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Prognostic implications OPEN of regression of metastatic axillary lymph nodes after neoadjuvant chemotherapy in patients with breast cancer

Yul Ri Chung1,2, Ji WonWoo1 , SoominAhn1 , Eunyoung Kang3 , Eun‑Kyu Kim3 , Mijung Jang4 , Sun Mi Kim4 , Se Hyun Kim5 , Jee Hyun Kim5 & SoYeon Park1*

Prognostic implications of therapeutic response of metastatic lymph nodes (LNs) to neoadjuvant chemotherapy (NAC) remain unclear in patients with breast cancer. We aimed to evaluate the prognostic value of axillary LN regression after NAC in locally-advanced breast cancer patients. Therapeutic response of the LNs was evaluated in 563 breast cancer patients and classifed into four grades according to the regression pattern. Initial pathologic N stage was estimated from the sum of the metastatic LNs and those with complete regression. In survival analyses, LN regression grade, pathologic N stage after NAC, and presumed initial pathologic N stage stratifed clinical outcome of the patients in the whole group, in both ER-positive and ER-negative subgroups, and in those with residual breast disease. On multivariate analysis, LN regression grade and presumed initial pathologic N stage were revealed as independent prognostic factors. The number of completely-responsive LNs and the ratio of non-responsive LNs also revealed a prognostic value. In conclusion, regression grade of axillary LNs and presumed initial pathologic N stage have prognostic values in breast cancer patients who receive NAC. Thus, regression of axillary LNs should be evaluated and included in pathologic reporting of post-NAC resection specimens.

Neoadjuvant chemotherapy (NAC) is regarded a standard therapy in patients with locally advanced breast cancer. Advantages of NAC include downstaging which allows inoperable tumors surgically-removable, reducing the extent of surgery, preventing systemic metastasis, and obtaining information on chemo-responsiveness^{[1](#page-10-0)}.

Pathologic complete response (pCR), defned as no residual invasive disease in both the breast and axilla afer NAC, is a well-established prognostic factor in patients with breast cancer². However, a significant proportion of patients who receive NAC does not reach pCR, and those who do not reach pCR include a broad range of patients with different responses to NAC. Thus, more detailed indices including Miller-Payne grading system which refect cellularity diference between pre- and post-treatment tumors and the Residual Cancer Burden (RCB) classification that incorporates both primary and axillary tumor burden have been devised^{[3,](#page-10-2)[4](#page-10-3)}. These systems not only reflect chemo-responsiveness of a tumor but also predict patients' clinical outcome^{4[,5](#page-11-0)}.

Axillary status afer NAC has been consistently reported as a robust prognostic factor for patient survival independent of primary tumor response^{6[,7](#page-11-2)}. In addition to the absolute number of residual metastatic LNs, some have reported the prognostic signifcance of the LN ratio (number of metastatic LNs divided by number of dissected LNs) in NAC setting^{8-[12](#page-11-4)}. However, the prognostic value of LN regression grade has not been studied widely in breast cancer.

1 Department of Pathology, Seoul National University Bundang Hospital, Seoul National University College of Medicine, 82, Gumi-ro 173 Beon-gil, Bundang-gu, Seongnam 13620, Gyeonggi, Republic of Korea. ²Pathology Center, Seegene Medical Foundation, Seoul, Republic of Korea. ³Department of Surgery, Seoul National University Bundang Hospital, Seoul National University College of Medicine, Seongnam, Gyeonggi, Republic of Korea. ⁴Department of Radiology, Seoul National University Bundang Hospital, Seoul National University College of Medicine, Seongnam, Gyeonggi, Republic of Korea. ⁵Division of Hematology and Medical Oncology, Department of Internal Medicine, Seoul National University Bundang Hospital, Seoul National University College of Medicine, Seongnam, Gyeonggi, Republic of Korea.[⊠]email: sypmd@snu.ac.kr

In this study, we evaluated the regression of metastatic LNs, estimated initial pathologic N stage, and fnally assessed their prognostic value in predicting survival of the patients with locally advanced breast cancer treated with NAC.

