



Tumor proportion in colon cancer: results from a semiautomatic image analysis approach

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Abstract

The tumor stroma ratio (TSR) is a promising prognostic biomarker in colon cancer, which could provide additional risk stratification for therapy adaption. The objective of our study was the investigation of the prognostic significance of TSR at different tumor sites in a simple semiautomatic approach with the open-source program ImageJ. We investigated 206 pT3 and pT4 adenocarcinomas of no special type. According to our established thresholds, 31 tumors (15%) were classified as low tumor proportion (TP) ($\leq 15\%$ TP), 42 tumors (20%) were classified as high TP ($\geq 54\%$ TP), and 133 tumors (65%) were classified as medium TP. High and low TP were associated with an adverse overall survival in comparison to medium TP ($p = 0.001$ and $p = 0.03$). Furthermore, the TP was an independent risk factor of occurrence of distant metastasis next to T status, microsatellite status, and tumor budding. The 5-year survival rate was 49% in patients with high TP, 48% in patients with low TP, and 68% in patients with medium TP ($p = 0.042$, $n = 160$). Patients with a high TP had less often tumor budding ($p = 0.012$), lymphovascular invasion ($p = 0.049$), and less harvested lymph nodes ($p = 0.042$) in comparison to low TP tumors. The results provide first evidence that a high tumor proportion/low stroma proportion is also associated with an adverse prognosis and that this subgroup might be difficult to identify with other classical histopathologic characteristics that are linked to an adverse prognosis.

Keywords Colon cancer · Tumor stroma ratio · Biomarker · ImageJ

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Introduction

“Over 1.8 million new colorectal cancer cases and 881,000 deaths are estimated to occur in 2018, accounting for about 1 in 10 cancer cases and deaths. Overall, colorectal cancer ranks third in terms of incidence but second in terms of mortality” [1]. These estimates illustrate that colorectal cancer is a serious, worldwide public health problem. Today, tumor-node-metastasis (TNM) staging of the American Joint Committee on Cancer (AJCC) is still considered the gold standard for staging. Irrespective thereof, tumor stroma ratio (TSR) is a promising new prognostic biomarker in colon cancer, which could provide additional risk stratification for therapy adaptation. In colon cancer, studies were able to show that a high proportion of intratumoral stromal tissue is associated with a worse prognosis [2–7]. The prognostic value of the tumor stroma has also been shown in breast, ovarian, cervical, gastric, and esophageal cancer [8–13]. The complete biological role of stroma is not fully understood, yet. But it is known that the stroma has an important role for the supply of the tumor and the formation of blood vessels and that the stroma can promote tumorigenesis and metastasis [14–17]. The mesenchymal subtype (CMS 4) of the consensus colon cancer subtypes is associated with a worse prognosis [18]. For colon cancer, TSR assessment recommendations have been published recently [11]. Next to the assessment of stroma proportion by visual estimation, some groups used morphometric methods for the assessment of the stroma proportion [3, 5, 19, 20]. In rectal cancer, one group investigated the tumor stroma ratio with computer-aided quantification [21].

The objective of this study was the investigation of the prognostic significance of stroma/tumor proportion at different tumor sites of colon adenocarcinomas (pT3/4) of no special type with a simple semiautomatic approach with the open-source program ImageJ [22].

Materials and methods

Case collective

We retrospectively evaluated 215 patients with colon adenocarcinomas of no special type, pT3/4, N±, M0, R0, and at least 3-month survival after surgery. All patients underwent surgery at the University Hospital Augsburg between January 2002 and December 2011, and none of the patients had received preoperative chemo- or radiotherapy. We excluded 9 patients because of insufficient tumor tissue or insufficient immunohistochemical staining result (e.g., because of improper fixation) from further analysis. Location: we defined right-sided tumors from oral to the left colonic flexure (excluded) and left-sided tumors from the left colonic flexure (included) to aboral. The evaluation of lymphatic vessel and

venous invasion were performed in each case on all tumor H&E slides. Follow-up data were provided by the Tumor Data Management of the University Hospital Augsburg and complemented with data of the patient files. Tumor budding was graded according to ITBCC, and in each case, the consensus rating was used to define the budding grade, as recently published [23, 24]. The study protocol was approved by the Institutional Review Board of University Hospital Augsburg, Germany.

