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Systemic immune-inflammation index in germ-cell tumours

Michal Chovanec^{1,2,3}, Zuzana Cierna⁴, Viera Miskovska⁵, Katarina Machalekova⁶, Katarina Kalavska^{2,3,7}, Katarina Rejlekova^{1,2}, Daniela Svetlovska^{3,8}, Dusan Macak⁹, Stanislav Spanik^{5,10}, Karol Kajo⁶, Pavel Babal^{4,11}, Ugo De Giorgi¹², Michal Mego^{*,1,2,3} and Jozef Mardiak^{1,2}

¹Second Department of Oncology, Faculty of Medicine, Comenius University, Klenova 1, Bratislava 833 10, Slovakia; ²Department of Oncology, National Cancer Institute, Klenova 1, Bratislava 833 10, Slovakia; ³Translational Research Unit, Faculty of Medicine, Comenius University, Klenova 1, Bratislava 833 10, Slovakia; ⁴Department of Pathology, Faculty of Medicine, Comenius University, Sasinkova 4, Bratislava 811 08, Slovakia; ⁵First Department of Oncology, Faculty of Medicine, Comenius University, Kollarska 12, Bratislava 812 50, Slovakia; ⁶Department of Pathology, St Elisabeth Cancer Institute, Heydukova 10, Bratislava 812 50, Slovakia; ⁷Department of Molecular Oncology, Cancer Research Institute, Slovak Academy of Sciences, Dubravska cesta 9, Bratislava 845 05, Slovakia; ⁸Department of Clinical Trials, National Cancer Institute, Klenova 1, Bratislava 833 10, Slovakia; ⁹Department of Pathology, National Cancer Institute, Klenova 1, Bratislava 833 10, Slovakia; ¹⁰Department of Oncology, St Elisabeth Cancer Institute, Heydukova 10, Bratislava 812 50, Slovakia; ¹¹Faculty Hospital with Policlinics Skalica, a.s., Koreszkova 936/7, Skalica 909 01, Slovakia and ¹²Department of Oncology, Istituto Scientifico Q1 Romagnolo Q2 per lo Studio e la Cura dei Tumori (IRST) IRCCS, Via Piero Maroncelli 40, Meldola 470 14, Italy

Background: We evaluated systemic immune-inflammation index (SII) and its association with patient outcome in germ-cell tumours (GCTs).

Methods: Two independent cohorts of patients were analysed; the discovery set (n = 171) from a single institution and the validation set (n = 181) previously included in a study evaluating PD-L1 in GCTs. The SII was calculated using platelet (P), neutrophil (N) and lymphocyte (L) counts before chemotherapy and correlated with survival using regression analyses and Kaplan–Meier method.

Results: In the discovery cohort, the SII was associated with poor risk clinical features. Patients with low SII had significantly longer progression-free survival (HR = 0.22, 95% CI 0.12–0.41, P<0.001) and overall survival (OS) (HR = 0.16, 95% CI 0.08–0.32, P<0.001) compared to high SII. This index was independent of International Germ Cell Cancer Collaborative Group criteria in multivariable Cox regression analysis for OS and was validated in an independent cohort. When combining PD-L1 expression on tumour infiltrating lymphocytes (TILs) and SII, we identified three distinctive prognostic groups.

Conclusions: High SII was associated with poor outcome in GCTs. Combination of PD-L1 positive TILs and SII could further refine prognosis in GCTs.

Immune mechanisms have a significant role in antitumour response and cancer development (Mantovani *et al*, 2008). Testicular germ cell tumours (GCTs) have an exceptional

sensitivity to platinum-based chemotherapy (Einhorn, 1979, 1990; Kondagunta *et al*, 2005; Mardiak *et al*, 2005; Mead *et al*, 2005). However, patients who fail front-line and salvage