Results

Clinicopathologic characteristics. This study included either clinical stage II ($n=285$) or III ($n=278$) breast cancer patients treated with NAC. As for estrogen receptor (ER) status, 352 patients (62.5%) were ERpositive while the remaining 211 patients (37.5%) were ER-negative. For progesterone receptor (PR) status, 293 patients (52.0%) were PR-positive, and 270 (48.0%) were PR-negative. As for human epidermal growth receptor 2 (HER 2), 167 patients (29.7%) were HER2-positive while 396 patients (70.3%) were HER2-negative. The AC regimen consisting of doxorubicin and cyclophophamide for 4 to 6 cycles was given to 142 patients (25.2%), sequential AC-T comprising 4 cycles of AC followed by 4 cycles of docetaxel was administered in 271 patients (48.1%), and sequential AC-TH comprising 4 cycles of AC followed by 4 cycles of docetaxel and trastuzumab was given to 54 patients (9.6%). The AD regimen consisting of doxorubicin and docetaxel for 3 to 6 cycles was administered in 70 patients (12.4%), and the remaining 26 patients (4.6%) received various other regimens. The patients received breast surgery 3–4 weeks afer the last chemotherapy cycle. Table [1](#page-2-0) summarizes the clinicopathological features prior to NAC.

Chemotherapeutic response of LNs after NAC. Prior to NAC, 95 (16.9%) of the 563 patients showed no evidence of nodal metastases (cN0) while 468 (83.1%) patients were suspected of having nodal metastases by imaging studies (cN1–N3). Afer NAC, axillary LN metastasis was found in 298 patients (52.9%), and the mean number of metastatic LNs was 2.87 (standard deviation, 5.35). The mean ratio of non-responsive lymph nodes to the total number of estimated metastatic LNs was 0.61 (standard deviation, 0.45). As for LN regression grade, 136 (24.2%) patients had no metastatic LNs without regression (grade 0), 129 (22.9%) patients had no metastatic LNs with complete regression (grade 1; Fig. [1](#page-3-0)), 78 (13.9%) patients had metastatic LNs but complete regression in some LNs (grade 2), and 220 (39.1%) patients had metastatic LNs with no regression (grade 3). Initial pathologic N (ipN) stage was estimated from the sum of the number of metastatic LNs and those with a complete regressive change. There were 136 (24.2%) cases with ipN0, 232 (41.2%) cases with ipN1, 136 (24.2%) cases with ipN2, and 59 (10.5%) cases with ipN3. Table [2](#page-4-0) summarizes the clinicopathological characteristics of tumor after NAC including response of LNs.

Clinicopathologic characteristics of tumors in relation to chemo-responsiveness of LNs. The clinicopathologic characteristics of the tumors according to chemo-responsiveness of the LNs are shown in Table [3.](#page-5-0) Briefy, grade 1 (complete regression) was signifcantly associated with high histologic grade, negative ER and PR status, and high Ki-67 index prior to NAC compared to grade 2 (partial regression) or grade 3 (no regression) (all *P*<0.05). In addition, ypT0-T1, Miller-Payne grades 4–5, RCB classes 0-I, and absence of lymphovascular invasion afer NAC were also associated with complete LN response to NAC (all *P*<0.05). Conversely, in the LN non-responsive tumors encompassing grades 2 and 3, low to intermediate histologic grade, positive ER and PR status, low Ki-67 index, ypT2-T4, Miller-Payne grades 1–3, RCB classes II-III, and presence of lymphovascular invasion were more common as compared to completely node-responsive tumors (all *P*<0.05). Grade 2 and grade 3 also showed diference in clinicopathologic characteristics with negative ER and PR status, positive HER2 status, high Ki-67 index, ypT0-T1, Miller-Payne grades 4–5, and RCB classes 0-I being more frequent in grade 2 than in grade 3 (all *P*<0.05). As for breast cancer subtype, luminal A and luminal B subtypes were most prevalent in grade 3, and HER2+and triple-negative subtypes were most frequent in grade 1.

Prognostic significance of chemo-responsiveness of LNs. Survival analysis of the 563 patients revealed an association between four LN regression grades and disease-free survival of the patients, with grade 0 having the most favorable survival and grade 3 displaying the worst survival $(p<0.001)$, as a whole; $p=0.049$, grade 0 vs. grade 1; *p*=0.061, grade 1 vs. grade 2; *p*=0.377, grade 2 vs. grade 3; Fig. [2](#page-6-0)). Pathologic N stage afer NAC (ypN) also showed an association with disease-free survival $(p<0.001$, as a whole; $p=0.003$, ypN0 vs. ypN1; *p*=0.157, ypN1 vs. ypN2; *p*=0.146, ypN2 vs. ypN3; Fig. [2](#page-6-0)). As for ipN stage before NAC, we observed that ipN0 had the longest survival, and there was an almost stepwise decline in survival with each increase in ipN stage (*p*<0.001, as a whole; *p*=0.013, ipN0 vs. ipN1; *p*=0.012, ypN1 vs. ypN2; *p*=0.096, ypN2 vs. ypN3; Fig. [2](#page-6-0)).

