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1	The prognostic significance of serum interferon-gan	nma (IFN-γ) in hormonally dependent
2	breast cancer	
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5	<i>Running head:</i> IFN-γ in prognos	is of breast cancer
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27 Abstract

Background: Interferon- γ (IFN- γ) is a pleiotropic immunomodulatory cytokine. Because of its contradictory and even dualistic roles in malignancies, its potential as a biomarker remains to be unraveled.

31 *Aim:* To evaluate the prognostic significance of serum IFN- γ in hormonally treated breast cancer 32 patients.

33 *Material and methods:* The study included 72 premenopausal breast cancer patients with known 34 clinicopathological characteristics. All patients received adjuvant hormonal therapy based on 35 hormone receptor-positivity. The median follow-up period was 93 months. IFN- γ serum protein 36 levels were determined by quantitative ELISA. Prognostic performance was evaluated by the 37 receiver operating characteristic (ROC), Cox proportional hazards regression and Kaplan-Meier 38 analyses. Classification of patients into IFN- γ^{low} and IFN- γ^{high} subgroups was performed by the 39 use of the outcome-oriented cut-off point categorization approach.

40 **Results:** The best prognostic performance was achieved by IFN- γ (AUC=0.24 and p=0.01 for distant events, AUC=0.29 and p=0.01 for local and distant events combined). Age and IFN-41 γ were prognostically significant in instances of all types of outcomes and IFN- γ was the 42 43 independent prognostic parameter (Cox regression). There was a significant difference between IFN- γ values of patients without any events and those with distant metastases (Mann-Whitney 44 test, p=0.007). IFN- γ levels correlated significantly with nodal status and tumor stage 45 (Spearman's rank order, r=-0.283 and r=-0.238, respectively). Distant recurrence incidence was 46 4% for the IFN- γ^{high} subgroup and 33% for the IFN- γ^{low} subgroup (Kaplan–Meier analysis). 47

48 *Conclusions:* Raised serum IFN-γ levels associate independently with favorable disease outcome
49 in hormonally dependent breast cancer.

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51 *Keywords*: interferon gamma; breast cancer; hormonal therapy; tamoxifen; prognosis.

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54 1. Introduction

Interferon- γ (IFN- γ) is the sole member of the type II interferon family, a pleiotropic 55 56 cytokine with primarily antiviral but also immunomodulatory functions, which plays an important role in coordinating both innate and adaptive immune responses [1]. Its expression is 57 mainly from natural killer (NK) and natural killer T (NKT) cells in innate immunity while CD8+ 58 and CD4+ T-cells are major paracrine sources of IFN-y during the adaptive immune response 59 60 [2]. These cells are stimulated by interleukins produced in situ, tumor- or pathogen- antigens, and by IFN- γ itself through a positive feedback loop [3]. Besides its autocrine effects on the IFN-61 γ -producing cells, IFN- γ also acts on stromal cells in an inflamed or tumor microenvironment 62 63 (e.g. macrophages, dendritic cells, B cells, endothelial cells), as well as on tumor cells. The effect of IFN- γ is mediated through the induction of interferon signature genes (ISGs) that alter the 64 function of the target cells [1, 4]. 65

Based on the current knowledge, the effect of host-derived IFN- γ can be both anti-66 tumorigenic and pro-tumorigenic because of its complex effects in immunoediting [5]. Although 67 the anti-tumoral effects of IFN- γ i.e. inhibition of the growth of several tumor cell lines including 68 breast cancer cells, has been demonstrated in different studies, tumor cells can escape from the 69 70 control of this cytokine in the early stages of tumor development, either due to a decreased expression of IFN- γ and/or through an alteration of either its receptors or transduction elements 71 72 [6]. Furthermore, IFN- γ may actually reduce immune responses through enhanced activation of 73 distinct immunosuppressive mechanisms that allow tumor progression and metastasis [1]. A recent study demonstrated that in the presence of IFN-y producing cytotoxic T-cells, tumor cells 74 75 developed genetic instability, which supported their genetic evolution and immune escape [7].

