

## Different spatial distributions of brain metastases from lung cancer by histological subtype and mutation status of epidermal growth factor receptor

Koji Takano, Manabu Kinoshita, Masatoshi Takagaki, Mio Sakai, Souichirou Tateishi, Takamune Achiha, Ryuichi Hirayama, Kazumi Nishino, Junji Uchida, Toru Kumagai, Jiro Okami, Atsushi Kawaguchi, Naoya Hashimoto, Katsuyuki Nakanishi, Fumio Imamura, Masahiko Higashiyama, and Toshiki Yoshimine

Department of Neurosurgery, Osaka Medical Center for Cancer and Cardiovascular Diseases, Osaka, Japan (K.T., M.K., M.T., T.A.); Department of Radiology, Osaka Medical Center for Cancer and Cardiovascular Diseases, Osaka, Japan (M.S., S.T., K.N.); Department of Thoracic Oncology, Osaka Medical Center for Cancer and Cardiovascular Diseases, Osaka, Japan (K.N., J.U., T.K., F.I.); Department of General Thoracic Surgery, Osaka Medical Center for Cancer and Cardiovascular Diseases, Osaka, Japan (J.O., M.H.); Department of Neurosurgery, Osaka University Graduate School of Medicine, Suita, Japan (R.H., N.H., T.Y.); Department of Biomedical Statistics and Bioinformatics, Kyoto University Graduate School of Medicine, Kyoto, Japan (A.K.)

**Corresponding Author:** Manabu Kinoshita MD, PhD, Department of Neurosurgery, Osaka Medical Center for Cancer and Cardiovascular Diseases, 1-3-3 Nakamichi, Higashinari-ku, Osaka, 537-8511, Japan (mail@manabukinoshita.com).

**Background.** The purpose of this study was to test the hypothesis that the genetic backgrounds of lung cancers could affect the spatial distribution of brain metastases.

**Methods.** CT or MR images of 200 patients with a total of 1033 treatment-naive brain metastases from lung cancer were retrospectively reviewed (23 by CT and 177 by MRI). All images were standardized to the human brain MRI atlas provided by the Montreal Neurological Institute 152 database. Locations, depths from the brain surface, and sizes of the lesions after image standardization were analyzed.

**Results.** The posterior fossa, the anatomic “watershed areas,” and the gray-white matter junction were confirmed to be more commonly affected by lung cancer brain metastases, and brain metastases with epidermal growth factor receptor (EGFR) L858R mutation occurred more often in the caudate, cerebellum, and temporal lobe than those with exon 19 deletion of EGFR. Median depths of the lesions from the brain surface were 13.7 mm (range, 8.6–21.9) for exon 19 deleted EGFR, 11.5 mm (6.6–16.8) for L858R mutated, and 15.0 mm (10.0–20.7) for wild-type EGFR. Lesions with L858R mutated EGFR were located significantly closer to the brain surface than lesions with exon 19 deleted or wild-type EGFR ( $P = .0032$  and  $P < .0001$ , respectively). Furthermore, brain metastases of adenocarcinoma lung cancer patients with a history of chemotherapy but not molecular targeted therapy were located significantly deeper from the brain surface ( $P = .0002$ ).

**Conclusion.** This analysis is the first to reveal the relationship between EGFR mutation status and the spatial distribution of brain metastases of lung cancer.

**Keywords:** EGFR, lung cancer brain metastasis, location analysis, MRI.

Brain metastases (BMs) are diagnosed in more than 200 000 patients in the United States each year and are the most prevalent malignant tumors of the central nervous system, outnumbering primary CNS tumors by more than 10-fold.<sup>1</sup> Over 20% of all cancer patients develop BMs and have a 9-month median survival with maximal treatment,<sup>2–4</sup> making BMs among the major causes of systemic cancer mortality.<sup>2</sup> Among many types of

cancers, lung and breast cancers are by far the most common tumors to present with BMs,<sup>5,6</sup> and recent years' improvements in imaging and treatments for primary cancer lesions seem to have increased the incidence of BMs.<sup>4,7–9</sup>

