 tumors with copy number loss in the *PTEN* region were in the metastatic group. Kaplan–Meier analysis (Supplementary Fig. S3) showed that time to metastasis was shorter for tumors with *PTEN* deletion (P = 0.00003; log-rank test). As *TP53* mutation and loss of *RB1* are frequent events in muscle invasive UC, we conducted similar analyses. *TP53* mutation had no effect either alone or in combination with *PTEN* copy number loss. *RB1* copy number loss had a nonsignificant (P = 0.053; log-rank test) trend for association with

shorter time to metastasis when assessed alone, and significant association (P = 0.0002; logrank test) in combination with *PTEN* loss (Supplementary Fig. S3). We also examined PTEN protein expression by IHC (Supplementary Fig. S4). However, it was *PTEN* copy number that showed the strongest association with metastasis. Supplementary Fig. S4 summarizes the relationships between clinical outcome data and alterations involving selected components of the RB/p53/PI3-kinase-related pathways and common regions of amplification.

#### Tumor subgroups based on genomic profile

A key aim was to search for novel genomic subgroups to provide improved subclassification at diagnosis. One-way unsupervised hierarchical cluster analysis on copy number data separated tumors primarily but not exclusively according to stage and grade into 3 main clusters (Supplementary Fig. S5A). We then used the same approach to assess heterogeneity within tumor subgroups (Ta, T2, T1G3) in relation to FGA and mutation data.

The 58 Ta tumors (TaG1/2 = 42; TaG3 = 16) formed 4 main clusters (Fig. 4A and C). *FGFR3* mutation was frequent and evenly distributed. Only 2 *TP53* mutations were detected (Cluster 1 and Cluster 2a). Cluster 1 contained mostly chromosomally stable tumors. Cluster 3 contained mainly grade 3 tumors (n = 8) with high levels of chromosomal instability. Gain of 8q was a feature of this cluster and was mutually exclusive with *FGFR3* mutation. The remaining TaG3 tumors were spread across all other clusters. No association was found between local disease recurrence or multifocality and cluster assignment.

Three main clusters were identified in T2 samples (Supplementary Fig. S5B and S5C). Cluster 3 samples were all FGA group D and displayed losses of 3p, 5q, and 13q (including the *RB1* region), and gains of 4p, 4q, and 5p and frequent *TP53* mutation (83.3%). Metastasis occurred in 6 tumors from each cluster and overall survival did not differ significantly between clusters.

Patients with T1G3 tumors are particularly difficult to manage as the risk of progression to muscle-invasion is high and prognostic biomarkers are lacking. Such tumors have been underrepresented in the majority of previous genomic studies. TP53 and FGFR3 mutations were independently distributed in this subset (FGFR3, 45%; TP53, 37%), with the combined mutation distribution being FGFR3<sup>wt</sup>/TP53<sup>wt</sup> (33%), FGFR3<sup>mut</sup>/TP53<sup>wt</sup> (31%), FGFR3<sup>wt</sup>/ TP53<sup>mut</sup> (22%), and FGFR3<sup>mut</sup>/TP53<sup>mut</sup> (14%). One-way unsupervised hierarchical cluster analysis revealed 3 primary clusters and a 4th smaller cluster consisting of 3 highly chromosomally unstable samples (Fig. 4B). We compared copy number alterations and TP53/FGFR3 mutation frequency in these clusters to those in Ta and T2 tumors (Supplementary Table S2; Fig. 4D). FGFR3 and p53 protein expression was examined in 38 of the 49 T1G3 tumors (data not shown). As in Ta tumors, Cluster 1 samples had frequent *FGFR3* mutation (with increased FGFR3 protein expression) and low median FGA (12%). Clusters 3 and 4 resembled T2 Cluster 3, with frequent TP53 mutation, gain of 8q and high median FGA (Cluster 3, 25%; Cluster 4, 69%). Three tumors in Cluster 3 and 2 in Cluster 4 showed p53 overexpression, associated with TP53 mutation. No samples in Cluster 3 were FGFR3 mutant, and there was infrequent chromosome 9 loss. Cluster 2 tumors had 24% median FGA, many were TP53 mutant, only 4 were FGFR3 mutant and gain of 8q was less

frequent than in Cluster 3. On the basis of FGA and *FGFR3/TP53* mutation frequency, Cluster 2 more closely resembled T2 Clusters 1 and 2.