Next, we performed the same set of analyses according to ER status. In ER-negative group $(n=211)$, there was a signifcant diference in disease-free survival among the four regression grades as a whole (*p*<0.001; Fig. [3\)](#page-6-1). However, grades 0 and 1 showed similar favorable survival while grades 2 and 3 revealed poor survival alike (*p*=0.524, grade 0 vs. grade 1; *p*=0.001, grade 1 vs. grade 2; *p*=0.604, grade 2 vs. grade 3). As for pathologic N stage after NAC, there was a stepwise decrease in survival with increased ypN stage (p < 0.001, as a whole; *p*=0.043, ypN0 vs. ypN1; *p*=0.001, ypN1 vs. ypN2; *p*=0.006, ypN2 vs. ypN3; Fig. [3](#page-6-1)). Presumed initial pathologic pN stage also showed an association with disease-free survival as a whole (*p* <0.001; Fig. [3\)](#page-6-1), but there was no survival difference between ipN0 and ipN1 ($p=0.361$, ipN0 vs. ipN1; $p=0.001$, ypN1 vs. ypN2; $p=0.003$, ypN2 vs. ypN3).

In ER-positive group (n=352), LN regression grade, ypN stage, and ipN stage were associated with diseasefree survival of the patients as a whole ($p = 0.002$, $p = 0.029$, $p = 0.023$; Fig. [3\)](#page-6-1), but there was no survival difference between LN regression grades 1 and 2, between ypN1, ypN2, and ypN3 or between ipN1, ipN2, and ipN3.

Table 1. Clinicopathological characteristics of study population. *IDC* invasive ductal carcinoma, *ILC* invasive lobular carcinoma, *AC* doxorubicin plus cyclophosphamide, *AD* doxorubicin plus docetaxel, *AC-T* AC followed by docetaxel, *AC-TH* AC followed by docetaxel and trastuzumab.

When we analyzed the association between LN status and survival in the patient group with residual breast disease, we also observed a diference in survival with respect to LN regression grade, ypN stage, and ipN stage (*p*=0.005, *p*=0.001, *p*<0.001, respectively).

Multivariate analyses including chemo‑responsiveness of LNs. We performed multivariate analyses to evaluate whether nodal response to NAC had an independent prognostic value. In the whole group, ypT

Figure 1. Representative images of complete tumor regression in axillary lymph nodes. **(A)** A large area of intranodal fbrosis is noted in the center of lymph node. **(B)** Magnifcation of A reveals depletion of lymphocytes and replacement with dense fbrous tissue. **(C)** Nodal architecture is obliterated with infltration of foamy histiocytes and intranodal fbrosis. Tickened lymph node capsule is also found. **(D)** Magnifcation of **(C)** shows heavy infltration of foamy histiocytes.

stage (p <0.001), Miller-Payne regression grade (p <0.001), and RCB class (p <0.001) were associated with disease-free survival as well as LN regression grades, ypN stage, and ipN stage. As LN regression grades, ypN stage, and ipN stage were highly correlated with each other (LN regression grades and ypN stage, r=0.775; LN regression grades and ipN stage, $r = 0.663$; ypN stage and ipN stage, $r = 0.801$), multivariate analyses were conducted in diferent modes. In multivariate analysis, LN regression grade and ipN stage, but not ypN stage were revealed as independent prognostic factors ($p=0.016$, $p=0.006$, $p=0.097$, respectively; Table [4](#page-7-0)).

In the patient group with residual breast cancer, ypT stage, post-NAC ER status, post-NAC Ki-67 index, LN regression grade, ypN stage, and ipN stage were found to be independent prognostic factors for disease-free survival (all $p < 0.05$; Table [5](#page-8-0)).