Assessment of tumor and stroma proportion

In each case, three regions were selected for the assessment of the tumor proportion (TP)/stroma proportion (SP). These were (1) FroTP, defined as the region with the deepest infiltration, measured directly at the invasive front; (2) minimal tumor proportion (MinTP), defined as the region suspected to have the highest SP/lowest TP on the slide; and (3) maximum tumor proportion (MaxTP), defined as the region suspected to have the lowest SP/highest TP. In each case, one representative H&E section (and a corresponding cytokeratin staining), which did show the deepest TNM relevant infiltration depth, was used by Be. Ba. or in difficult cases by cooperation of Be. Ba. and Be. Ma. for selection of the regions.

The workflow was the following: After an overview of the H&E slide, we selected the best fitting regions to the above-mentioned definitions with exclusion of areas containing significant amount of blood vessels, necrosis, abscesses, mucinous areas, or large glandular lumen. Glandular tumor lumen could not be ignored from analysis because of the subsequent digital workflow (binary coding). Lumen was assigned to tumor proportion. The TP and SP were assessed in a field of 3.58 mm², but, differing from the recommendations from van Pelts et al., we used a rectangular selection (side lengths, 2.18 mm and 1.64 mm; field size, 3.58 mm²) instead of a classical round microscope selection due to usage of a camera [11]. We selected only regions in which tumor cells were present at all four borders of the image field. The selection process of each region was performed using a microscope (Olympus, BX43F, Tokyo, Japan) with attached camera with connection to a computer (ProgRes® Speed XCore5 with combined software: Capture Pro 2.9.0.1). Digital images were captured (× 4 objective) of the immunohistochemical stained slide against a cytokeratin that highlighted the tumor tissue. If a histochemical stained slide, corresponding to the selected H&E slide, was already available, we used that one. If not, we prepared a cytokeratin AE1/AE3 immunostaining according to our routine protocol (antibody, cell marque™, monoclonal mouse antibody; dilution 1:500; DAB Opti View IHC Detection Kit; immunostainer, Roche Benchmark Ultra). Subsequently, the open-source image processing software ImageJ (Version 1.48 v) was used for TP and SP assessment [22]. We used the function principle that

immunohistochemically marked brown dark tumor tissue can be differentiated via binary coding from the surrounding light stroma tissue (Fig. 1). After binary coding of the taken images and eliminating the lumen of the tumor cells (run (“make binary”); run (“fill holes”)), Be. Ba. reviewed the result, manually improving the result if necessary (especially, filled up gaps that were not recognized by the algorithm). After calibration, the images were measured (run (analyze particles)). To exclude scoring of dust particles, we only scored particles of at least 0.00023 mm^2 in size. We defined tumor proportion as the following: sum of all tumor areas/ 3.58 mm^2 . We defined stroma proportion as the following: $(3.58 \text{ mm}^2 - \text{sum of all tumor areas})/3.58 \text{ mm}^2$.

Statistical analysis

All statistical analyses were performed using the Statistical Package for the Social Sciences (SPSS software version 24.0 (SPSS, Chicago, IL, USA)). The database was partitioned into an exploration and validation set for cutoff determination. The exploration set ($n = 104$) included all cases with odd study numbers of the original set (before exclusion of patients), and the validation set included all cases with even study numbers ($n = 102$) of the original set. The chi-square test was applied for comparisons of categorical data. The Mann-Whitney U test was applied for comparisons between continuous and ordinal variables between two groups. The Kruskal-Wallis test was applied for comparisons between continuous and ordinal

variables for more than two groups. Univariate event/survival analyses were done according to the Kaplan-Meier method (log-rank test) for assessment of statistical significance. Cox regression analysis (forward, likelihood ratio) was performed to investigate the independence of univariate-identified risk factors. Results were considered statistically significant if $p < 0.05$. Continuous variables were demonstrated as mean \pm standard deviation (SD), if not otherwise specified.

Results

Patients and scoring results

The mean age of the 206 patients at date of diagnosis was 70.0 ± 11.3 years, the mean follow-up time was 5.3 ± 3.5 years, and 85 (41%) patients died during the follow-up period. The detailed clinicopathological characteristics are shown in Table 1.

The mean/median TP was 36%/36% at FroTP, 32%/31% at MinTP, and 71%/73% at MaxTP, respectively (Table 2). The MinTP was assumed to be in the same region as the FroTP in 161 tumors (78%).