The heterogeneity of BMs has been reported since the 1950s. In early years, such studies were performed postmortem, whereas image analysis with CT or MRI has been the

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main approach in recent years, demonstrating preferential involvement of the anatomic “watershed areas,” the gray-white matter junction, and cerebellum; and a relationship between the spatial distribution of BMs and primary cancer types has been shown.<sup>10–16</sup> In most image analyses, researchers used standard anatomic templates for anatomic reference, and they documented the anatomic locations of tumors by mere observation of those templates. Today, with the advent of image registration and 3D structure deformation algorithms, it is now possible to deform and register individual brain images onto an averaged standard brain image, enabling detection of even the slightest difference in spatial distribution.<sup>17</sup> Using this technique for cross-patient lesion location analysis, Bender and Tomé<sup>18</sup> and Quattrocchi et al<sup>19</sup> analyzed the spatial distribution of BMs more objectively than before, finding that BMs preferentially involve the parieto-occipital lobes and cerebellum in lung cancer patients and the cerebellum in breast cancer patients.

On the other hand, molecular and genetic information about tumors, such as epidermal growth factor receptor (EGFR) mutations in non-small cell lung cancer (NSCLC), has recently become increasingly important. EGFR mutations have been reported to be highly associated with sensitivity to EGFR tyrosine kinase inhibitors,<sup>20,21</sup> and nearly 90% of all known mutations are located in exon 19 (in-frame deletion; exon 19 deletion of EGFR) and exon 21 (L858R point mutation; EGFR L858R mutation).<sup>22</sup> There have been a few reports regarding the relationship between BMs and EGFR mutation status. Patients with EGFR-mutated NSCLC have been reported to develop more BMs, in number<sup>23</sup> and frequency,<sup>24</sup> than those with wild-type EGFR NSCLC. Moreover, patients with NSCLC harboring exon 19 deletion of EGFR have been reported to have BMs more often,<sup>25</sup> especially miliary BMs,<sup>26</sup> than those with EGFR L858R mutated NSCLC. To the best of our knowledge, however, no report has discussed the relationship between the spatial distribution of BMs and EGFR mutation status. We hypothesized that the molecular and genetic background of tumors could affect the spatial distribution of BMs. Comprehensive understanding of the molecular mechanisms that affect BMs could lead to development of novel agents that prevent this disease. Understanding different spatial distributions of BMs according to their genetic background might also make possible more precise prophylactic irradiation adjustments in lung cancer. To test this hypothesis, the spatial distribution of BMs was analyzed using cross-patient lesion location analysis focusing on lung cancer BMs. More specifically, the spatial distribution of BMs was compared by EGFR mutation status.

## Materials and Methods

### Patients and Data Collection

CT or MR images of 254 lung cancer patients with radiation- and operation-naïve BMs from 2006 to 2014 were retrospectively reviewed. Patients who underwent systemic chemotherapy, molecular targeted therapy with agents such as gefitinib and erlotinib, or radiation therapy were included, while patients who underwent previous neurosurgery or brain radiation therapy were excluded. In addition, 6 patients were excluded because of

other malignant diseases within 5 years prior to BM identification, and 48 patients were excluded because enhanced CT or MRI of the brain was unavailable. Thus, iodine-enhanced CT or gadolinium-enhanced MRI T1-weighted images (1.5 or 3.0T) of 200 patients in whom initial BMs were found were included in the analysis (23 by CT, 95 by 1.5T MRI, 82 by 3.0T MRI; 79 by thin slice with <1.5 mm thickness, 121 with 5 mm thickness). All patients had histopathological diagnoses of lung cancer by bronchoscopic, percutaneous needle-guided, or surgical biopsies, and some of the tumor samples were analyzed for EGFR mutation status by polymerase chain reaction (PCR). The study was conducted in accordance with the Declaration of Helsinki, and the internal review board of the institution approved clinical data to be used for this research.