Four of 5 T1G3 tumors that metastasized during the course of the study were in Cluster 2. Three other patients with initial T1G3 tumors showed progression to stage T2 or more. Two of these were from Cluster 2 and 1 from Cluster 1. Clinico-pathologic features were examined, including size, recurrence, multifocality, and the presence of CIS (where recorded) but were not defining features of the clusters or of samples that progressed or metastasized. One or more high-level amplifications were detected in 19%, 54%, 71%, and 100% of tumors from Clusters 1, 2, 3, and 4, respectively, and were detected in 5 of 8 tumors that progressed or metastasized. A copy number signature for Cluster 2 could not be defined as many copy number alterations were shared between clusters. However, copy number frequency plots of the 3 primary clusters showed an overall prevalence of losses in this cluster (Fig. 4D).

For each tumor group (Ta, T1G3, T2), we determined the average numbers of clones reporting gain or loss, and the numbers of gain and loss events for tumors within individual clusters (Supplementary Table S3; Supplementary Fig. S6). Of the 3 primary T1G3 clusters, Cluster 2 showed the highest clone loss:gain ratio (3.9:1) and this prevalence of losses was also evident when separate events were assessed. Ta Cluster 2a also showed a high clone loss: gain ratio (2.7:1). Several other clusters showed an excess of losses, in most cases due to loss of all or most of chromosome 9.

In samples that metastasized, we examined copy number alterations and mutation in detail. All 4 tumors from T1G3 Cluster 2 had loss of distal 2q, chromosome 9, and 13q including *RB1*. Three also had loss of 10q and the other had *TSC1* mutation. In addition, 3 were *TP53* mutant and 1 had *MDM2* amplification. The Cluster 1 sample that metastasized had HD of *PTEN*, *MDM2* amplification and loss of *RB1*.

# Discussion

The clinical and pathologic heterogeneity of bladder cancer presents a challenge in disease management. It is likely that combined molecular and histopathologic classification will provide optimal tools for informed clinical decision making. Here we have identified novel regions of copy number alteration, elucidated relationships between molecular alterations and clinico-pathologic features, uncovered relationships between molecular events, and revealed novel genomic subgroups.

Previous studies have identified 2 groups of UC on the basis of chromosomal alterations (3, 4). Here, we confirmed the distinction between low-grade Ta tumors, with low complexity of chromosomal changes, frequent *FGFR3* mutation and infrequent *TP53* mutation, and MI tumors, with more complex chromosomal changes, infrequent *FGFR3* mutation, and frequent *TP53* mutation. Hierarchical cluster analysis of copy number events in the entire series generated 3 main clusters primarily according to stage and grade. We then assessed the complexity of chromosomal changes within these diagnostic histopathologic groups to identify additional features that improve biologic understanding or have clinical utility.

One cluster of Ta tumors had strikingly few copy number alterations (<1% FGA). These were characterized by point mutations, including 74% in *FGFR3*. Almost certainly, further heritable events remain to be identified in this group. Some Ta tumors showed considerable complexity of chromosomal changes. Subcluster (2a) was characterized by no chromosome 9 loss, a common event in other clusters, and these showed more widespread changes than Cluster 2b and represent an interesting group for further analysis. Cluster 3 contained the majority of grade 3 tumors, with high FGA and similar alterations to T2 tumors. T2 tumors also comprised 3 clusters, all with high chromosomal complexity. It was reported that MI tumors with higher FGA had poorer prognosis (12), but this was not clear here. Although we identified no association between cluster assignment and disease recurrence in Ta or metastasis and survival in T2 groups, numbers in the final clusters are relatively small. Analysis of much larger numbers is needed to assess this and to define subgroup signatures.