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^{*}Correspondence: Dr M Mego; E-mail: misomego@gmail.com

chemotherapy are rendered incurable (Motzer, 2000; Einhorn et al, 2007). Scientific uncertainty regarding mechanisms of resistance to chemotherapy leads to further research in an effort to understand treatment failure in this subset of GCT patients (Romano et al, 2016; Sestakova et al, 2016; Albany et al, 2017). Numerous studies confirmed the efficacy of the check-point inhibition in various types of malignancies in recent years (Topalian et al, 2012; Herbst et al, 2014; Powles et al, 2014; Ansell et al, 2015; Garon et al, 2015). Furthermore, the expression of programmed death receptor 1 ligand (PD-L1) on tumour cells and tumour infiltrating lymphocytes (TILs) has shown a significant prognostic power in our series of patients (Cierna et al, 2016; Chovanec et al, 2017). The inflammatory tumour microenvironment (TME) has many roles in tumour progression and metastasis. Simple blood test such as complete blood count (CBC) can identify immune-inflammatory elements (neutrophils, lymphocytes and platelets) that might shed light on the inflammatory TME (Mantovani et al, 2008; Lippitz, 2013). Immune inflammatory cells have proven to be prognostic in several types of cancer, including urothelial, colorectal, renal cell cancer and mesothelioma (Kishi et al, 2009; Kao et al, 2010; Santoni et al, 2013; Hu et al, 2015; Rossi et al, 2015). Neutrophil to lymphocyte ratio was previously developed as a prognostic tool and was widely tested in other solid tumours (Xiao et al, 2013; Zheng et al, 2013; Balta et al, 2014). Additional value of platelets was suggested, as platelets were shown to protect circulating tumour cells from shear stress during circulation, induce epithelialmesenchymal transition and promote tumour extravasation to metastatic sites (Labelle et al, 2011; Placke et al, 2012; Schumacher et al, 2013). Neutrophils, lymphocytes, and platelets have been recently used in a joined tool, a systemic immune-inflammation index (SII), to provide prognostic information in patients with malignant tumours (Hu et al, 2014; Lolli et al, 2016a). It was established that SII provides a more powerful tool combining three independent prognostic factors compared to platelets, neutrophil to lymphocytes- or neutrophil to platelets-based tools in cancer (Hong et al, 2015; Wang et al, 2017; Yu et al, 2017). High SII reflects pro-inflammatory activity, which was linked to progression, metastasis and poor outcome in cancer (Seruga et al, 2008; Cools-Lartigue et al, 2013). SII was also associated with higher counts of circulating tumour cells (Hu et al, 2014; Zheng et al, 2017). In this study, we evaluated the prognostic value of SII in GCTs and correlated with PD-L1 expression on tumour cells and TILs.

PATIENTS AND METHODS

This retrospective translational study included a discovery set (DS) of 171 patients with GCTs treated from 1999 to 2015 in the National Cancer Institute in Slovakia, with available CBC before systemic platinum-based chemotherapy and sufficient follow-up clinical data. A validation set (VS) consisted of 181 patients included in our previous translational trial of 240 patients evaluating a prognostic significance of PD-L1 on TILs in GCTs, for whom baseline CBC data and sufficient follow-up clinical data were available (Chovanec et al, 2017). In contrast, the current study aimed to evaluate the prognostic significance of SII and explore its' associations with PD-L1 expression in GCTs. Clinical data were recorded and compared with SII and PD-L1 expression on TILs. The Institutional Review Board approved this study and a waiver of consent form for patients was granted.

Systemic immune-inflammation index. The SII is an index based on platelets (*P*), neutrophils (*N*) and lymphocytes (*L*) counts. It was calculated using the following formula: $SII = P \times N/L$ as defined previously (Hu *et al*, 2014). The median value was used as

the cutoff value of SII, which was then dichotomised into low (below median) and high (above median) categories.