Approximately 70% of human breast cancers are hormone-dependent and express 76 hormone receptors - estrogen receptor (ER) and/or progesterone receptor (PR) [8]. The 77 introduction of adjuvant (postoperative) systemic therapy leads to a significant improvement in 78 79 post-surgical survival and a reduction in disease relapse, especially in women with ER-positive (ER+) breast cancer, who may receive hormonal therapy alone or in combination with cytotoxic 80 81 therapy [9]. Due to hormone receptor-positivity of breast cancer, these patients were treated with adjuvant endocrine therapy: tamoxifen alone or a combination of tamoxifen and luteinizing 82 83 hormone-releasing hormone (LHRH) agonist goserelin [10]. Tamoxifen is known to have a dual mechanism of action: to compete with 17β -estradiol (E₂) at the receptor site and to block the 84

promotional role of E₂ in breast cancer, to bind DNA after metabolic activation and to initiate carcinogenesis [11]. LHRH agonists are recommended in younger breast cancer patients as they induce temporary ovarian suppression and thus preserve ovarian function from the toxic effects of chemotherapy [12]; these premenopausal women are at relatively high risk of relapse [13]. However, despite the effectiveness of hormonal therapy, ER+ breast cancers still show high recurrence rates, largely due to the phenomenon of resistance to hormonal therapy.

Nonetheless, *de novo* and acquired resistance remain the major problems in treatment of breast cancer patients and identification of resistance biomarkers remains unresolved. Although IFN- γ has been studied for a long time, because of its contradictory and even dualistic roles in malignancies, its potential as a biomarker remains to be unraveled. Therefore, this study aimed to evaluate the relationship between serum protein levels of IFN- γ and clinical outcome in hormonally-treated breast cancer patients.

97 2. Material and methods

98 *2.1 Patients*

This retrospective study included 72 premenopausal women with breast cancer. 99 100 Clinicopathological characteristics of the patients at the time of primary diagnosis are presented in Table 1. Patients were diagnosed at different stages of the disease, but none of them had 101 102 metastases at the time of diagnosis. All patients underwent surgical resection, their median age was 45 years. Histological specimens were examined and classified according to the criteria of 103 the American Joint Committee on Cancer / Union International Contre le Cancer (AJCC/UICC) 104 105 for TNM stage, histological type, tumor grade and receptor status. Patient data were received in an anonymised form without indirect identifiers that could enable re-identification (Safe-Harbour 106 107 methodology of the 2012 Health Insurance Portability and Accountability Act).

This non-interventional, retrospective, study was approved by the Institutional Ethics committee of the Institute of Oncology and Radiology of Serbia and conforms to The Code of Ethics of the World Medical Association (Declaration of Helsinki), printed in the British Medical Journal (18th July 1964) and its later amendments.

All patients received adjuvant (postoperative) hormonal therapy based on estrogen receptor (ER) and/or progesterone receptor (PR) proportion scoring according to Allred et al. [14]. Endocrine therapy consisted of tamoxifen alone or a combination of tamoxifen and LHRH 115 agonist goserelin (Zoladex®). According to the standard protocol at our hospital, postmenopausal breast cancer patients were switched to aromatase inhibitors (AIs) as part of 116 adjuvant endocrine treatment. Therefore, in this study we included the premenopausal breast 117 cancer patient group which was uniformly positive for hormone receptors that received 118 tamoxifen alone or a combination of tamoxifen and goserelin. Such design has reduced the group 119 heterogeneity which could mask or alter the prognostic role of IFN-y. Taken together, the 120 121 inclusion criteria were: premenopausal status, hormone receptor-positivity and hormone therapy. Fifty-two patients received tamoxifen alone over 5 years after operation while 20 patients (\leq 44 122 years of age) received a combination of tamoxifen and goserelin (LHRH agonist) for 3 years 123 after the operation and then continued with tamoxifen alone for 2 years (up to 5 years). 124

To provide insight into the prognostic performance of serum IFN- γ in breast cancer, we evaluated whether IFN- γ serum levels were associated with the, retrospectively recorded, actual occurrence of distant and local events. Local recurrence refers to the development of locoregional changes (in the same breast or regional lymph nodes), while distant recurrence refers to distant metastasis such as the bone, lung, liver and brain [15]. The follow-up period was from 60 up to 172 months, with a median of 93 months.

131 2.2 Measurement of IFN-γ levels in serum

Five milliliters of peripheral blood were taken from all patients postoperatively. Blood samples were centrifuged at 950 g for 10 min and serums were stored at ≤ -70 °C.

IFN-γ levels were determined by ELISA according to the manufacturer's instructions
 (Human IFN-γ Quantikine HS ELISA, R&D Systems, Minneapolis, USA).