T1G3 tumors represent an intermediate and heterogeneous group. This is a clinically challenging group, in which the decision to give conservative local treatment with close surveillance, or radical cystectomy, is currently made in the absence of validated prognostic biomarkers. The 49 tumors analyzed here represent the largest series analyzed for mutation and copy number alterations. Previously a large series of T1G3 tumors was assessed for *FGFR3* and *TP53* mutation. Unlike Ta tumors in which these mutations are virtually mutually exclusive, mutations were independently distributed (34). We confirmed this independent distribution, although here the overall frequency of *FGFR3* mutation was higher and *TP53* frequency lower. This indicates the existence of distinct T1G3 subgroups.

In support of this, we defined 3 major T1G3 clusters and a 4th smaller cluster that differed with respect to both copy number events and FGFR3 and TP53 mutation status. Cluster 1 had frequent FGFR3 mutation (69.2%), with few alterations apart from losses of 17p and chromosome 9, and gains of 1q, 7, and 15. Cluster 3 were FGFR3 wild type and mostly TP53 mutant (71%), with more complex chromosomal changes but strikingly low frequency of chromosome 9 loss. Cluster 4 comprised 3 highly chromosomally unstable samples. Cluster 2 tumors contained fewer alterations than Cluster 3 but showed the highest rate of stage progression/metastasis. Interestingly, these had a prevalence of copy number losses rather than gains. A recent conventional CGH study of 67 Ta and T1 UC, including 21 T1G3 tumors, defined 3 groups with even distribution of the T1G3 cases, and found that those with more losses had worst outcome (15). Similarly, an analysis of lung cancer showed that copy number loss was associated with reduced survival (35). Such profiles may reflect inactivation of multiple tumor suppressor genes. Because of small numbers of patients with adverse outcome, we cannot define a progression classifier, but some combinations of genomic events were apparent in samples that progressed, including p53 pathway alterations (TP53 mutation or MDM2 amplification), RB1 loss, and losses of 2q, 9q, and 10q (PTEN).

The distinct characteristics of these T1G3 subgroups and the independent distribution of events shared by low-grade Ta or MI UC may indicate either different developmental pathways for one or more of these T1G3 groups, or an origin in one or other of the 2 major pathogenesis pathways, e.g., as CIS or a low-grade Ta tumor. Deep resequencing or CGH analysis of single cells or small regions of these tumors may reveal heterogeneity that will allow pathogenesis pathways to be inferred.

Events affecting chromosome 9 showed significant complexity. Candidate tumor suppressor genes at 9p21 (CDKN2A, CDKN2B), 9q22 (PTCH), 9q33 (DBC1), and 9q34 (TSC1) have been identified previously. We found 9p21.3 HD, which did not include CDKN2A, implicating another target in this region. Candidate genes include IFN-a genes, INFE, KLHL9, and miR-31. Homozygous codeletion of miR-31 and CDKN2A has been described (36) and reduced expression is associated with invasion (37). Our finding of HD of miR-31 alone indicates that it may be an independent target. *ELAVL2* is the only gene in the HD region proximal to CDKN2A. ELAVL2 (HuB; HelN1) is a member of the Hu family of RNA-binding proteins implicated in post-transcriptional regulation and differentiation. Several putative mRNA targets of Hu proteins have been identified including the cyclindependent kinase inhibitor p21 (38). HD of ELAVL2 has been reported in other cancers (39, 40) and mutation in glioblastoma (40). We also detected HD at 9p24.2-p24.3 and 9p22.2p22.3. HD at 9p24 and 9p23 were detected previously in UC (14). We also found HD of DAPK1, hypermethylation of which has been reported in UC previously (41). Whole genome sequencing should clarify the status of all chromosome 9 genes. Indeed, exome sequencing of 9 invasive UC, detected mutations in several genes on chromosome 9 including DOCK8, which showed HD here (42).

We detected amplification at 9p24.3 and 9p23-p24.3 and regions of gain at 9p13.3-p21 and 9q21.12. Amplifications at 9p13.3 and 9p22.3-p24.3 are reported in carcinomas of tongue and larynx (43) and in glioma, with *GLIS3* implicated as a 9p23 candidate gene (44). Amplification of 9p21.3-pter in seminomas is associated with overexpression of *DNMT1* (45). Our observations suggest that copy number increases on chromosome 9 should be further elucidated in UC.