Determination of cutoff values

The stroma high group included 76% (FroTP) and 86% (MinTP) of the cases according to a cutoff at 50%. As the

Fig. 1 **a** CK-IHC of FroTP of a tumor with high tumor proportion. **b** Tumor A before measurement and after manual improvements (see discussion). **c** Tumor A after binary coding. **d** CK-IHC of FroTP of a tumor with medium tumor proportion. **e** Tumor D before measurement. **f** MaxTP region of Tumor D. **g** CK-IHC of FroTP of a tumor with low tumor proportion. **h** Tumor G before measurement and after manual improvements (see discussion). **j** Tumor G after binary coding

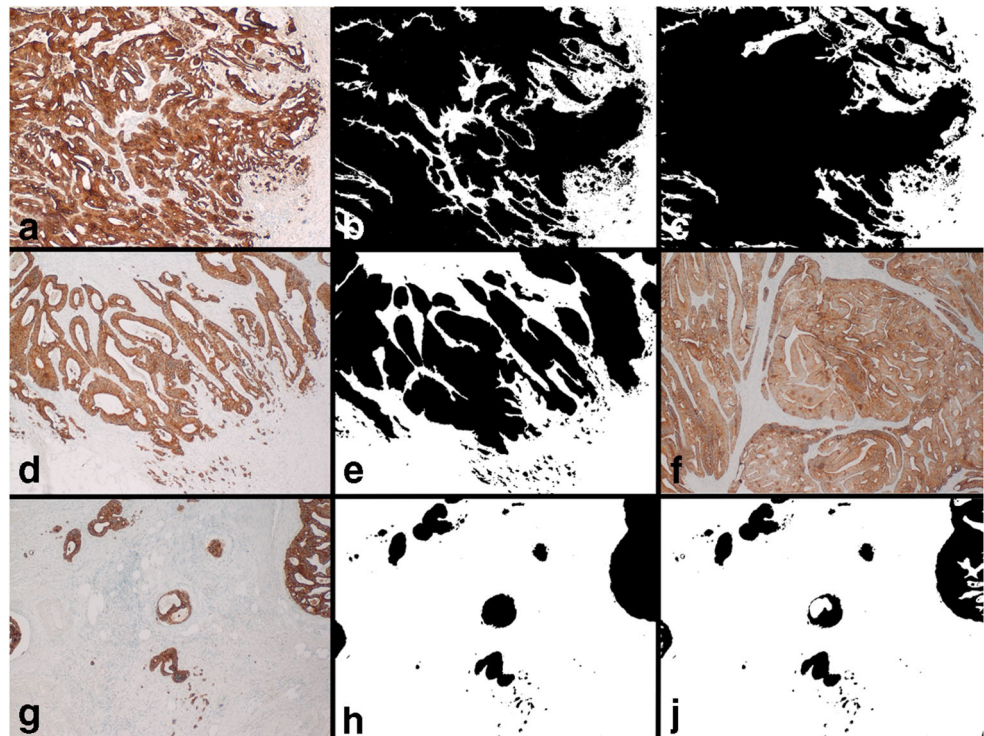


Table 1 Clinicopathological characteristics

| Variable | n = 206 | High TP (n = 42) | Medium TP (n = 133) | Low TP (n = 31) | p value | |
|-----------------------------|-------------|------------------|---------------------|-----------------|---------|-----|
| Mean age (years) | 70.0 ± 11.3 | 73.9 ± 12.2 | 68.6 ± 11.4 | 70.8 ± 8.3 | 0.013 | |
| Mean follow-up (years) | 5.3 ± 3.5 | 4.8 ± 3.5 | 5.7 ± 3.6 | 4.4 ± 2.7 | 0.139 | |
| Mean lymph node harvest (n) | 23 ± 13 | 19 ± 8 | 24 ± 14 | 26 ± 15 | 0.084 | |
| Positive lymph nodes (n) | 1.2 ± 2.3 | 0.9 ± 1.9 | 1.1 ± 2.3 | 1.7 ± 2.4 | 0.485 | |
| Sex | | | | | 0.934 | |
| | Female | 88 | 43% 17 | 40% 58 | 44% 13 | 42% |
| | Male | 118 | 57% 25 | 60% 75 | 56% 18 | 58% |
| T status | | | | | 0.988 | |
| | pT3 | 180 | 87% 37 | 88% 116 | 87% 27 | 87% |
| | pT4 | 26 | 13% 5 | 12% 17 | 13% 4 | 13% |
| Nodal status | | | | | 0.742 | |
| | Negative | 128 | 62% 28 | 67% 82 | 62% 18 | 58% |
| | Positive | 78 | 38% 14 | 33% 51 | 38% 13 | 42% |
| Vascular invasion | | | | | 0.587 | |
| | Negative | 186 | 90% 39 | 93% 118 | 89% 29 | 94% |
| | Positive | 20 | 10% 3 | 7% 15 | 11% 2 | 6% |
| Lymphovascular invasion | | | | | 0.061 | |
| | Negative | 171 | 83% 40 | 95% 106 | 80% 25 | 81% |
| | Positive | 35 | 17% 2 | 5% 27 | 20% 6 | 19% |
| Grading | | | | | 0.394 | |
| | Low grade | 141 | 68% 29 | 69% 94 | 71% 18 | 58% |
| | High grade | 65 | 32% 13 | 31% 39 | 29% 13 | 42% |
| Tumor budding | | | | | 0.029 | |
| | Bd 1 | 168 | 82% 38 | 90% 109 | 82% 21 | 68% |
| | Bd 2 | 25 | 12% 3 | 7% 18 | 14% 4 | 13% |
| | Bd 3 | 13 | 6% 1 | 2% 6 | 5% 6 | 19% |
| Location | | | | | 0.999 | |
| | Right | 127 | 62% 26 | 62% 82 | 62% 19 | 61% |
| | Left | 79 | 38% 16 | 38% 51 | 38% 12 | 39% |
| Microsatellite status | | | | | 0.132 | |
| | MSS | 180 | 87% 38 | 90% 112 | 84% 30 | 97% |
| | MSI | 26 | 13% 4 | 10% 21 | 16% 1 | 3% |
| Distant metastasis | | | | | 0.003 | |
| | No | 165 | 80% 28 | 67% 116 | 87% 21 | 68% |
| | Yes | 41 | 20% 14 | 33% 17 | 13% 10 | 32% |
| Death | | | | | 0.003 | |
| | No | 121 | 59% 16 | 38% 89 | 67% 16 | 52% |
| | Death | 85 | 41% 26 | 62% 44 | 33% 15 | 48% |
| 5-year survival (n = 160) | | | | | 0.042 | |
| | Survived | 97 | 61% 18 | 49% 67 | 68% 12 | 48% |