136 2.3 Measurement of hormone levels in serum

Follicle-stimulating hormone (FSH), luteinizing hormone (LH) and estradiol levels were
measured by ELISA according to the manufacturer's instructions (Human Diagnostics GmbH,
Wiesbaden, Germany).

140 2.4 Prognostic performance evaluation

141 The receiver operating characteristic (ROC) analysis by the area under the ROC curve 142 (AUC) was employed as a quantitative measure of discrimination efficiency. Discrimination is 143 the capability to stratify patients who experience the event and patients who do not experience the event. AUC ranges from 0.5 (chance accuracy) to 1.0 (perfect accuracy), with the intermediate benchmarks of: 0.4-0.5 or 0.5-0.6 (poor), 0.3-0.4 or 0.6-0.7 (fair), 0.2-0.3 or 0.7-0.8 (moderate), 0.1-0.2 or 0.8-0.9 (good) and 0.0-0.1 or 0.9-1.0 (excellent) [16]. Kaplan–Meier analysis was done for the period from tumor extraction surgery until the occurrence of local and distant events (IBM SPSS Statistics for Windows version 24, IBM Corp. Chicago, IL, USA). ROC analysis was based on continuous feature values, while Cox proportional hazards regression used categorized feature values.

Categorization of the continuous values measured in serum was achieved by the outcome-151 oriented optimal cut-off point selection by use of the log-rank test and the X-tile 3.6.1 software 152 from Yale University (New Haven, CT, USA) [17]. Univariate Cox proportional hazards 153 regression test was performed for comparison of the prognosticated and actual, local and distant 154 events. The HR designates the effect size by Cox regression, corresponding to recurrence rates in 155 high- and low-risk groups of patients (IBM SPSS). Each feature satisfied the proportional 156 hazards assumption based on the Schoenfeld residuals by phtest (Stata/MP 13 package, 157 StataCorp, College Station, TX, USA). Multivariate stepwise Cox proportional hazards 158 159 regression analysis was performed to test for the independence of each prognostic factor. Variables categorized by the outcome were added to a full model using the forward selection 160 entry criterion of $p \le 0.05$ in univariate analysis and removed using backward elimination by the 161 selection stay criterion of p < 0.05 in IBM SPSS Statistics for Windows. 162

163 *2.5 Validation*

The p-values and confidence intervals (95%CI) of the obtained HRs and AUCs were 164 165 corrected for bias using the bootstrap internal validation in IBM SPSS Statistics version 24 for 166 Windows. Bootstrap resample validation is a very powerful tool for testing model stability by constructing confidence intervals and calculating p-values [18]. The bootstrap variant of 167 resampling with replacement produces new "surrogate" data sets with the same number of cases 168 169 as the original data set. This is achieved by a random selection of observations from the original 170 sample until the same number of observations is achieved, followed by calculation of prognostic estimates such as the 95%CI and p-value. The performed bootstrap is defined as "resampling 171 172 with replacement" because the selected observations are not removed from the pool during 173 resampling. Therefore, some measurements may be selected multiple times while certain

observations may not appear in a resample. By creating 1000 different resamples bootstrappingoffers a more stable estimate of the prognostic performance.

176 **3. Results**

177 *3.1. Sample size calculation*

The sample size calculation was based on a pilot experiment with 35 patients. The calculation parameters obtained from the pilot experiment were: target power of 0.8, effect size by hazard ratio (HR) of 5, significance level of 0.05, variability in standard deviations (SD) of 0.65 and the event rate of 12%. We calculated the variability for each feature as a distance between average values of the patient subgroups with and without the actual recurrence, expressed in SD.

The required numbers were 60 patients with eight events. The actual patient number recruited 184 was 72 with ten distant events and eight local events; and the average SD distance between the 185 subgroups with and without recurrence was 0.68 for distant events and 0.61 for local events 186 187 respectively. The event rate was 11% for local and 14% for distant events. The effect size for IFN- γ was 0.19 or 5.3 for local events and 0.12 or 8.3 for distant events. This resulted in the 188 actual power of 0.82 for prognostication of the local events and 0.995 for distant events. 189 Calculations were performed by the two-sided stpower cox test (Stata/MP 13 software, 190 StataCorp, College Station, TX, USA). 191

192 *3.2 Prognostic performance evaluation and validation*

Table 1 presents clinicopathological characteristics of the premenopausal patients at the time of primary diagnosis. Table 2 presents the statistical evaluation of the association between the available variables and the, retrospectively recorded, actual local and/or distant events. During the follow-up time, 25% of patients developed local or distant recurrence. In our study the time frame for local recurrences was 26 to 89 months whilst for distant recurrences it was 20 to 56 months. The statistical association was calculated against three outcomes: only local, only distant or distant+local events.