The observed *FGFR3* mutation distribution is compatible with previous studies suggesting that this is a key event in non-invasive tumors with good prognosis (46) that are chromosomally stable (18). An inverse relationship between *FGFR3* mutation status and gains of chromosome 6, 8q, and 11q in Ta tumors was reported (18) and gains of 8q11.23-q24.21 in *FGFR3* wild-type tumors (47). Here, *FGFR3* mutation and overrepresentation of 8q were mutually exclusive in all non-MI tumors and in T1G3 tumors. Several tumors had high-level amplification at 8q22.2-q22.3, which has been associated with more aggressive UC phenotype (e.g., 12, 14, 17). On the basis of current and published data (14) *YWHAZ* (*14-3-3-zeta*) is a good candidate gene and potential therapeutic target. Compatible with this, amplification and overexpression contributes to chemotherapy resistance and recurrence of breast cancer (48). The 14-3-3 protein family regulate many pathways in normal and cancer cells by interacting with key target proteins. Indeed, the binding and sequestration of proapoptotic proteins by YWHAZ has been implicated in the development of castration-resistant prostate cancer (49).

We found a subgroup of T2 tumors with *TP53* mutation and concomitant 16p13.2-p13.3 deletion. 16p LOH and deletion in UC is associated with high grade and progression (10). Although *USP7* and *GRIN2A* appeared good 16p candidates, we found no evidence for their inactivation. However, as several deletions involved larger regions or the whole of 16p, more than one candidate region cannot be discounted. For example, *TSC2* is outside the minimal region and mutations were recently detected in UC (50). However, it should be noted that

here, copy number losses of 16p that included *TSC2* were not mutually exclusive with alterations involving *TSC1*.

In MI tumors, we found association between metastasis and 10q loss, including *PTEN*. Previous studies have reported loss of *PTEN* in invasive UC (28) and conditional knockout mouse models show that Pten loss with p53 or Lkb1 loss leads to invasive and metastatic UC (51, 52). We found no association between *LKB1* deletion and metastasis and when both *PTEN* deletion and *TP53* mutation were examined, *PTEN* copy number loss alone best predicted metastasis.

Our findings indicate that the "gold-standard" grade/stage groups of UC are heterogeneous and contain genetically distinct subgroups. Further studies of larger numbers of tumors will be required to confirm these genomic signatures. This may improve our understanding of UC pathogenesis, provide prognostic biomarkers and reveal novel therapeutic targets.

## **Supplementary Material**

Refer to Web version on PubMed Central for supplementary material.

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#### **Translational Relevance**

Heterogeneity in clinical behavior exhibited by bladder tumors of similar grade and stage indicates the existence of molecularly distinct subgroups. Understanding of this is required for rational approaches to clinical management. Here we used a genomic approach to tumor subclassification. Our findings point to the existence of multiple subclasses, independent of the "gold-standard" grade/stage groups. The study included the largest series of T1G3 tumors analyzed for copy number events and mutations to date and identified a subgroup that contained the majority that showed disease progression. Further development of this classification may allow such tumors to be stratified for conservative treatment or cystectomy. We identified novel regions of copy number alteration, relationships between molecular events, and associations with clinicopathologic features. Some novel regions of copy number alteration may contain potential therapeutic targets. Overall, our findings add information to conventional grading and staging and may allow development of robust prognostic biomarkers.

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#### Figure 1.

Genome-wide frequency plots of copy number alterations identified in 160 bladder tumors. Regions of chromosomal copy number imbalance were identified using the aCGH-smooth algorithm within BlueFuse. The smoothed log<sub>2</sub> ratio values generated from these analyses were used as input values for the Nexus software package. The *x*-axis corresponds to chromosomes 1 to 22 and the *y*-axis corresponds to the percentage of gains and losses. Copy number gains are shown in green and losses in red. Frequencies of copy number alterations for all tumors, and according to stage and grade are shown.



#### Figure 2.

*CDKN2A* copy number loss, *TP53* mutation status, metastasis and genome-wide comparisons of copy number alterations in T2 tumors. Genome-wide frequency plots of copy number alterations in (A) tumors with (n = 24) and without (n = 16) loss of copy number in the *CDKN2A* region, (B) *TP53* wild type (WT; n = 18) and mutant (n = 24)tumors, and (C) tumors from patients that did (n = 18) or did not (n = 24) develop metastases. Significant regions (0.05 *P* value cutoff) of copy number gain (green) and loss (red) positively associated with copy number loss in the *CDKN2A* region, *TP53* mutation or

metastasis are highlighted at the bottom of each figure. Two tumors with increased copy number in the *CDKN2A* region were not included in the analyses.