| | Death | 63 | 39% 19 | 51% 31 | 32% 13 | 52% |

p values are shown for difference between the low, medium, and high tumor proportion group, classified by cutoffs at FroTP

MSI microsatellite instable, MSS microsatellite stable

tumor proportion in our study, and consequently the corresponding group sizes, differed considerably (if the classical cutoff was applied) from published literature (discussed later), we divided our population into an exploration and validation set for cutoff determination. We used a receiver operating

characteristic (ROC) curve approach to determine the optimal cutoff point for the prediction of distant metastasis (Fig. 2a, ROC curve exploration set). As the ROC curve of the exploration set of FroTP has two contrary deviations from the diagonal, we determined two cutoff values. We determined the

Table 2 Overview of the tumor proportion in the different regions

| Variable | All (<i>n</i> = 206) | High TP (<i>n</i> = 42) | Medium TP (<i>n</i> = 133) | Low TP (<i>n</i> = 31) | <i>p</i> value |
|------------|-----------------------|--------------------------|-----------------------------|-------------------------|----------------|
| Mean FroTP | 36 ± 18 | 62 ± 7 | 34 ± 11 | 11 ± 8 | < 0.001 |
| Mean MinTP | 32 ± 16 | 49 ± 17 | 32 ± 10 | 11 ± 3 | < 0.001 |
| Mean MaxTP | 71 ± 13 | 77 ± 9 | 70 ± 13 | 65 ± 15 | 0.001 |

p values are shown for difference between the low, medium, and high tumor proportion group, classified by cutoffs at FroTP

cutoffs that resulted in the lowest *p* value in the exploration set according to the occurrence of distant metastasis by testing and adjusting. Additionally, we performed subsequently ROC analyses of MinTP and MaxTP. The analysis of MaxTP did not reveal a relevant prognostic result (ROC – curve MaxTP in supplement (S1)), and the analysis of MinTP was inferior to the analysis of FroTP (ROC – curve MinTP in supplement (S2)) but showed similar results according to the values of the cutoffs at FroTP.

Prognostic analyses

The established cutoff values at FroTP are low TP ≤ 15% TP; medium TP, 15% < TP < 54%; and high TP ≥ 54% TP. According to these thresholds, 42 tumors (20%) were classified as high TP, 31 tumors (15%) were classified as low TP, and 133 tumors (65%) were classified as medium TP (FroTP). An overview of the mean tumor proportions in the different groups is given in Table 2. In the exploration set, a low TP as well as a high TP was associated with occurrence of distant metastasis in comparison to medium TP (*p* = 0.009 and *p* = 0.015, Fig. 2b). In the validation set, a high TP was also associated with occurrence of distant metastasis in comparison to medium TP (*p* = 0.037, Fig. 2c). The association of a low TP to the occurrence of distant metastasis could not be confirmed, although the *p* value did show a trend towards

significance in comparison to the medium TP group (*p* = 0.105) (Fig. 2c).