Age and IFN- γ were prognostically significant in instances of all types of outcomes (Table 2). Local events could not be prognosticated by any of the tested parameters according to the criteria of ROC analysis, whilst distant events could be by age, PR, nodal status and IFN- γ

203 (Table 2). Local and distant events combined could be prognosticated by age and IFN- γ . By the 204 measure of AUC, the best prognostic performance was achieved by IFN- γ (AUC=0.24 and 205 p=0.01 for distant events, AUC=0.29 and p=0.01 for local and distant events combined). ROC 206 analyses of the IFN- γ serum levels in the prognosis of distant and local events are presented in 207 Figure 1 (A-C).

208 In univariate Cox proportional hazards regression analysis, the most pronounced HR was observed with age, FSH, tumor size and IFN- γ for local and distant events combined (Table 2). 209 AUC values below 0.5 and HRs below 1.0 indicate a prognostic association with good disease 210 outcome. For instance, HR of 0.04 obtained for IFN- γ indicated that patients with IFN- γ serum 211 protein levels above the outcome-oriented threshold had a 25-fold lower risk of incurring an 212 event in comparison to patients with IFN- γ levels below the threshold. When distant metastases 213 214 and local relapses were separated as events, the most pronounced HR by the Cox regression was observed with age, estradiol, tumor size and IFN- γ for both distant and local events (Table 2). 215

216 The multivariate Cox proportional hazards regression analysis of the metastasis risk included age, estradiol, FSH, LH, PR, nodal status, tumor size, HER2 and IFN- γ because they all 217 218 satisfied the forward entry criterion of $p \le 0.05$ in the univariate analysis by distant events. Multivariate analysis was performed considering distant events because these are the most 219 220 relevant for disease outcome. Furthermore, IFN-y prognosticated distant metastases better than local recurrences (Table 2). This analysis highlighted IFN- γ and lymph node status as the 221 222 independent prognostic parameters (Table 3). This result was also supported by a Mann-Whitney rank sum test, which showed a significant difference between IFN- γ values of patients without 223 224 any events and those with distant metastases (p=0.007) but not between patients without any 225 events and those with local relapses (p=0.14).

226 The average±standard deviation (SD) IFN- γ measured values were 35.7±8.3 pg/mL for 227 patients without recurrences, 18.3 ± 2.8 pg/mL for patients with distant metastases and 23.0 ± 3.2 pg/mL for patients with local relapses. In our patient group distant metastases were seen in the 228 bones (4), lungs (3), CNS (2) and liver (1). When events were divided based on distant 229 230 metastatic sites, their numbers were too low for reliable statistical analysis according to the 231 sample size calculation. By Spearman's rank order correlation test, IFN-y levels correlated 232 significantly with age, nodal status and tumor stage (Table 4). A positive correlation was found 233 between age and IFN- γ levels (r=0.324) and a negative correlation between nodal status and 234 IFN-γ levels (r=-0.283) as well as between tumor stage and IFN-γ levels (r=-0.238). Taken 235 together, higher serum protein levels of IFN-γ indicated lower recurrence risk.

236 Figure 1 (D-F) presents Kaplan-Meier plots for IFN-y in prognostication of distant and local events. Classification of patients into IFN- γ^{low} and IFN- γ^{high} subgroups was performed by 237 the use of the outcome-oriented cut-off point categorization approach. P-values were calculated 238 by the Cox proportional hazards regression test. A wider separation between upper and lower 239 curves indicates better prognostic performance. Considering distant and local events combined, 240 recurrence incidence was 0% for the IFN- γ^{high} subgroup and 28% for the IFN- γ^{low} subgroup 241 (Figure 1D). When distant metastases and local relapses were separated as events, distant 242 recurrence incidence was 4% for the IFN- γ^{high} subgroup and 33% for the IFN- γ^{low} subgroup 243 (Figure 1E), while local recurrence incidence was 6% for the IFN- γ^{high} subgroup and 24% for 244 the IFN- γ^{low} subgroup (Figure 1F). 245