Tumour pathology, tissue microarray construction and immunohistochemical staining for PD-L1. The present study assessed the association of SII with the PD-L1 expression, which was evaluated in 181 of 240 patients in our previous translational study (Chovanec et al, 2017). Tumour specimens collected before the administration of systemic therapy were reviewed by two pathologists associated with the study and PD-L1 expression was evaluated in tumour and on TILs as described previously (Chovanec et al, 2017). Germ-cell tumours were identified according to the World Health Organisation criteria (Moch et al, 2016). Tissue microarray construction and immunohistochemical staining with rabbit anti-PD-L1 monoclonal antibody was described in detail previously (Chovanec et al, 2017). Tumour infiltrating lymphocytes were identified with haematoxylin-eosin staining according to the typical morphology. Tumour cells and TILs with PD-L1 expressions were scored by a weighted histoscore (HS), which accounts for both the extent of cell staining (S) and the staining intensity (I) (Kirkegaard et al, 2006). Positively staining cells were estimated on a scale from 0 to 100%. Subsequently, a score from 0 to 3 (0 = no staining; 1 = weak; 2 = intermediate; and 3 = strong staining) was assigned to describe the average intensity of positively staining cells. The HS was then calculated by following formula: $S \times I$; to yield a scale from 0 to 300. On the basis of the HS, a PD-L1 expression was graded as low (0-150) or high (160-300) as we described previously (Mego et al, 2013). The highest PD-L1 expression among GCT subtypes was chosen for mixed

Statistical analysis. A Shapiro–Wilk test have shown a significant difference from the normal distribution of PD-L1 HS, therefore non-parametric tests were used for analyses. Differences in distributions of PD-L1 expression between two groups of patients were analysed using the Mann–Whitney *U* test. For analyses of associations between the SII and PD-L1 expression, a one-way analysis of variance was used when using PD-L1 as a continuous variable. We used Fisher's exact test to assess the associations between SII and PD-L1 when used as categorical variables.

A median follow-up time was identified as a median time duration since the diagnosis to the time of the last follow-up. Progression-free survival (PFS) was calculated from the date of orchiectomy or tumour biopsy to the date of progression or death or the date of the last adequate follow-up. Overall survival (OS) was calculated from the date of diagnosis to the date of death or last follow-up. We performed a Kaplan-Meier analysis to estimate PFS and OS using a product limit method and and we subsequently compared the results by the log-rank test. A multivariable analysis was performed using Cox proportional hazards model for PFS and OS to assess the differences in prognosis on the basis of SII and PD-L1 expression and a prognosis according to International Germ Cell Cancer Collaborative Group (IGCCCG) criteria (International Germ Cell Cancer Collaborative Group, 1997). All reported *P*-values were two-sided. A P-value < 0.05 was considered as significant. Statistical analyses were performed using NCSS 10 software (NCSS, 2015, LLC. Kaysville, UT, USA, ncss.com/software/ncss).

RESULTS

Patients' characteristics from discovery and VSs are shown in Table 1. Majority of patients in the discovery and the VS had a non-seminoma histology. A testicular tumour was the most common primary site and more than half of patients were in a good risk category according to the IGCCCG criteria. The median follow-up in the DS was 49 months (0–170) for all patients and 49

months (7–179) for patients still alive. During the follow-up, 42 (25%) patients experienced a disease progression and 34 (20%) patients have died. The estimated 5-year PFS and OS was 75% (95% confidence interval (CI) 68–81%) and 78% (95% CI 73–86%), respectively. The median time of follow-up in the VS was 85 months (0–189) for all patients and 90 months (22–189) for patients still alive. During the follow-up, 42 (25%) of these patients experienced a disease progression and 34 (20%) have died. The estimated 5-year PFS and OS was 89% (95% CI 84–9%) and 91% (95% CI 87–95%), respectively. We attribute the difference in 5-year survival between the DS and the VS to the higher proportion of IGCCCG good-risk patients and lower proportion of IGCCCG poor-risk patients in the VS (Table 1).

Association between the SII and patient/tumour characteristics. We found strongly significant correlations between the SII and poor patients' characteristics in both cohorts (Table 2). Poor and intermediate risk IGCCCG categories and multiple metastatic sites were associated with the high SII in both groups (all P < 0.001). Bulky retroperitoneal disease, liver or other non-visceral pulmonary metastases (NPVM) were also significantly associated with the high SII (all P < 0.001). Moreover, the high SII was also associated with high tumour markers (both P < 0.001). The SII did not significantly differ between seminomas and non-seminomas, although it was significantly higher in patients with extragonadal primary in the DS but not in the VS (P < 0.001 vs 0.238).