Prognostic value of number of LNs with complete regression. In patients with no metastatic LNs afer NAC (ypN0), those belonging to LN regression grade 0 had a longer disease-free survival compared to those in LN regression grade 1 (*p*=0.049). We performed a receiver operating characteristic (ROC) curve analysis to fnd the cutof value for the number of LNs with complete response that maximized the sum of sensitivity and specificity in predicting tumor recurrence (AUC=0.736; Fig. [4\)](#page-9-0). Using a cutoff value of 2.5, comparison of patients with a number of completely-responsive LNs less than 3 with those having a completely-responsive LN number greater than or equal to 3 revealed a more favorable clinical outcome of the former compared to the latter (*p*<0.001; Fig. [4\)](#page-9-0).

Prognostic value of ratio of non‑responsive LNs. We also performed a ROC curve analysis to fnd the cutof value of the ratio of non-responsive LNs to the total number of estimated metastatic LNs before treatment that maximized the sum of sensitivity and specifcity in predicting tumor recurrence in patients with presumed metastatic LNs prior to NAC (AUC=0.608; Fig. [5\)](#page-9-1). As a result, 0.348 was identifed as the cutof value. Survival analysis revealed that patients with a ratio of non-responsive LNs to the total number of metastatic nodes less than 0.348 had a signifcantly longer disease-free survival compared to those with a ratio over 0.348 (*p*<0.001; Fig. [5\)](#page-9-1).

Table 2. Clinicopathological characteristics of tumors afer neoadjuvant chemotherapy. *NAC* neoadjuvant chemotherapy. a Initial pathologic N stage was estimated from the sum of number of positive lymph nodes and those with a regressive change. ^bThese characteristics were evaluated in cases with residual disease in breast.

Table 3. Clinicopathological characteristics of tumors according to chemo-responsiveness of lymph nodes. *NAC* neoadjuvant chemotherapy, *RCB* residual cancer burden. *P* values were calculated by the chi-square test or Fisher's exact test. Numbers in parentheses indicate percentage. ^aCorrections for multiple testing were made by Bonferroni method, and adjusted (adj.) p values were presented. ^bThese characteristics were evaluated in cases with residual disease in breast.

Figure 2. Disease-free survival based on lymph node (LN) status after neoadjuvant chemotherapy. There is a stepwise decline in survival with each increase in LN regression grade **(A)**, ypN stage **(B)**, and presumed initial pathologic N stage **(C)** in the whole group.

Figure 3. Disease-free survival based on lymph node (LN) status after neoadjuvant chemotherapy by estrogen receptor (ER) status. In ER-negative subgroup, signifcant survival diference is observed based on LN regression grade **(A)**, ypN stage **(B)**, and initial pathologic N (ipN) stage **(C)**, while in ER-positive subgroup, LN regression grade **(D)**, ypN stage **(E)**, and ipN stage **(F)** show less signifcant associations with patients' survival.

Discussion

Prognosis of breast cancer patients receiving NAC is associated with two factors at large: tumor biology and tumor response to chemotherapy in the breast and/or axilla. In this study, we focused on the second factor, that is, nodal response to NAC as a potential prognostic factor. Researchers have evaluated the axillary status using several diferent parameters: absolute number of metastatic LNs afer NAC (refected in pathologic N stage, ypN), size of metastasis, LN ratio (ratio of metastatic LNs among total number of excised LNs), clinical N stage, and extracapsular extension^{[9](#page-11-5)[,12–](#page-11-4)15}. However, among the factors related to LN status post-NAC, the prognostic value of LN regression pattern has not been studied widely in breast cancer. In as early as 2003, Newman et al.^{[16](#page-11-7)} reported that detection of treatment efect in axillary LNs could identify patients with an outcome intermediate between node-positive and node-negative patients. However, this study had included only 71 cases to deduce statistically-signifcant conclusions. Also, in their survival analysis, all patients who showed nodal regression were grouped into the same group regardless of presence or absence of metastasis. In this study, we observed that patient survival was associated with LN regression grade with the best outcome belonging to grade 0 and the worst outcome belonging to grade 3.