246 4. Discussion

In our previous study, based upon the long-term follow-up of 73 pN0M0 breast cancer 247 248 patients after surgery & radiotherapy receiving no subsequent systemic therapy, we investigated 249 the prognostic value of intratumoral IFN- γ mRNA and protein levels [19]. Over the entire period 250 of 14 years of follow-up neither IFN- γ mRNA nor IFN- γ protein levels were significantly 251 associated with breast cancer outcome by ROC analysis or Cox regression criteria, but 252 intratumoral IFN-y mRNA was associated significantly with favorable disease outcome over the first 7 years of follow-up. [19]. The current study demonstrates the prognostic value of 253 254 measuring IFN- γ in the serum of patients with breast cancer; this allows easy sampling and 255 repeated measurements. Furthermore, ELISA is a widely used and inexpensive method in routine 256 clinical laboratory practice. The main finding of the study, in a patient group with a median 257 follow-up of 7.5 years, is that raised serum IFN- γ protein levels associated significantly with favorable disease outcome. 258

A recent study examined the molecular subtype-specific prognostic significance of IFN- γ as a single gene as well as an IFN- γ signature covering the signalling pathway in breast cancer patients [20]. Heimes et al. found that the independent prognostic significance of IFN- γ as a single gene was limited to basal-like breast cancer but the IFN- γ -associated gene signature was the independent prognostic factor in the whole cohort [20]. Higher expression of the IFN- γ - 264 signature was associated with a better prognosis and that is in accordance with our results. Also 265 in agreement with our results was another study that investigated the prognostic significance of 266 intratumoral IFN-y mRNA in invasive cervical cancer patients and found that the good-prognosis 267 patient subgroup had higher IFN- γ mRNA expression [21]. Two other studies reported that the IFN- γ gene signature predicted significant improvement in both progression-free survival and 268 overall survival in uterine and ovarian cancer for patients with higher intratumoral IFN- γ 269 270 expression [22, 23]. In hepatocellular cancer patients, low serum IFN-y levels were associated significantly with greater tumor size and advanced stage, and patients with lower baseline IFN- γ 271 levels had a higher risk of recurrence [24]. Similarly, we found in this study low serum IFN- γ 272 273 levels associated significantly with the unfavorable clinicopathological features of nodal spread and advanced stage. Finally, a recent study investigated the association between IFN-y levels and 274 clinical outcomes in non-small-cell lung cancer patients receiving immunotherapy [25]. In this 275 study median progression-free survival was significantly longer in the subgroup of patients with 276 higher IFN- γ levels. Furthermore, IFN- γ levels in the non-progressing disease group were 277 278 significantly higher than in those patients who did show progression [25]. Our results in 279 hormonally dependent breast cancer are in agreement with all of these previous studies on breast and other solid malignancies. Although several breast cancer studies have shown that IFN- γ 280 281 levels are inversely correlated with intratumoral ER and PR expression [19, 26], in this study we found no correlation between IFN- γ and hormone levels, nor between IFN- γ and the ER and PR 282 283 hormone receptors.

IFN- γ is a pleiotropic immunomodulatory cytokine that exerts contradictory and 284 285 polarizing roles in malignancies, manifested by the opposing actions depending on the cellular, microenvironmental or molecular context [27]. Several studies have shown that IFN- γ induces an 286 287 immunoevasive/survival gene expression signature, including upregulation of CTLA4, in skin melanocytes in the context of exposure to genotoxic ultraviolet radiation (UVR), which may play 288 289 an important role in protecting melanocytes from eradication by the UVR-induced inflammatory response [28, 29]. Such protective functions of IFN- γ signalling could be exploited by cancer 290 291 cells to evade immune-mediated destruction and to survive long-term until they accumulate 292 enough mutations to get fully transformed [27].