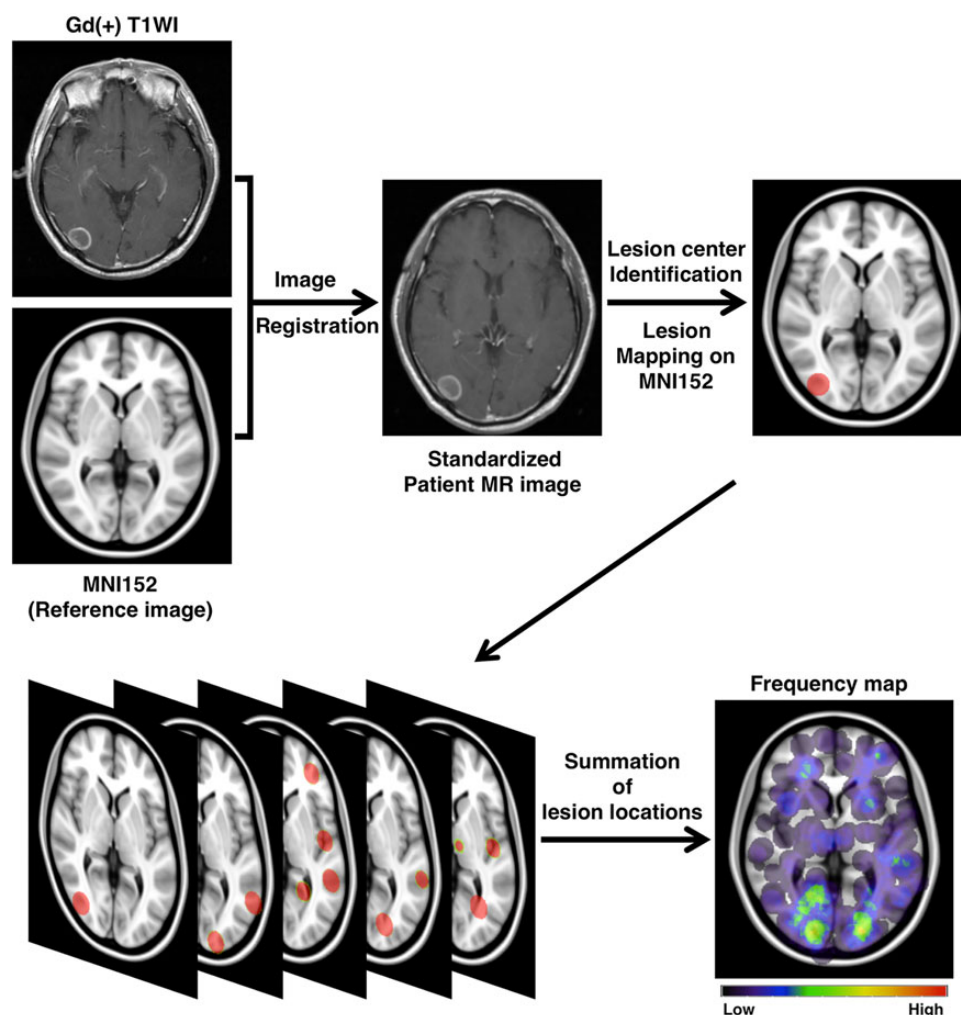
### Image Registration and Frequency Map Reconstruction

All DICOM (Digital Imaging and Communications in Medicine) images were converted to the NIfTI (Neuroimaging Informatics Technology Initiative) format using the dcm2nii software (<http://www.cabiatl.com/mricro/mricron/dcm2nii.html>). These NIfTI data were registered to a 1.0-mm isotropic, high-resolution T1-weighted brain atlas provided by the Montreal Neurological Institute (MNI152 database) using a mutual information algorithm with a 12-degree of freedom transformation using the Functional Magnetic Resonance Imaging of the Brain (fMRI) Software Library/fMRI Linear Image Registration Tool (FSL-FLIRT; <http://fsl.fmrib.ox.ac.uk/fsl/fslwiki/FSL>) (Fig. 1). Image registrations were visually confirmed in all cases, and some required rough manual adjustment before using FSL-FLIRT.<sup>17,27</sup>