A further Kaplan-Meier analysis in the overall patient population showed a significant adverse overall survival for patients with a high and low TP in comparison to patients with medium TP (*p* = 0.001 high TP; *p* = 0.03 low TP, Fig. 3a). The 5-year survival rate was 49% in patients with high TP, 48% in patients with low TP, and 68% in patients with medium TP (*p* = 0.042, *n* = 160).

We applied the established cutoffs at FroTP region also at the MinTP region. Thereby, in the overall population (*n* = 206), 147 patients (71%) were assigned to medium TP group, 25 patients (12%) to the high TP group, and 34 patients (17%) to the low TP group. A high TP was associated with occurrence of distant metastasis and worse overall survival in comparison to the medium TP group (*p* = 0.021 and *p* = 0.006). A low TP was associated with occurrence of distant metastasis, and the *p* value did show a trend towards significance according to an adverse overall survival in comparison to the medium TP group (*p* = 0.008 and *p* = 0.094, Fig. 3b).

Multivariate Cox regression

Additionally, we performed a multivariate Cox regression (forward, likelihood ratio) for the occurrence of distant metastasis including the following risk factors (all variables with a

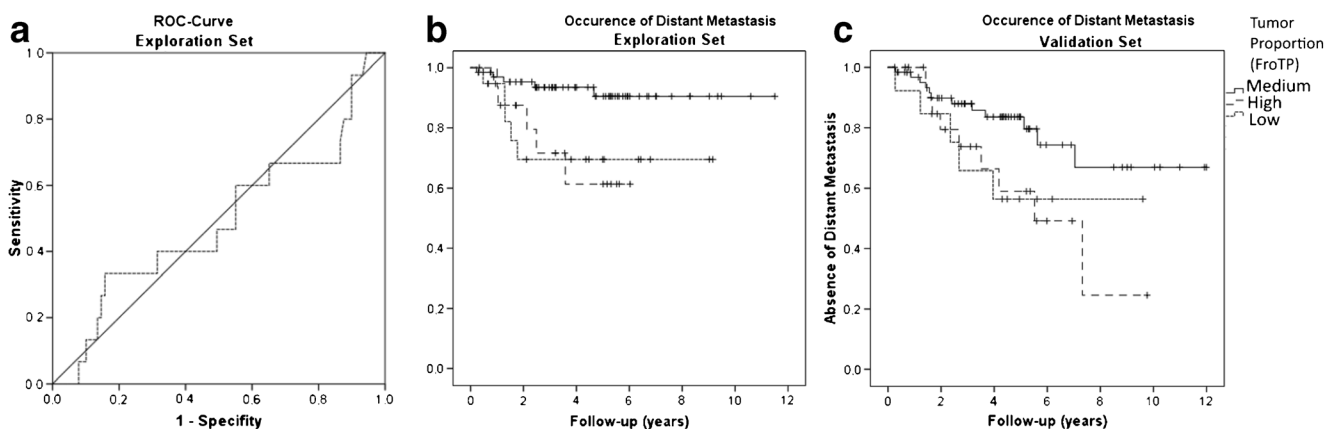


Fig. 2 **a** ROC curve for the occurrence of distant metastasis in the exploration set. **b** Kaplan-Meier curves for the occurrence of distant metastasis in the exploration set (high versus medium tumor proportion *p* = 0.015; low versus medium tumor proportion *p* = 0.009). **c** Kaplan-Meier

curves for the occurrence of distant metastasis in the validation set (high versus medium tumor proportion *p* = 0.037; low versus medium tumor proportion *p* = 0.105)