It has been reported that NAC downstages the axillary nodal status, and the rate of negative conversion ranges as widely as 20 to 60%^{[17](#page-11-8)-[19](#page-11-9)}. Studies have shown that patients who undergo a negative conversion of the axillary nodes have excellent survival regardless of residual breast disease^{[7,](#page-11-2)[18,](#page-11-10)[20–](#page-11-11)22}. On a similar note, Newman et al. reported that patient survival was dependent on not only node positivity vs. negativity but also on whether the nodes were downstaged[16](#page-11-7). In the present study, 129 (22.9%) patients underwent a negative nodal conversion (ypN0 with regression, LN regression grade 1). Fayanju et al. reported that patients with a node-positive disease at presentation who achieve a pCR have a prognosis comparable to those who are clinically node-negative at

Table 4. Multivariate analyses of disease-free survival in the whole group. *HR* hazard ratio, *CI* confdence interval, *RCB* residual cancer burden, *ipN stage* initial pathologic N stage.

presentation²³. However, we observed a significant difference in survival between LN regression grade 0 (nodenegative at presentation) and LN regression grade 1 (negative nodal conversion) with grade 0 having a longer disease-free survival as a whole. Such discrepancy in results might be due to the diference in study population since Fayanju's study included only those with clinical N0 and N1 patients and excluded those who showed a discordant or partial response in the breast and axilla. Furthermore, in further analyses, we found that prognostic signifcance of negative nodal conversion difered according to ER status. While LN regression grade 1 revealed poorer disease-free survival compared to LN regression grade 0 in ER-positive subset, LN regression grades 0 and 1 showed similar favorable prognosis in ER-negative subset. Furthermore, ER-negative breast cancer showed signifcant diference in survival between regression grade 1 and 2, whereas ER-positive tumors revealed no survival diference between them. Although the reason for this discrepant result by ER status remains unclear, it may be partly explained by the fact that in previous studies, pCR has been consistently reported to be associated with improved survival in ER-negative breast cancers including HER2-positive and triple-negative subtypes, but not in luminal A subtype[24](#page-11-14),[25](#page-11-15). Further studies are warranted to see if the prognostic signifcance of LN regression pattern does depend on ER status or breast cancer subtype.

In the ypN0 group, we compared patient survival according to the number of completely-responsive LNs and observed that patients with a completely-responsive LN number less than 3 had a more favorable outcome than those with a completely-responsive LN number greater than or equal to 3. It would be reasonable to infer that those with a smaller number of completely-responsive LNs had a smaller number of LN metastasis before NAC, which in turn, would mean less systemic tumor burden that led to improved survival.

In those patients with initial nodal involvement assessed by chemotherapeutic efect in the LNs, we investigated whether the ratio of non-responsive LNs to the total number of estimated metastatic LNs would have a prognostic value. Afer obtaining the cutof ratio of 0.348 from ROC curve analysis, we observed that those patients with a non-responsive nodal ratio over 0.348 had poorer outcome compared to those less than 0.348. Such result suggests that in addition to evaluating LN regression pattern afer NAC, evaluating the non-responsive LN ratio may provide additional prognostic information in patients who receive NAC.

Our multivariate analysis revealed the following post-NAC factors to be independently prognostic in the NAC setting: ypT stage, RCB class, LN regression grade, and ipN stage. In those with residual cancer in the breast, ypT stage, post-NAC ER status, post-NAC Ki-67 index, LN regression grade, ypN stage, and ipN stage were independent prognostic factors. From the above factors, ypT stage, pN stage, RCB class, Ki-67 index, and ER status have already been reported to be prognostic of patient outcome in breast cancer afer NA[C12](#page-11-4)[,15](#page-11-6)[,26](#page-11-16)[,27](#page-11-17). A novel fnding worth noting is the prognostic signifcance of LN regression grade determined by presence or absence of complete LN regression and residual nodal metastasis, and ipN stage determined by adding the

Table 5. Multivariate analyses of disease-free survival in the patient group with residual breast disease. *HR* hazard ratio, CI confidence interval, RCB residual cancer burden, ipN stage initial pathologic N stage. ^apost-NAC status.

number of metastatic LNs and those with a complete regressive change; we believe this study to be the frst one to have evaluated such parameters. Our results may support the idea that axillary status represents systemic micrometastatic burden. Initial pathologic N stage may be a more accurate assessment of a person's systemic micrometastatic burden rather than ypN stage. Noting chemotherapeutic efects in the post-operative LNs and assessing ipN stage may help stratify patient outcome more accurately. Currently, RCB is the most widely-used index that takes into account both the primary tumor bed response and lymph node status. While it may not be feasible to incorporate the categorical lymph node regression grade into the RCB index, adding numerical parameters such as the number of completely-responsive lymph nodes or the ratio of non-responsive lymph node over total initial metastatic lymph nodes to the RCB index may be useful in making a new prognostic index afer further investigations.