A prognostic role of the SII. Median SII in DS was 1003. Patients with low SII (SII < 1003) had a significantly longer PFS (HR = 0.22, 95% CI 0.12–0.41, P<0.001) (Figure 1A) and OS (HR = 0.16, 95% CI 0.08–0.32, P<0.001) (Figure 1B) opposite to patients with high SII (SII \geq 1003).

A model with median obtained from the discovery data set was tested in an independent VS as defined above. This analysis confirmed prognostic value of SII in GCTs. Patients within the VS, who had a low SII, calculated with a median obtained from the DS had a significantly longer PFS (HR = 0.30, 95% CI 0.11–0.81, P=0.004) and OS (HR = 0.15, 95% CI 0.05–0.47, P<0.001) (Figure 2) as opposed to patients with the high SII.

Survival analysis of both study cohorts have reported significantly longer PFS (HR = 0.22, 95% CI 0.13–0.37, P<0.0001) and OS (HR = 0.14, 95% CI 0.08–0.25, P<0.0001) for patients with low SII compared to patients with high SII (Supplementary Figure 2). A multivariable Cox regression analysis has shown that SII was prognostic independently of IGCCCG for OS, but not for PFS when we compared IGCCCG poor vs good/intermediate-risk patients (Table 3). When we performed the multivariable Cox regression analysis with three IGCCCG categories, the analysis lost the statistical significance for OS (data not shown).

The association of the SII and PD-L1 expression. No statistically significant correlation between the SII and PD-L1 expression on tumour or TILs in the VS was observed. The mean HS for PD-L1 on TILs was 107.3 (95% CI 89.0–125.5) in patients with low SII, compared to 89.1 (95% CI 59.0–119.1) in patients with high SII (P=0.376). Similarly, the mean HS for PD-L1 on tumour cells in patients with low vs high SII was 79.5 (95% CI 66.2–92.8) vs 61.2 (95% CI 41.6–80.8) (P=0.199).

A Fisher's exact test of the SII and PD-L1 expression on tumour or TILs also reported no significant correlations (P = 0.510 and P = 0.484, respectively).

A combined prognostic role of the SII and PD-L1 expressing TILs. Previously, we have shown the prognostic value of PD-L1 expressing TILs in GCTs (16). In the subsequent analysis, we assessed a combined prognostic value of SII and PDL-1 on TILs within the VS. The analysis identified three prognostic groups of patients. The best prognosis was seen in patients who had a high expression of PD-L1 on TILs (HS \geqslant 160) and a low SII (SII < 1003)

	Discove	Validation set		
	N=171	%	N=181	%
Age (years)				
Median (range)	30 (17–62)		30 (16–67)	
Histology				
Pure seminoma Non-seminoma or mixed GCT	31 127	18 74	33 148	18 82
N/A	13	8.0		
Primary tumoui	r			
Gonadal Extragonadal	143 28	84 16	179 2	99 1
IGCCCG risk gr	oup		<u></u>	
Good risk Intermediate risk Poor risk	90 24 57	53 14 33	146 19 16	81 11 8
Sites of metast	ases			
Retroperitoneum Mediastinum Lungs Liver Other Non-pulmonary visceral metastases	146 45 84 62 29 46	85 26 49 35 17 27	121 18 39 9 16 8	67 10 22 5 9 4
No. of metasta	tic sites			
0 1–2 >3	8 103 60	5 60 35	55 101 25	30 57 13
Mean (range) o	f pretreatment m	arkers	<u></u>	
AFP mIU mI ⁻¹ HCG IU mI ⁻¹ LDH (mkat I ⁻¹)	4324 (0–164 946) 164 474 (0–1 888 840) 16 (2–130)	998 (0–60 570) 10 633 (0–423 338) 12 (1.97–81)		

with a 5-year PFS and OS of both 100%, while the worst prognosis was seen in patients with a low expression of PDL1 on TILs (HS <160) and a high SII (SII \geqslant 1003) with a 5-year PFS and OS of 70% and 70%, respectively (HR = 0.29, 95% CI 0.10-0.78; P<0.001

for PFS and HR = 0.13, 95% CI 0.04–0.40; P < 0.001 for OS) (Supplementary Figure 1). Patients with SII and PD-L1 on TILs both low or high had similar intermediate prognosis.