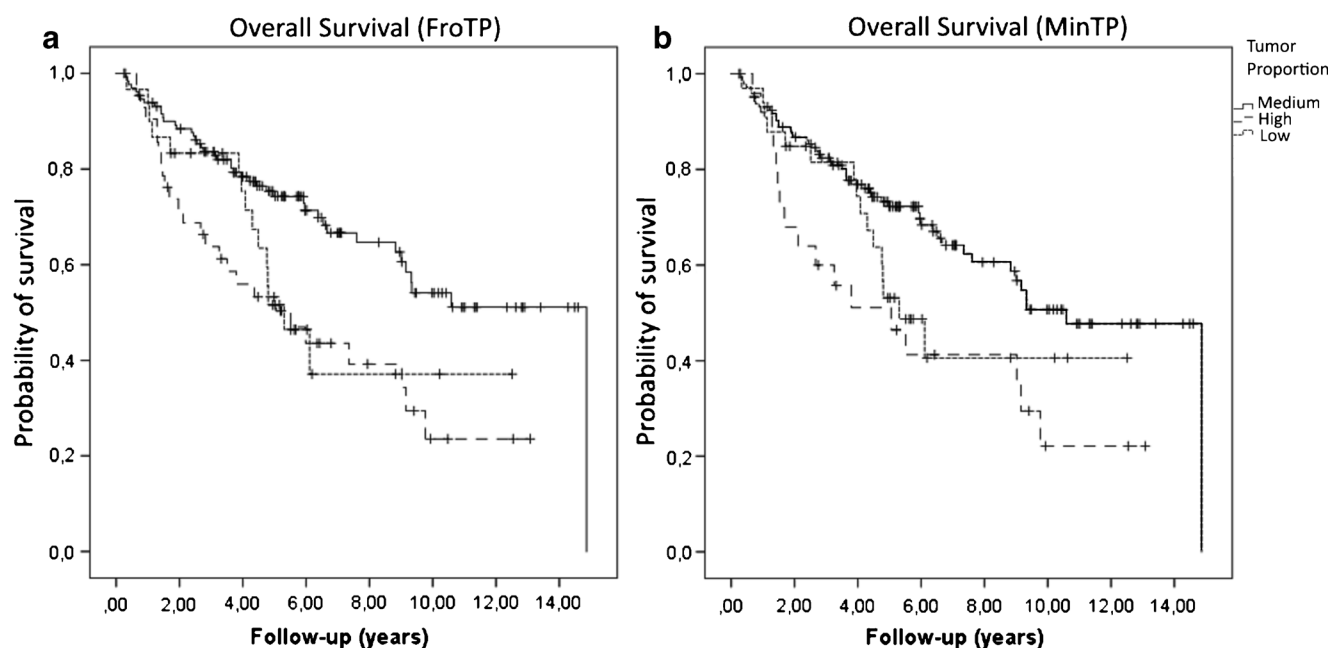


Fig. 3 **a** Kaplan-Meier curves for the overall survival based on the overall patient population and the tumor proportion in the front region (FroTP) (high versus medium tumor proportion $p=0.001$; low versus medium tumor proportion $p=0.03$). **b** Kaplan-Meier curves for the overall

survival based on the overall patient population and the tumor proportion in the region with the lowest estimated tumor proportion (MinTP) (high versus medium tumor proportion $p=0.006$; low versus medium tumor proportion $p=0.094$)

significance level $p \leq 0.1$ in univariate analyses): age (≥ 70 years versus < 70 years), pT, pN (positive versus negative), lymphovascular invasion, sidedness, microsatellite status, tumor budding, FroTP (defined as categorical variable), and MinTP (defined as categorical variable). T status, microsatellite status, tumor budding, as well as FroTP were integrated into the model as independent risk factors. The hazard ratios for the low and high TP groups (FroTP) were 2.7 (1.2–6.0, $p=0.016$) and 3.2 (1.6–6.7, $p=0.001$) (Table 3). Furthermore, we performed another multivariate Cox regression (forward, likelihood ratio) for overall survival including factors with a significance level $p \leq 0.1$ in univariate analyses. We excluded distant metastasis as risk factor from this analysis, as it indicates tumor progression during follow-up. In this model, the FroTP, as well as the T status, and the age were independent risk factors (Table 3).

Characteristics of the different groups

There were significant differences between the three groups according to the frequency of tumor budding and the age of the patients (see Table 1). A low TP was associated to tumor budding ($p=0.012$ low TP vs. high TP; $p=0.046$ low TP vs. medium TP) and a higher lymph node harvest ($p=0.042$ low TP vs. high TP; $p=0.480$ for low TP vs. medium TP). A high TP was associated to the absence of tumor budding ($p=0.012$ high TP vs. low TP; $p=0.192$ high TP vs. medium TP), lymphovascular invasion ($p=0.049$ high TP vs. low TP;

$p=0.018$ high TP vs. medium TP), and a lower lymph node harvest ($p=0.042$ high TP vs. low TP; $p=0.057$ high TP vs. medium TP).