On a fnal note, while axillary nodal dissection has the advantage of accurate assessment of lymph node status in breast cancer patients, it can result in unwanted morbidities such as numbness and debilitating lymphedema; this is the rationale for sentinel node biopsy and the more recent targeted axillary dissection where only the pre-marked lymph nodes suspected of having metastasis are excised in addition to the sentinel nodes. It would be interesting to evaluate the prognostic value of the lymph node regression grade in such less extensive lymph node surgery in further studies.

This study has some limitations. First, we evaluated nodal treatment response using a representative hematoxylin & eosin-stained section rather than serial sections in non-sentinel lymph nodes; thus, we may have missed hidden metastatic foci which could have been present in deeper sections. Therefore, ipN stage estimated by adding the number of LNs with complete chemotherapeutic efect and metastatic nodes may not be exactly the

Figure 4. Disease-free survival based on the number of completely-responsive lymph nodes (LNs). **(A)** A receiver operating characteristic curve analysis yields the highest area under curve (AUC) at a value of 2.5 as the cutof for the number of completely-responsive LNs. **(B)** In ypN0 subgroup, patients with a number of completely-responsive LNs less than 3 show longer disease-free survival compared to those having a completelyresponsive LN number greater than or equal to 3.

Figure 5. Disease-free survival based on the ratio of non-responsive lymph nodes (LNs) to the estimated total metastatic LNs. **(A)** A receiver operating characteristic curve analysis yields the highest area under curve (AUC) at a value of 0.348 as the cutof for the ratio of non-responsive LNs to the estimated total initial metastatic LNs. **(B)** Patients with a ratio of non-responsive LNs to the total initial metastatic LNs less than 0.348 show a signifcantly longer disease-free survival compared to those with a ratio over 0.348.

same as the true ipN stage. Secondly, while we included only intranodal fbrosis and foamy histiocyte infltration as representative of treatment efect, other subtle changes such as a thickened LN capsule can also be a treatment respons[e28.](#page-11-18) Tird, the follow-up period was relatively short with a median of 40 months to assess overall survival. Lastly, NAC regimen was not homogeneous, and trastuzumab treatment was given as part of NAC regimen in only some HER2-positive breast cancer patients due to reimbursement issues in Korea in the past.

In summary, we investigated the prognostic signifcance of axillary LN response in breast cancer patients who received NAC. LN regression grade, presumed ipN stage, number of completely-responsive LNs, and ratio of non-responsive LNs stratifed clinical outcome of the patients. In multivariate analysis, LN regression grade and presumed ipN stage were revealed as independent prognostic factors. Further large, prospective studies are warranted to confrm whether LN regression and presumed ipN stage should be routinely evaluated and reported in breast cancer patients who receive NAC.

Methods

Patients and samples. We used clinicopathological data of 571 consecutive patients with primary breast cancer who underwent breast-conserving surgery or mastectomy afer NAC at Seoul National University Bundang Hospital from October 2004 to December 2015, that had been collected in our previous study²⁹. After excluding 8 patients who received sentinel node biopsy prior to NAC, 563 patients were fnally included in this study. All patients were diagnosed with invasive carcinoma of the breast via core needle biopsy.

Medical records were reviewed to acquire clinical information of the patients including age, sex, initial clinical T and N stage, chemotherapeutic regimen, cycle of NAC, tumor recurrence, and patient survival. Pathologic information was collected from the pathology reports and the following information was recorded: histologic

subtype, histologic grade, pathologic T and N stage afer NAC, lymphovascular invasion, and pre- and post-NAC biomarker status.

Pathologic response to NAC was evaluated with the Miller-Payne regression grading^{[4](#page-10-3)} and Residual Cancer Burden class³. Pathologic complete response (pCR) was defined as the complete disappearance of all invasive tumor cells from the breast and regional LNs regardless of the presence of residual ductal carcinoma in situ in the breast 30 .

Tis study was approved by the Institutional Review Board of Seoul National University Bundang Hospital (Protocol # B-1601/332-304), and it was conducted in accordance with the Declaration of Helsinki. Informed consent was waived by the same IRB who approved this study.