DISCUSSION

lactate dehydrogenase; N/A = not available.

Immune mechanisms have been associated with the pathogenesis of cancer (Sharma and Allison, 2015). Recent advancements in anticancer treatment with immune therapy unleashing the immunity of the host and driving the anti-tumour response resulted in long-term remissions, and even cure in several malignancies (Brahmer et al, 2015; Larkin et al, 2015; Motzer et al, 2015). Testicular cancer has been traditionally referred to as chemotherapy sensitive and few facts are known about the underlying immune mechanisms in this disease. In this study, we analysed a prognostic value of a SII in two independent retrospective cohorts of patients and its association with PD-L1 expression on TILs in our VS. We found that SII calculated prior to chemotherapy is an indicator of prognosis among GCT patients. We did not observe correlation between SII and PD-L1 expression in tumour cells and/or PD-L1 expressing TILs, but the combination of SII and PD-L1 on TILs have created a robust prognostic tool for clinical outcome in GCTs. Our results suggest that immune processes have a role in the mechanisms of progression in GCTs, however, based on our data we cannot determine whether systemic inflammation as expressed by SII creates a permissive microenvironment that leads to the manifestation of the disease with poor prognostic features or if the SII reflects an aggressive disease.

			Discov	ery set			V	alidation set		
		SII			SII					
Variable	N	Mean	s.e.m.	Median	P-value	N	Mean	s.e.m.	Median	<i>P</i> -value
All patients	171	1664	144	1003	NA	181	1034	98	611	NA
Histology Seminoma Non-seminoma N/A	31 127 13	1259 1686	336 166	932 971	0.703	33 148	966 1050	231 109	608 1437	0.059
Tumour primary Primary testicular Extragonadal	143 28	1487 2571	153 347	909 1627	<0.001	179 2	1032 1302	99 939	600 1302	0.238
IGCCCG risk group Good Intermediate Poor	90 24 57	900 2163 2661	178 345 224	644 1319 1991	<0.001	146 19 16	744 1440 3203	93 258 281	534 739 2961	<0.001
Number of metastatic sites 0 1-2 ≥3	8 103 60	530 1437 2207	647 180 236	467 751 1610	<0.001	55 101 25	548 882 2725	153 113 227	461 611 1785	<0.001
Retroperitoneal LN metastases Absent 1–5 cm >5 cm N/A	25 53 93 0	1213 760 2302	348 239 181	709 585 2256	<0.001	60 63 55 3	718 767 1605	159 155 166	467 496 1019	<0.001
Mediastinal LN metastases Absent Present	126 45	1480 2180	165 276	759 1571	<0.001	163 18	861 2609	95 287	569 1461	<0.001
Lung metastases Absent Present	109 62	1447 2046	178 236	753 1464	<0.001	142 39	760 2035	102 195	522 1153	<0.001
Liver Absent Present	137 34	1412 2683	154 310	794 2411	<0.001	172 9	933 2980	95 417	580 3154	<0.001
Non-pulmonary visceral metastases Absent Present	125 46	1357 2500	162 266	757 1921	< 0.001	173 8	950 2860	96 448	583 2952	<0.001
S-stage 0 1 2 3	25 65 24 57	799 939 2163 2662	339 210 346 225	638 660 1320 1991	<0.001	82 65 21 13	614 982 1416 3338	126 141 248 315	495 634 743 2768	<0.001

However, the ability to predict the clinical outcome using the host's immune parameters could allow the pre-selection of patients with different prognostic profiles and the consequent planning of tailored treatment. Interestingly, Yuksel *et al* (2016) recently reported a neutrophil-to-lymphocyte ratio as a simple marker predictive of the presence of stage I testicular cancer. However, Bolat *et al*, (2017) evaluated a prognostic significance of pre-orchiectomy neutrophil-to-lymphocyte ratio in GCT patients and observed no difference in PFS and cancer-specific survival. A revised version of the IGCCCG classification (28) has been launched in 2016, which is collecting data also on *P*, *N* and *L* at baseline in patients treated with first-line chemotherapy (Collette, 2017). This large series of thousands of cases could contribute to better understanding the impact of these parameters including the SII in GCTs.