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# Figure 3.

*FGFR3* mutation status, FGA, and genome-wide comparisons of copy number alterations. A, FGA (%) values and *FGFR3* mutation status according to stage and grade. B, genomewide frequency plots of copy number alterations in *FGFR3* wild type (WT; n = 27) and mutant T1G3 tumors (n = 22).



## Figure 4.

Unsupervised hierarchical cluster analysis of aCGH data and genome-wide frequency plots of copy number alterations in individual clusters from stage Ta and T1G3 tumors. Each tumor was scored for copy number gains and losses and these were assigned a copy number class (2 high-level gain, 1 gain, 0 no change, -1 loss, -2 high-level loss). Copy number class data was used in 1-way hierarchical cluster analysis of (A) 58 stage Ta and (B) 49 T1G3 tumors. Each column of the heat map represents 1 sample and each row represents the genomic position of individual clones on the array. Green, copy number gain; red, copy

number loss. Chromosome number is shown on the left-hand side of the heat map. Four main clusters of Ta tumors were identified and these are indicated by the color bars at the top of panel (A): Cluster 1, blue; Cluster 2a, yellow; Cluster 2b, orange; Cluster 3, gray. The grade of each tumor is shown at the top of the figure (black box, G3; white box, G1/G2) along with *FGFR3* mutation status (back box, mutant; white box, wild type) and FGA group (A–D). Four clusters of T1G3 tumors were identified and these are indicated by the color bars at the top of panel (B): Cluster 1, blue; Cluster 2, yellow; Cluster 3, gray; Cluster 4, purple. The *TP53* and *FGFR3* mutation status of each tumor is also shown at the top of the figure (black box, mutant; white box, wild type) along with FGA group (A–D). C and D, frequency plots of copy number events for individual Ta clusters and T1G3 clusters with copy number gains shown in green and losses in red. T1G3 Cluster 4 consisted of only 3 samples therefore frequency data is not presented.

Та	Table 1		
Recurrent genomic alterations by chi	romosome arm		

Stage/grade	Losses (frequency %)	Gains (frequency %)
TaG1/G2 ( $n = 42$ )	9p (28%), 9q (48%), 11p (17%), 11q (21%), 17p (19%), 18q (19%), 19p (19%), 19q (19%)	
TaG3 ( <i>n</i> = 16)	2q (31%), 4p (19%), 6q (25%), 8p (25%), 9p (62%), 9q (69%), 10q (25%), 11p (37%), 11q (25%), 12q (19%), 13q (19%), 14q (19%), 18p (19%), 18q (31%)	lq (31%), 4q (31%), 7p (25%), 7q (19%), 8p (25%), 8q (31%), 9p (25%), 10q (19%), 11q (19%), 12q (37%), 20p (31%), 20q (31%)
T1G2 ( <i>n</i> = 11)	2q (27%), 4q (18%), 8p (18%), 9p (82%), 9q (73%), 11p (27%), 11q (45%), 14q (18%), 17p (18%), 22q (18%)	lq (27%), 6p (18%), 8q (18%), 10q (18%), 13q (18%), 15q (18%)
T1G3 ( <i>n</i> = 49)	2q (47%), 4q (27%), 5q (25%), 6q (22%), 8p (33%), 8q (16%), 9p (65%), 9q (53%), 10q (35%), 11p (39%), 11q (29%), 12q (16%), 13q (35%), 14q (20%), 16p (22%), 17p (55%), 18p (16%), 18q (27%), 22q (27%)	1q (41%), 3p (20%), 4p (16%), 5p (18%), 7p (18%), 7q (16%), 8p (18%), 8q (29%), 9p (22%), 10p (16%), 12q (20%), 13q (16%), 15q (20%), 16q (20%), 17q (27%), 20p (27%), 20q (39%), 21q (25%)
T2 all grades ( <i>n</i> = 42)	2q (59%), 3p (36%), 3q (24%), 4p (33%), 4q (38%), 5q (43%), 6p (29%), 6q (52%), 8p (57%), 9p (59%), 9q (50%), 10p (21%), 10q (40%), 11p (50%), 11q (43%), 12q (26%), 13q (43%), 14q (40%), 15q (21%), 16p (38%), 16q (38%), 17p (50%), 18q (50%), 19p (24%), 19q (19%), 22q (31%)	lp (33%), lq (59%), 2p (38%), 2q (26%), 3p (38%), 3q (33%), 4p (26%), 4q (29%), 5p (36%), 5q (19%), 6p (36%), 7p (26%), 7q (29%), 8p (43%), 8q (69%), 9p (31%), 10p (29%), 10q (31%), 11q (31%), 12p (29%), 12q (33%), 13q (33%), 14q (31%), 15q (21%), 16p (38%), 16q (21%), 17p (48%), 18p (29%), 19p (24%), 19q (40%), 20p (33%), 20q (59%), 21q (19%), 22q (24%)