All datasets were exported to in-house software written in MatLab 7.14 (MathWorks) for further analysis. The center voxel of the contrast-enhanced lesion was manually identified for each lesion, and that voxel was defined as the primary site of occurrence (Supplementary Fig. S1). For frequency map reconstruction, all lesions were reconstructed to a site-centered spherical shape with a diameter of 20 mm (Fig. 1). All spherical lesions were summed and averaged by the number of patients. A heat-map for the lesion occurrence frequency was reconstructed and superimposed on the reference MNI152 (Fig. 1).

### Analysis of Location in the Brain

To reveal the heterogeneity of BMs in the brain, the location of each lesion was determined. The center voxel of the contrast-enhanced lesion, defined as the tumor location, was registered to the MNI structural atlas<sup>28</sup> and automatically assigned to 10 segments: deep white matter and brainstem, caudate, cerebellum, frontal lobe, insula, occipital lobe, parietal lobe, putamen, temporal lobe, and thalamus (Supplementary Fig. S2). The metastatic frequency of occurrence per unit volume of each segment was compared among primary lung cancer subgroups: adenocarcinoma (Ad), small cell carcinoma (SCC), squamous cell carcinoma (Sq), and large cell carcinoma (LCC). In the Ad group, it was also compared according to EGFR mutation status: wild-type, exon 19 deletion, and L858R point mutation. Moreover, the metastatic frequency in the hippocampus was analyzed using the Harvard-Oxford cortical and subcortical atlases provided with FSL (Supplementary Fig. S3).



**Fig. 1.** Schematic illustration of the flow of image analysis. Each patient's brain MR or CT image was deformed and registered to standard brain MRI (MNI152) using FSL-FLIRT. The center of the tumor was manually located, and a 20-mm-diameter sphere was created to visualize the selected location. Finally, spheres from each patient were overlaid to create a frequency map. Gd(+) T1WI, gadolinium T1-weighted image.

### Analysis of Distance from the Brain Surface to the Lesion

To demonstrate preferential involvement of BMs at the gray-white matter junction, the distance from the brain surface to the center of each lesion (DEPTH) was calculated automatically using in-house software. The surface of the brain was extracted from MNI152, and the shortest distance from the brain surface to the center of the lesion was calculated automatically. Subsequently, DEPTH was compared among primary lung cancer subgroups and according to EGFR mutation status in the Ad group. In addition, the maximal diameter of the lesion after MNI152 registration was manually measured in 3 dimensions for adenocarcinomas.

### Statistical Analysis

Statistical analysis was performed by JMP version 10 and SAS version 9.3 (SAS Institute). A threshold level of 0.05 was established for significance. The chi-square test and Poisson

regression with the volume of each segment being handled as an offset were used for location analysis. The Kruskal-Wallis test and the Steel-Dwass test (the nonparametric analog comparable to Tukey's range test) were used for group comparisons. For multivariate analysis, a linear regression model was used to identify significant variables. Data are shown as medians with interquartile ranges.

## Results

### Frequency Map of Brain Metastatic Lesions from Lung Cancer

In total, 1033 lesions in 200 patients were analyzed: 712 lesions in 129 patients for Ad, 186 lesions in 28 patients for SCC, 105 lesions in 27 patients for Sq, and 11 lesions in 5 patients for LCC. Diagnoses of 19 lesions in 11 patients could not be reached in detail, being ascribed as "non-small cell