A cytokine signalling suggesting pro-inflammatory and immunosuppressive pathways that predicts prognosis in GCTs has been previously described in our works (Chovanec et al, 2015; Svetlovska et al, 2017). Pro-inflammatory TME has been reported to correspond with poor prognosis in other malignancies as well (Li et al, 2014; Tsai et al, 2014, 2017). However, the immune TME and its impact on outcome in patients with GCTs is not entirely clear. The SII in our DS have shown strong correlations with essentially all poor clinical characteristics in GCTs. All correlations with clinical features such as the extra-gonadal primary, bulky retroperitoneal disease, NPVM or elevated tumour markers, were strongly significant. We have demonstrated the prognostic value of SII in GCTs for the first time, evidenced by a significant difference in PFS and OS. These findings were replicated in the independent VS. While all the poor clinical characteristics were significantly associated high SII, similar to the data from the DS, one exception was seen. Only two patients were categorised as having primary extra-gonadal tumour within the VS, which contributed to the low statistical power in this tumour characteristic. In a study by Lolli

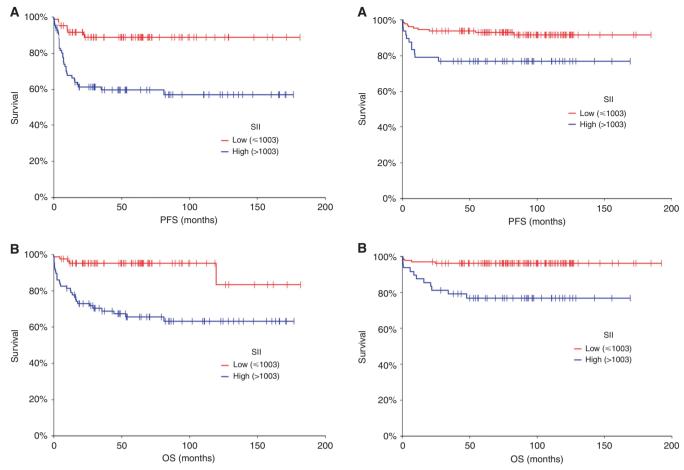


Figure 1. Kaplan–Meier estimates of probabilities of PFS and OS according to the SII. (A) Estimates of probabilities of PFS in the discovery set of patients with GCTs (n=171), HR=0.22, 95% CI 0.12–0.41, P<0.001; low SII<1003; high SII \geqslant 1003. (B) Estimates of probabilities of OS according to the SII; in the discovery set of patients with GCTs (n=171), HR=0.16, 95% CI 0.08–0.32, P<0.001; low SII<1003; high SII \geqslant 1003. CI=confidence interval; GCTs=germ-cell tumours; HR=hazard ratio; OS=overall survival; PFS=progression–free survival; SII=Systemic immune-inflammation index.

et al (2016b), a higher SII was also associated with poor outcome and poor clinical features, such as Gleason score ≥8, visceral metastases or ECOG ≥2, in patients with prostate cancer. Similar data were reported by the same group and others in kidney cancer, oesophageal squamous, hepatocellular, gastric or colorectal carcinoma (Huang et al, 2016; Passardi et al, 2016; Wang et al, 2016; Lolli et al, 2016a; Feng et al, 2017). With the recent development of immune therapies, PD-1, PD-L1 and CTLA4 have become treatment targets in cancer. Germ-cell tumours express PD-L1 in abundance, as was shown by Fankhauser and our group previously (Fankhauser et al, 2015; Cierna et al, 2016). In addition, PD-L1 but not PD-1 expression was prognostic when expressed on tumour cells and TILs (Cierna et al, 2016; Chovanec et al, 2017). A phase II clinical study from Indiana University evaluating an anti-PD-1 agent pembrolizumab failed to prove an efficacy in the treatment of refractory GCTs (Adra et al, 2017). Initial results in seven cases with platinum-refractory GCTs treated with anti-PD1 agents (pembrolizumab or nivolumab) after high-dose chemotherapy have been recently reported with possible activity in three patients (Zschabitz et al, 2016, 2017) and a single case report provided evidence of ongoing partial remission with marker stabilisation