293 Considering the effect of hormonal therapy on breast cancer, it exerts multiple effects on 294 the expression of tumor biological variables. Lindner et al. showed that tamoxifen enhanced 295 interferon-regulated gene expression in breast cancer cells and this enhancement was an early 296 event in the anti-tumoral activity [30]. Another study showed that IFN- γ increased the growth 297 inhibitory effect of tamoxifen in breast metastatic carcinomas [6]. On the contrary, RNA 298 sequencing of tamoxifen-resistant breast cancer cells indicated that expression of ISGs by tumor 299 cells is involved in acquired treatment-induced resistance [31]. Furthermore, high ISGs expression levels were associated with worse outcome in breast cancer patients treated with 300 301 adjuvant tamoxifen [31]. Ning et al. showed the ability of IFN- γ to induce apoptosis and restore the responsiveness of breast cancer cells to antiestrogen therapy [32]. Moreover, IFN- γ induced 302 the expression of IFN regulatory factor 1 (IRF1), a tumor suppressor gene that can increase 303 antiestrogen responsiveness, which implied that upregulating IRF1 might be a successful 304 approach in the treatment of ER+ breast cancers that have acquired resistance to antiestrogen 305 306 therapy [32]. From our results, we can speculate that hormonal therapy and endogenous IFN- γ might exert synergistic effect resulting in improvement of the patient's outcome, as the high 307 IFN- γ expression might positively affect the efficiency of hormonal therapy. 308

309 Although we satisfied the sample size requirement and the patient group was highly 310 homogenized, limitations of this study include the patient group size. Additional studies in 311 external and larger patient groups are needed to further verify the clinical validity of the reported 312 prognostic value of the serum IFN- γ levels.

313 **5.** Conclusions

In conclusion, raised serum IFN- γ levels associate independently with favorable disease outcome in hormonally dependent breast cancer. Moreover, low serum IFN- γ levels associate with the unfavorable clinicopathological features of nodal spread and advanced stage. Although there are findings suggesting that IFN- γ is a hormonally regulated factor, our results showed no correlation between IFN- γ and hormone levels, neither between IFN- γ and hormone receptors.

This study provides the first prognostic evaluation of IFN- γ in a patient group homogenous for hormone receptors. Clinical applicability of the study is based on the relevance for breast cancer immunotherapy research and the importance of prognosis for the identification of patients at high risk of recurrence who may benefit from more aggressive personalized treatments. Furthermore, this study is of high importance for advancing the prognosis of breast cancer because IFN- γ can easily be measured in serum, on repeated occasions, using ELISA, a

- 325 well-established, cost-effective analysis technology widely used in routine clinical laboratory
- 326 practice.

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224	
334 335	The authors declare no conflict of interest
222	The authors declare no conflict of interest.
336	
337	Authors' contributions
338	All authors have made substantial contributions to: (1) the conception and design of the study, or
339	acquisition of data, or analysis and interpretation of data, (2) drafting the article or revising it
340	critically for important intellectual content, (3) and final approval of the version to be submitted.
341	
342	Availability of data and materials
343	All data generated or analyzed during this study are included in this published article.
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347	

- 348 6. References
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- 434

435 **7. Tables**

436	Table 1.	Clinicopathological	characteristics at	the time of	primary	diagnosis
						()

Danamatan	Number of	0/
Parameter	Number oj	70
	patients	
Age (years)	20	4.4
≤ 43 (median)	52	44 57
>43	40	30
Recurrence	10	14
distant	10	14
	8	11
(distant+local)	(18)	(25)
no recurrence	54	75
Tumour size (cm)		
≤ 2	32	45
2 - 5	26	36
> 5	14	19
Nodal status		
NO	35	49
<u>N+</u>	37	51
Histological type		
Invasive ductal	31	43
Invasive lobular	24	33
other types	17	24
Stage		
1	21	29
2	30	42
3	21	29
Histological grade		
G1	12	17
G2	53	73
G3	2	3
data not available	5	7
Hormone therapy		
Tamoxifen	52	72
Tamoxifen+Goserelin	20	28
Estrogen receptor status	-	-
ER ^{low}	8	11
ER ^{high}	64	89
Progesterone recentor status		*/
PR ^{low}	6	8
PR ^{high}	59	82
data not available	7	10
HER2 status	,	10
HER2–	62	86
HFR2+	Q	13
data not available	2	1
	1	1

437 Abbreviations: ER, estrogen receptor; ER^{low} , ER Allred proportion score < 3; ER^{high} , ER Allred

438 proportion score \geq 3; PR, progesterone receptor; PR^{low}, PR Allred proportion score < 3; PR^{high}, PR Allred

439 proportion score \geq 3; *HER2*, human epidermal growth factor receptor 2; *HER2*-, HER2 gene not

440 amplified; *HER2*+, HER2 gene amplification.