NOTE: Only those alterations that occurred at frequencies 15% are shown.

	Table	2
<b>Recurrent regions</b>	of HD and high-level	amplification

Chromosomo	Critebond	Position <sup>a</sup> (Mh)	Number of gener	Condidate gauge	Numbor of tumoro	Loss or gain frequency <sup>d</sup>
	Cytoballu	rosition" (MD)	Number of genes	Candidate genes	Number of tumors	(n = 100)
HD						
1	1p34.1	44.61-45.35	12	PTCH2	2	4%
2	2q36.1-q36.3	224.01-227.04	9	SGC2, AP1S3, WDFY1, MRPL44, SERPINE2, FAM124B, CUL3, DOCK10, KIAA1486	2	28.6%
9	9p21.3	21.15-21.73	14	IFNA 10. cluster, IFNE, KLHL9, miR-31	13	49.7%
9	9p21.3	21.73-22.15	4	MTAP, CDKN2A, CDKN2B, ANRIL	16	50.9%
9	9p21.3	22.47-24.09	1	ELAVL2	4	38.5%
11	11p11.2	45.04-47.29	29	DDB2, CRY2	2	24.8%
18	18p11.22-p11.21	10.58-11.06	1	FAM38B	2	11.8%
19	19q12	35.76-36.89	1	TSHZ3	3	6.2%
Amplification						
1	1q23.2-q23.3	158.15-161.21	72	TAGLN2	9	28%
3	3p25.3- p25.1	10.78-13.47	17	RAF1, PPARG	11	16%
6	6p22.3	20.01-22.58	5	MBOATI, E2F3, CDKALI, SOX4, PRL	8	11.8%
8	8p12- p11.22	37.37–39.84	27	FGFR1, TACC1, RCP	5	16.1%
8	8q22.2-q22.3	101.43-103.80	11	YWHAZ	9	30.4%
11	11p15.5	0.26-1.58	46	HRAS	3	6.2%
11	11q13.2-q13.3	68.70–69.30	5	MYEOV, CCND1, ORAOV1, FGF19, FGF4	14	14.9%
11	11q14.1	78.20–79.64	1	ODZ4	3	8.1%
12	12q15	66.93-68.44	14	MDM2	9	14.9%
12	12q24.21-q24.22	114.12-115.49	1	MED13L	3	10.6%
17	17q12-q21.2	34.62-35.68	36	ERBB2	3	13.0%
20	20q12-q13.2	40.79-43.89	52	YWHAB	7	28.6%
20	20q13.32-q13.33	57.73–59.89	7	PHACTR3, SYCP2, PPP1R3D, CDH26, C20orf197, miR-646, CDH4	3	27.9%

<sup>*a*</sup>Physical position is according to hg18/NCBI build 36.

b All candidate genes are listed for regions where the total number of genes is 10. For regions where the total number of genes >10, candidate genes listed were selected based on known or putative cancer-associated function.

 $^{c}$ HDs were classified as those regions where the normalized log2 ratio was -1.2. HDs detected in 2 or more tumors are listed. Amplifications were classified as those regions where the normalized log2 ratio was 1.2. Amplifications detected in 3 or more tumors are listed.