Pathologic evaluation of LNs and defnition of response. Of the 563 patients, 488 patients (86.7%) received axillary LN dissection with or without sentinel node biopsy, and the remaining 75 patients (13.3%) received sentinel node biopsy only after NAC. The median number of harvested LNs was 20 (range, 1-65). The sentinel nodes were cut in 2 mm intervals and examined in serial sections. LNs other than sentinel nodes were examined in a single representative section.

For this study, LN status afer NAC was carefully evaluated. Histologic signs of tumor regression in LNs were defned as intranodal fbrosis and/or foamy histiocyte infltration obliterating the nodal architecture, similar to previous studies[16](#page-11-7),[28](#page-11-18)[,31.](#page-11-21) On the other hand, the presence of hemosiderin-laden macrophages only was not regarded as a therapeutic efect since a prior procedure such as large core biopsy of breast or fne needle aspiration of LNs can result in similar histology. We counted the number of LNs with complete tumor regression, and using this data, we estimated the initial number of metastatic LNs before NAC. In addition, the ratio of LNs with residual disease to the total number of estimated metastatic LNs before NAC was calculated.

Regression of LNs was graded as follows: grade 0, no metastasis without regression; grade 1, no metastasis with complete regression (complete response); grade 2, metastasis, but complete regression in some LNs (partial response); grade 3, metastasis and no complete regression in LNs (no response). Initial pathologic N stage was estimated by the sum of the number of metastatic LNs and LNs with a complete regressive change.

Biomarker status and determination of breast cancer subtype. Immunohistochemical results for standard biomarkers including ER, PR, HER2, p53, and Ki-67 had been collected during the previous study^{[29](#page-11-19)}. ER and PR were regarded as positive if there were at least 1% positive tumor nuclei³². HER2 expression was scored according to 2013 ASCO/CAP guidelines³³. HER2 status was determined by HER2 in situ hybridization (ISH) for cases that were equivocal on HER2 immunohistochemistry, and HER2 equivocal cases in ISH were regarded as HER2-non-amplifed for statistical analysis. For Ki-67 proliferation index, tumors with 20% or more positive cells were regarded as having high indices 34 .

Standard biomarker status was used to determine the breast cancer subtype of the tumors according to the 2011 St. Gallen Expert Consensus as follows: luminal A (ER + and/or PR+ , HER2-, Ki-67 < 14%), luminal B (ER+and/or PR+, HER2-, Ki-67≥14%; ER+and/or PR+, HER2+), HER2+(ER-, PR-, HER2+), and triplenegative subtype (ER-, PR-, HER2-) 35 .

Statistical analysis. Pearson's chi-square test or Fisher's exact test was used to compare clinicopathological features of tumors according to chemo-responsiveness of LNs and corrections for multiple testing were made by Bonferroni method. A receiver operating characteristic (ROC) curve analysis was performed to identify cutof values for the number of LNs with a complete pathologic response and ratio of LNs with residual disease to estimated total metastatic LNs before treatment that maximized the sum of sensitivity and specifcity in predicting tumor recurrence. Disease-free survivals were estimated by Kaplan–Meier survival curves and statistical signifcances were determined with the log-rank test. Pearson correlation tests were used to assess the associations between LN regression grade, pathologic N stage afer NAC, and estimated initial pathologic N stage. Multivariate analysis was performed by Cox proportional hazards regression model with backward stepwise selection method, using covariates that were associated with survival of the patient in the univariate analyses. Hazard ratios (HR) and their 95% confdence intervals (CI) were calculated for each variable. *P* values less than 0.05 were considered statistically signifcant, and all reported *p* values were two-sided. All statistical analyses were performed using Statistical Package, SPSS version 25.0 for Windows (IBM Corp., ARMONK, NY).

Data availability

The datasets used and/or analyzed during the current study are available from the corresponding author on reasonable request.

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Authors contributions

Y.R.C. participated in the interpretation and analysis of data and drafed the manuscript. J.W.W. participated in the analysis of the data. S.A. participated in the acquisition and interpretation of pathologic data. E.K., E.K.K., M.J., S.M.K., S.H.K. and J.H.K. participated in the acquisition of clinical data. S.Y.P. conceived of the study, participated in its design, and was responsible for preparation of the manuscript. All authors reviewed the manuscript.

Competing interests

The authors declare no competing interests.

Additional information

Correspondence and requests for materials should be addressed to S.Y.P.

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