Discussion

In this study, we investigated the tumor and stroma proportion in different regions of 206 pT3 and pT4 adenocarcinomas (NOS) of the colon in a semiautomatic image analysis approach. We used the open-source software ImageJ and the principle that immunohistochemically marked tissue can be differentiated via binary coding from surrounding light stroma tissue. We divided our patient population into an exploration and validation set for cutoff determination. In the validation set, we could confirm that a high TP/low SP ($\geq 54\%$ TP $p=0.037$) is associated with occurrence of distant metastasis. In the overall population, a high TP at FroTP was significantly associated with a worse overall survival and lower 5-year survival rate (see Fig. 3 and Table 1). Additionally, a multivariate Cox regression did show that a high TP is an independent risk factor for occurrence of distant metastasis beside the T status, microsatellite status, and the tumor budding grade. The hazard ratio of patients with high TP was 3.2 (1.6–6.7) in comparison to medium TP ($p=0.001$). These findings are quite surprising, because, so far, only a low TP/high SP has been linked to a worse prognosis [14]. In this study, a low TP/high SP ($\leq 15\%$ TP) at FroTP was also associated with a worse

Table 3 *p* values and hazard ratios for univariate and multivariate analyses

| Variable | Univariate analyses | | | Multivariate Cox regression analyses | | | |
|--------------------------|--------------------------------------|------------------------------------|-----------------------------------|--|----------------|---|----------------|
| | Distant metastasis <i>n</i> = 206 | Overall survival <i>n</i> = 206 | 5-year survival <i>n</i> = 160 | Distant metastasis, hazard ratio, and 95% CI | <i>P</i> value | Overall survival hazard ratio, and 95% CI | <i>p</i> value |
| Sex | 0.18 | 0.66 | 0.639 | | | | |
| Mean age (years) | 0.096 | < 0.001 | 0.002 | | 0.17 | | |
| > = 70 years | | | | | | 2.2 (1.4–3.6) | 0.001 |
| < 70 years | | | | | | | |
| Mean lymph node harvest | 0.14 | 0.24 | 0.573 | | | | |
| > = 23 lymph nodes | | | | | | | |
| < 23 lymph nodes | | | | | | | |
| T status | < 0.001 | 0.018 | 0.012 | | | | |
| T3 | | | | | | | |
| T4 | | | | 4.7 (2.3–9.7) | < 0.001 | 2.2 (1.2–3.9) | 0.01 |
| Nodal status (+ vs. -) | 0.06 | 0.25 | 0.468 | | 0.69 | | |
| Vascular invasion | 0.19 | 0.49 | 0.64 | | | | |
| Lymphovascular invasion | 0.04 | 0.39 | 0.133 | | 0.14 | | |
| Grading | 0.34 | 0.89 | 0.697 | | | | |
| Tumor budding | 0.02 | 0.34 | 0.179 | 1.6 (1.003–2.4) | 0.048 | | 0.23 |
| Sidedness | 0.047 | 0.669 | 0.598 | | 0.071 | | |
| Microsatellite status | 0.03 | 0.23 | 0.374 | | | | |
| MSS | | | | | | | 0.14 |
| MSI | | | | 0.12 (0.02–0.92) | 0.04 | | |
| Tumor proportion (FroTP) | 0.001 | 0.002 | 0.042 | | | | |
| High tumor proportion | | | | 3.2 (1.6–6.7) | 0.001 | 2.1 (1.3–3.4) | 0.004 |
| Medium tumor proportion | | | | | | | |
| Low tumor proportion | | | | 2.7 (1.2–6.0) | 0.016 | 2.0 (1.1–3.7) | 0.02 |
| Tumor proportion (MinTP) | 0.009 | 0.01 | 0.084 | | ns | | ns |
| Distant metastasis | | < 0.001 | < 0.001 | | | | |

CI confidence interval, MSI microsatellite instable, MSS microsatellite stable, ns not significant

FroTP region at invasion front with deepest infiltration; MinTP region with suspected lowest tumor proportion

overall survival ($p = 0.03$ for low TP vs medium TP, Fig. 3), and the 5-year survival rate was lower than in the medium TP group ($p = 0.042$). The results of the prognostic impact of the MinTP region seem to be similar but all in all a bit inferior than at FroTP. We could not find a relevant prognostic impact of the MaxTP region (ROC curve supplement), which emphasizes the relevance of the selected region for the assessment. The different mean TPs in the MinTP (32%), FroTP (36%), and MaxTP (71%) show the extent of tumor stroma heterogeneity. In literature, different tumor regions have been investigated according to their prognostic value. Van Pelt et al. recommend that the region with the highest stroma proportion on the slide of the most invasive part should be decisive [11]. Besides that, other groups could show that a high stroma

content of the “whole” tumor, as well as at the luminal surface, is prognostic [5, 20]. The luminal region has the advantage that biopsies could be scored, but all in all, the recommendations of van Pelt et al. seem to be the most promising for a near-term implementation as an easy diagnostic tool [25].