with nivolumab (Chi and Schweizer, 2017). However, predictive

markers associated with tumour response have not been reported

Figure 2. Kaplan–Meier estimates of probabilities of PFS and OS according to the SII. (A) Estimates of probabilities of PFS according to the SII; in the validation set of patients with GCTs (n=171), HR=0.30, 95% CI 0.11–0.81, P=0.004; low SII <1003. (B) Estimates of probabilities of OS according to the SII; in the validation set of patients with GCTs (n=171), HR=0.15, 95% CI 0.05–0.47, P<0.001; low SII <1003; high SII \geqslant 1003. CI = confidence interval; GCTs = germ-cell tumours; HR = hazard ratio; OS = overall survival; PFS = progression-free survival; SII = Systemic immune-inflammation index.

and larger prospective clinical trials are suggested. The associations of inflammatory pathways in relation with PD-1/PD-L1 signalling is unknown. Our further investigation of the association of SII and PD-L1 on tumour cells and TILs did not confirm significant correlations among these, suggesting that PD-L1 and SII mirror different aspects of immunity. An analysis of a combined prognostic value of the SII and PD-L1 on TILs in our VS have discovered three groups of patients; (i) with an excellent prognosis (no events reported) if PD-L1 on TILs was high and SII was low, (ii) a poor prognosis if PD-L1 on TILs was low and SII was high, (iii) and an intermediate prognosis if both were low or high. While the survival curves showed smaller differences in patients with better outcomes for OS compared to PFS in this survival analysis, no events were observed in the best prognostic group (100% PFS and 100% OS at 14 years (Supplementary Figure 1). This is an interesting observation, as well established IGCCCG prognostic criteria show 90% 5-year PFS and 97% 5-year OS for good risk patients (1997). Therefore, combined SII and PD-L1 seems to provide more prognostic power compared to the IGCCCG and may be a useful tool for prognosis prediction in the future. We speculate that the favourable prognosis that might be driven by PD-L1 on TILs can be reduced in the pro-inflammatory environment and vice-versa. The underlying mechanism is

Table 3. A multivariable Cox proportional hazards model for PFS and OS assessing differences in outcome on the basis of SII and prognosis according to IGCCCG (N = 352)

	PFS		OS		
Variable	HR (95% CI)	<i>P</i> -value	HR (95% CI)	P-value	
SII in GCTs	1.6404	0.1337	2.6502	0.0200	
High vs low	(0.8590– 3.1324)		(1.1656– 6.0256)		
IGCCCG risk group	7.5204	< 0.0001	6.8666	< 0.0001	
Poor vs intermediate/ good risk	(4.0501– 13.9645)		(3.3483– 14.0819)		

Abbreviations: CI = confidence interval; GCT = germ-cell tumour; HR = hazard ratio; IGCCCG = International Germ Cell Cancer Collaborative Group; OS = overall survival; PFS = progression-free survival; SII = systemic immune-inflammation index.

however unclear and more research is needed to provide a detailed explanation.

Our study have some strengths and limitations. The strength of the study is the existence of DS and VS as well as the size of the patient population. Limitations include the retrospective nature of the analysis and under-representation of extragonadal GCTs. Also, we noted some imbalances between the sets that could be responsible for differences in the median of SII. While the most of patients in both cohorts were in IGCCCG good risk, the VS included less poor risk and extragonadal GCTs than the DS, which could explain lower overall SII index in the VS compared to the DS.

In conclusion, this is the first translational study to show a prognostic potency of SII in GCTs. On the basis of the acquired data, we suggest SII and its' combined prognostic value with PD-L1 as an interesting novel finding that requires further larger and prospective study for validation and implementation into clinical practice. Additional research is needed to provide detailed insights into immunobiology of GCTs and uncover possible implications for treatment of this disease.

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CONFLICT OF INTEREST

The authors declare no conflict of interest.

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