	Distant and local events		Distan	t metastasis	Local recurrence		
	AUC ^a	HR^{b}	AUC ^a	HR^{b}	AUC ^a	HR⁵	
Variable	95% CI ^c	95% CI ^c	95% CI ^c	95% CI ^c	95% CI ^c	95% CI ^c	
	P-value ^c	P-value ^c	P-value ^c	P-value ^c	P-value ^c	P-value ^c	
	0.32	0.21	0.28	0.12	0.35	0.19	
Age	0.17 - 0.46	0.05 - 0.54	0.13 - 0.42	0.02 - 0.42	0.15 - 0.55	0.002 - 0.83	
	0.03*	0.002*	0.02*	0.002*	0.18	0.003*	
	0.52	0.34	0.54	26.7	0.47	0.03	
Estradiol	0.37 - 0.67	0.03 - 0.92	0.36 - 0.73	22.9 - 33.8	0.29 - 0.65	0.02 - 0.04	
	0.81	0.09	0.66	0.001*	0.79	0.001*	
	0.45	0.41	0.50	0.04	0.38	0.89	
LH	0.29 - 0.61	0.04 - 1.80	0.33 - 0.68	0.03 - 0.05	0.17 - 0.59	0.04 - 5.05	
	0.56	0.24	0.99	0.001*	0.27	0.92	
	0.43	0.16	0.45	0.04	0.46	1.79	
FSH	0.29 - 0.61	0.04 - 0.70	0.27 - 0.63	0.03 - 0.04	0.22 - 0.71	0.04 - 8.24	
	0.56	0.001*	0.62	0.001*	0.73	0.45	
	0.45	0.97	0.43	0.92	0.49	1.01	
ER	0.28 - 0.61	0.73 - 1.29	0.23 - 0.63	0.66 - 1.32	0.27 - 0.71	0.74 - 1.95	
	0.51	0.76	0.46	0.54	0.92	0.94	
	0.36	0.47	0.26	0.15	0.60	9.6	
PR	0.19 - 0.52	0.1 - 23.8	0.09 - 0.43	0.004 - 0.63	0.40 - 0.80	1.75 - 242.2	
	0.10	0.28	0.02*	0.01*	0.39	0.03*	
Histologiaal	0.59	7.6	0.63	23.3	0.51	1.68	
mistological	0.42 - 0.75	0.73 - 507.8	0.43 - 0.83	0.65 - 1248.9	0.27 - 0.75	0.17 - 1299	
grade	0.30	0.21	0.20	0.08	0.95	0.79	
Nadal	0.59	1.35	0.69	2.1	0.31	0.34	
noual	0.42 - 0.75	0.71 - 2.33	0.54 - 0.90	1.16 - 4.44	0.15 - 0.47	0.04 - 0.83	
status	0.30	0.24	0.03*	0.004*	0.08	0.04*	
	0.63	46.6	0.67	11.5	0.71	5.4	
Tumor size	0.48 - 0.79	33.8 - 69.4	0.49 - 0.85	2.9 - 601.8	0.50 - 0.92	1.1 - 298.9	
	0.10	0.001*	0.09	0.002*	0.06	0.005*	
	0.55	1.45	0.65	3.24	0.45	0.46	
HER2	0.38 - 0.71	0.34 - 4.1	0.45 - 0.85	0.83 - 14.2	0.29 - 0.60	0.03 - 2.61	
	0.57	0.49	0.13	0.05*	0.50	0.33	
	0.33	1.50	0.46	2.03	0.48	0.78	
Stage	0.16 - 0.49	0.78 - 3.2	0.31 - 0.60	0.88 - 6.62	0.34 - 0.63	0.32 - 1.95	
	0.07	0.19	0.58	0.09	0.82	0.57	
	0.29	0.04	0.24	0.12	0.37	0.19	
IFN-γ	0.14 - 0.42	0.03 - 0.04	0.08 - 0.40	0.004 - 0.58	0.18 - 0.56	0.003 - 0.92	
	0.01*	0.001*	0.01*	0.003*	0.23	0.005*	

441 **Table 2.** Prognostic performance of clinicopathological parameters and IFN-γ

442

443 ^a ROC analysis prognostic test, based on continuous parameter values prior to their categorisation.

^b Univariate Cox proportional hazards regression test, based on categorized parameter data.

^c bootstrap corrected

446 * $P \le 0.05$

447

448 Abbreviations: LH, luteinizing hormone; FSH, follicle-stimulating hormone; ER, estrogen receptor; PR,

449 progesterone receptor; *HER2*, human epidermal growth factor receptor 2; IFN-γ, interferon gamma.