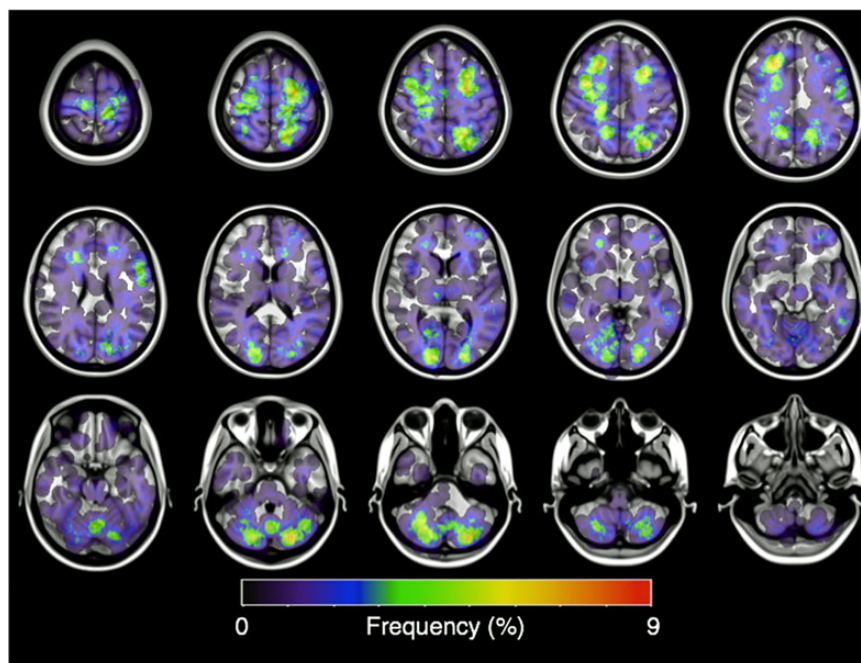
lung cancer (NSCLC)” or “Ad or Sq.” Among the 129 patients with Ad, 115 were examined for EGFR mutation status, resulting in 62 patients with EGFR mutation and 53 patients with wild-type EGFR. In patients with EGFR mutation, 28 patients had exon 19 deletion, and 31 patients had L858R point mutation, while 3 patients had other mutations. No patient had both exon 19 deletion and L858R point mutation. The number of BMs in each patient was not significantly different among primary lung cancer subgroups (2 [1–6] for Ad, 2 [1–5] for SCC, 2 [1–4] for Sq, 3 [1–3] for LCC;  $P = .92$ ), while it showed a borderline difference by EGFR mutation status (4 [1.25–6.75] for exon 19 deletion, 2 [1–4] for L858R point mutation, 2 [1–6]

for wild-type;  $P = .080$ ). Detailed characteristics of the patients are shown in Table 1.

One hundred and seventy-seven MR images and 23 CT images were successfully transformed, and the coordinates corresponding to the center of each lesion were registered onto MNI152. All of the lesions were successfully reconstructed to a spherical shape with a 20-mm diameter on MNI152 (Fig. 2 and Supplementary Figs. S4–S7). The posterior fossa,<sup>11–13,18,19</sup> the anatomic “watershed areas,”<sup>10,15,16,19</sup> and the gray-white matter junction<sup>16</sup> were visually confirmed to be the most commonly involved areas of lung cancer BMs, consistent with past studies.

**Table 1.** Patient characteristics

	All cancers	Adenocarcinoma	Small Cell Carcinoma	Squamous Cell Carcinoma	Large Cell Carcinoma	Unable to Classify
Patients, <i>n</i>	200	129	28	27	5	11
M/F, <i>n</i>	134/66	72/57	25/3	24/3	4/1	9/2
Age, y, at diagnosis of primary tumor (mean $\pm$ SD)	62 $\pm$ 9	62 $\pm$ 9	65 $\pm$ 10	62 $\pm$ 10	65 $\pm$ 7	65 $\pm$ 7
Number of metastases, <i>n</i>	1033	712	186	105	11	19
EGFR mutation status (mutation/wild-type), <i>n</i>		62/53				
		exon 19 deletion	28			
		L858R point mutation	31			
		others	3			



**Fig. 2.** Axial image of the frequency map of all brain metastases from lung cancer. Note that the lesions are mostly concentrated at the gray-white matter junction and the cerebellum.