Interestingly, high TP tumors miss conventional adverse histological features. These tumors had a low proportion of tumor budding ($p = 0.012$ for low TP and $p = 0.192$ for medium TP) and a low proportion of lymphovascular invasion ($p = 0.049$ for low TP and $p = 0.018$ for medium TP). Furthermore, less lymph nodes have been harvested in these tumors ($p = 0.042$ for low TP and $p = 0.057$ for medium TP). Assuming that the lymph node count is a surrogate indicator of the immunological response to the tumor, one might speculate that

the immunological landscape plays an important role in these cases [26]. Further studies could clarify this relation more closely and potentially identify therapeutic opportunities for this subgroup. Patients with a high TP were significantly older than the rest of the patients ($p = 0.004$ for medium TP and $p = 0.031$ for low TP), but the Cox regression analysis did show that the adverse prognostic effects are independent of age. Other significant differences could not be observed (see Table 1). A morphologic reevaluation of the high TP tumors revealed no morphologic characteristics.

There are several critical aspects, which have to be taken into account in interpreting the data of this study. Despite highly significant results, one has to keep in mind that the data is from a single center and the design is retrospective with all the well-known associated drawbacks.

The cutoff determination for TP, for defining this subgroup, has been determined in an exploration and validation set for the occurrence of distant metastasis; however, the survival analyses have been performed in the overall patient population, which consists of the two sets. The presented approach of TP and SP assessment based on binary coding with ImageJ has advantages but also limitations. The presented workflow is not as time and cost-effective as the conventional assessment on H&E. However, the necessary input and resources are limited, as the workflow can be established with basic equipment and only requires an open-source software. After binary coding, the result has to be manually reviewed and if necessary reworked. Two typical causes for rework can be seen in Fig. 1c and j. In Fig. 1j, the binary coding and the “fill the holes” algorithm missed to fill up all holes. Therefore, all lumen had to be stained manually black (Fig. 1h). Comparing Fig. 1b and c shows that a central non-tumor part has been falsely stained black. After drawing a small white connection to the surrounding light stroma area, the area could be correctly recognized (Fig. 1b). Of course, this kind of review and reworking process is a source of interobserver variability, but we consider that of lesser importance because the anti-cytokeratin staining can be used as model. All in all, it has been reported that the reproducibility of TSR scoring is good [11]. Irrespective thereof, we assume that the direct comparability of our results to studies in the existing literature is limited. In comparison to West et al., the median TP was considerably lower (22/26 percentage points in comparison to FroTP/MinTP), and after applying the established cutoff at 50% stroma, a high proportion of patients has been assigned to the high stroma group (76% for FroTP/86% for MinTP) [5]. In most studies, the high SP group included only 20–30% of all tumors [3, 4, 19]. We assume the main reason for the lower TP and higher SP is that we have used an anti-cytokeratin stained slide for the selection of the regions and that we accepted also tumor buds, as part of the tumor, at the borders of the region (Fig. 1). A further factor that influenced the TP/SP is that we were not able to ignore different areas from scoring. Glandular lumen was assessed to the tumor. Therefore, in this study, the TP corresponds to the

area that is covered and enclosed by tumor. Small areas with necrotic tissue, smooth muscle tissue, etc., which had to be accepted in some cases after carefully taking all relevant factors (tumor tissue at all four part at the edges, overall appearance of the tumor, etc.) into account, were assigned to stroma proportion. Another reason which might have contributed to the difference in cutoffs in comparison to the literature is that semiquantitative visual estimation appears to underestimate the TSR in high stroma regions [27]. A limiting factor according to the evaluation of lymphatic and vascular invasion is that no mandatory elastica staining was performed.

Conclusion

This study demonstrates the feasibility of a semiautomatic image analysis approach for TSR assessment in colon cancer and in accordance with literature, and the results confirm that a high stroma proportion is associated with an adverse prognosis. Beyond that, the results provide first evidence that a low stroma proportion/high tumor proportion might also be an independent risk factor for the occurrence of distant metastasis and a worse overall survival. Furthermore, the results indicate that this subgroup also differs according to the clinicopathological characteristics from other tumors.

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Compliance with ethical standards

Conflict of interest The authors declare that they have no conflict of interest.

Ethical approval The Institutional Review Board of the Hospital Augsburg reviewed and approved the study protocol.

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