452 453					
455		Doromotor		HR	
454		r arameter	r-value	95% CI	
		IEN «	0.01*	0.17	
455		1Γ1Ν-γ	0.01*	0.04 - 0.68	
		Na dal status	0.05*	1.88	
456		Nodal status	0.05*	1.00 - 3.49	
457					
458					
459	^a Cox multivariate stepwise reg	ression was perf	formed by the	e forward entry criteric	on of $p \le 0.05$ and the backward
460	elimination criterion of p<0.05.	Only the remaini	ing features a	re thus presented in this	Table.
461	^b Analysis was performed on the	basis of distant	metastases as	events.	
462	^c Performed by use of categorize	ed data.			
463	* $P \le 0.05$ indicated statistical si	gnificance.			
464		-			
465	Abbreviations: IFN-v. interfe	ron gamma.			
166		on Banna			
400					

Table 3. Multivariate Cox proportional hazards regression analysis of the prognostic features ^{a,b,c}

Table 4. Correlations between serum levels of IFN-γ and the major clinicopathological

469 parameters ^a

470

	IFN-γ	FSH	LH	E2	Grade	Nodal status	Tumor size	ER	PR	HER2	Age
IFN-γ	1.000	-	-	-	-	-	-	-	-	-	-
FSH	0.033	1.000	-	-	-	-	-	-	-	-	-
LH	-0.014	0.658*	1.000	-	-	-	-	-		-	-
E2	0.185	-0.240*	-0.070	1.000	-	-	-	-	-	-	-
Grade	-0.089	-0.124	-0.069	0.028	1.000	-	-	-	-	-	-
Nodal status	-0.283*	-0.130	-0.098	-0.087	0.240*	1.000	-	-	-	-	-
Tumor size	-0.164	-0.173	0.126	0.125	0.132	0.391*	1.000	-	-	-	-
ER	0.182	-0.114	-0.035	0.141	0.109	-0.256*	-0.185	1.000	-	-	-
PR	0.210	-0.029	-0.050	0.116	0.010	-0.187	-0.189	0.266*	1.000	-	-
HER2	-0.158	0.024	-0.047	-0.117	-0.058	0.214	0.209	-0.284*	-0.325*	1.000	-
Age	0.324*	0.158	0.186	0.011	-0.157	-0.384*	-0.356*	0.295*	0.160	-0.368*	1.000
Stage	-0.238*	-0.201	0.014	0.042	0.218	0.738*	0.780*	-0.243*	-0.121	0.160	-0.279*

471 ^a Continuous numerical values were used for calculation of Spearman's coefficients except for nodal status, disease

472 grade and stage, which are inherently categorical.

473 * Spearman's correlation coefficients with $P \le 0.05$

474

475 *Abbreviations:* IFN-γ, interferon gamma; FSH, follicle-stimulating hormone; LH, luteinizing hormone;

476 E2, estradiol; ER, estrogen receptor; PR, progesterone receptor; *HER2*, human epidermal growth factor477 receptor 2.

478



481

Figure 1. ROC and Kaplan-Meier analysis of the IFN- γ serum levels in prognosis of distant 482 and local events as endpoints. (A) Prognostic performance of IFN- γ serum levels in prediction 483 of both distant and local events. (B) Prognostic performance of IFN- γ serum levels in prediction 484 485 of distant metastases. (C) Prognostic performance of IFN-y serum levels in prediction of local recurrences. ROC analysis was based on continuous (non-categorized) feature values. (D) 486 Kaplan-Meier prognostic analysis of IFN-y serum levels with distant and local events as the 487 endpoint. (E) Kaplan-Meier prognostic analysis of IFN- γ serum levels with distant metastasis as 488 the endpoint. (F) Kaplan-Meier prognostic analysis of IFN-y serum levels with local recurrence 489 as the endpoint. Classification of patients into IFN- γ^{low} and IFN- γ^{high} subgroups was performed 490 by the use of the outcome-oriented cut-off point categorization approach. The upper solid line in 491 Kaplan-Meier plots represents the IFN- γ^{high} patient subgroup, while the lower dotted line 492 indicates the IFN- γ^{low} subgroup. P-values were calculated by the Cox proportional hazards 493 494 regression test.

Abbreviations: ROC: Receiver operating characteristic; AUC: Area under the ROC curve; IFN-γ,
interferon gamma.