**Table 2.** Distribution of brain metastases

	Volume, mm <sup>3</sup>	All Tumors	Adenocarcinoma	Adenocarcinoma			Large Cell Carcinoma	Small Cell Carcinoma	Squamous Cell Carcinoma
				With Wild-Type EGFR	With Exon 19 Deletion of EGFR	With L858R Mutated EGFR			
Deep white matter and brainstem	161 082	82	41	20	11	7	0	26	14
Caudate	32 353	14	6	3	1	2	0	3	1
Cerebellum	294 552	159	113	49	30	29	2	38	7
Frontal lobe	708 087	310	229	96	72	48	3	39	34
Insula	33 041	13	8	5	3	0	0	2	2
Occipital lobe	236 594	136	89	35	36	12	2	25	14
Parietal lobe	421 103	206	142	52	58	23	3	41	21
Putamen	26 171	8	6	4	2	0	0	0	2
Temporal lobe	356 227	87	64	29	15	13	1	12	8
Thalamus	34 802	18	14	4	8	1	0	0	2
Total	2 304 012	1033	712	297	236	135	11	186	105

### Distribution of BMs Is Not Uniform in the Brain

The number of BMs in each segment is shown in Table 2. In gross BMs, the frequency of occurrence in each segment did not correlate with the volume of the segment ( $P < .0001$ ), indicating the heterogeneity of BMs in the brain. There were significant biases for cerebellar, occipital, and temporal metastases compared with what would be predicted based solely on relative brain volume (chi-square test:  $P = .012$ ,  $P = .002$ ,  $P < .0001$ , respectively). The heterogeneity of BMs was also confirmed in Ad and SCC, but not in Sq ( $P < .0001$ ,  $P < .0001$ ,  $P = .075$ , respectively), and the data were not applicable in LCC because of the small number of BMs. On the other hand, BMs within the hippocampus were detected in only 3 patients (one with exon 19 deleted EGFR, one with L858R mutated EGFR, and another with SCC).

### Distribution of BMs Is Different by EGFR Mutation Status as well as Primary Lung Cancer Subgroup

There was a significant difference in the distribution of BMs ( $P = .0074$ ) among primary lung cancer subgroups (Table 2). In greater detail, there was a difference between Ad and SCC ( $P = .0002$ ) and between SCC and Sq ( $P = .0097$ ). There was also a significant difference in the distribution of BMs between patients with exon 19 deleted EGFR and those with L858R mutated EGFR ( $P = .020$ ), specifically in the caudate, cerebellum, and temporal lobe. BMs with L858R mutated EGFR occurred more often in these segments than in those with exon 19 deleted EGFR.

### Brain Metastases with L858R Mutated EGFR Prefer to Nest Closer to the Brain Surface

Mean DEPTH was 13.9 mm (8.5–21.9) for all patients; 13.9 mm (8.7–20.6) for Ad, 14.1 mm (8.5–24.5) for SCC, 14.2 mm (8.8–24.2) for Sq, and 9.8 mm (5.9–14.3) for LCC. There was no

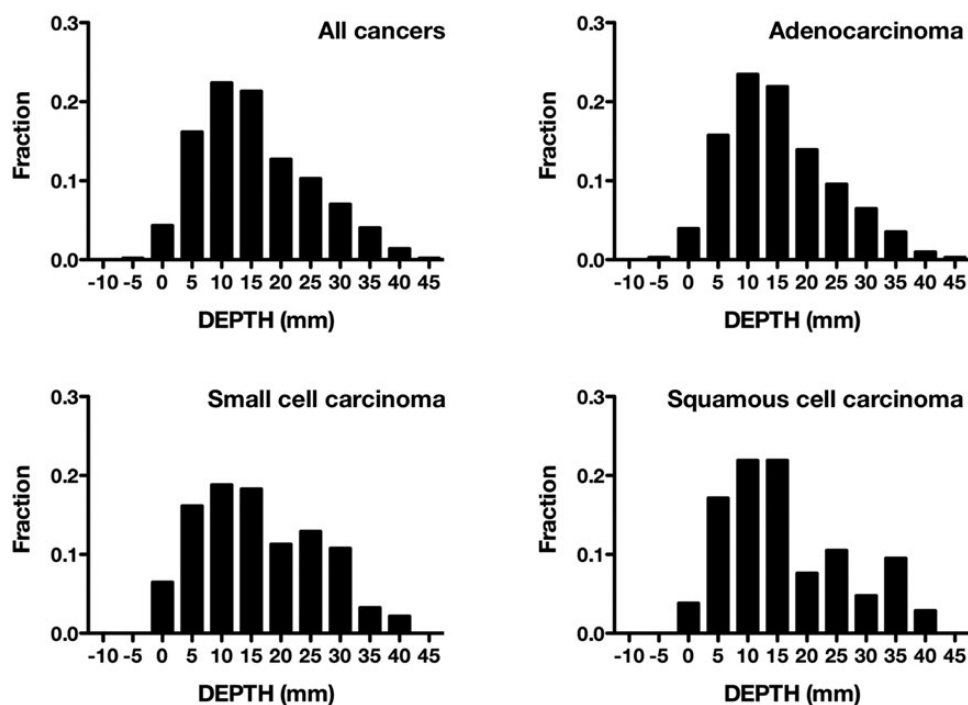
significant difference among lung cancer subgroups ( $P = .43$ ), although it was noticed that SCC and Sq showed a bimodal distribution, while Ad showed a single peak of distribution (Fig. 3). Further analyzing patients with Ad, mean DEPTH was 13.7 mm (8.6–21.9) for exon 19 deletion, 1.5 mm (6.6–16.8) for L858R mutation, and 15.0 mm (10.0–20.7) for wild-type EGFR. Lesions with L858R mutated EGFR were located significantly closer to the brain surface than lesions with exon 19 deleted or wild-type EGFR ( $P = .0032$  and  $P < .0001$ , respectively) (Fig. 4). On the other hand, the mean diameters of the lesions after image transformation were 4.8 mm (3.9–6.4) for exon 19 deleted, 5.2 mm (3.9–8.8) for L858R mutated, and 5.6 mm (3.6–8.7) for wild-type EGFR. There was a borderline difference by EGFR mutation status ( $P = .086$ ) (Fig. 4).

### Both L858R Point Mutation and Chemotherapy Affect the Spatial Distribution of BMs from Lung Adenocarcinoma

To analyze the effects of systemic chemotherapy and molecular targeted therapy on the distribution of BMs, DEPTH was compared on the basis of treatment history for primary and metastatic lesions except for the brain. Any chemotherapy and molecular targeted therapy longer or shorter than 3 months was included in the analysis.

Mean DEPTH was 13.0 mm (7.5–20.4) for patients with Ad who were treated with any tyrosine kinase inhibitors for more than 3 months, while it was 14.3 mm (9.0–20.6) for patients treated with tyrosine kinase inhibitors for less than 3 months ( $P = .13$ ). Mean DEPTH was, however, 14.7 mm (9.3–22.2) for patients with Ad who were treated with any chemotherapies for more than 3 months, while it was 11.7 mm (7.8–18.0) for patients treated for less than 3 months. Thus, lesions of patients treated with any chemotherapy for more than 3 months were located significantly deeper from the brain surface ( $P = .0002$ ).

A multiple regression model was constructed including both EGFR mutation status and length of chemotherapy as



**Fig. 3.** Histogram of the distance of brain metastases from the surface of the brain (DEPTH). There is no significant difference among lung cancer subgroups ( $P = .43$ ).

contributors to BM location. Both L858R point mutation and any chemotherapy longer than 3 months were significant factors for model construction, with L858R point mutation weighing more ( $P = .0030$  and  $P = .0107$ , respectively).

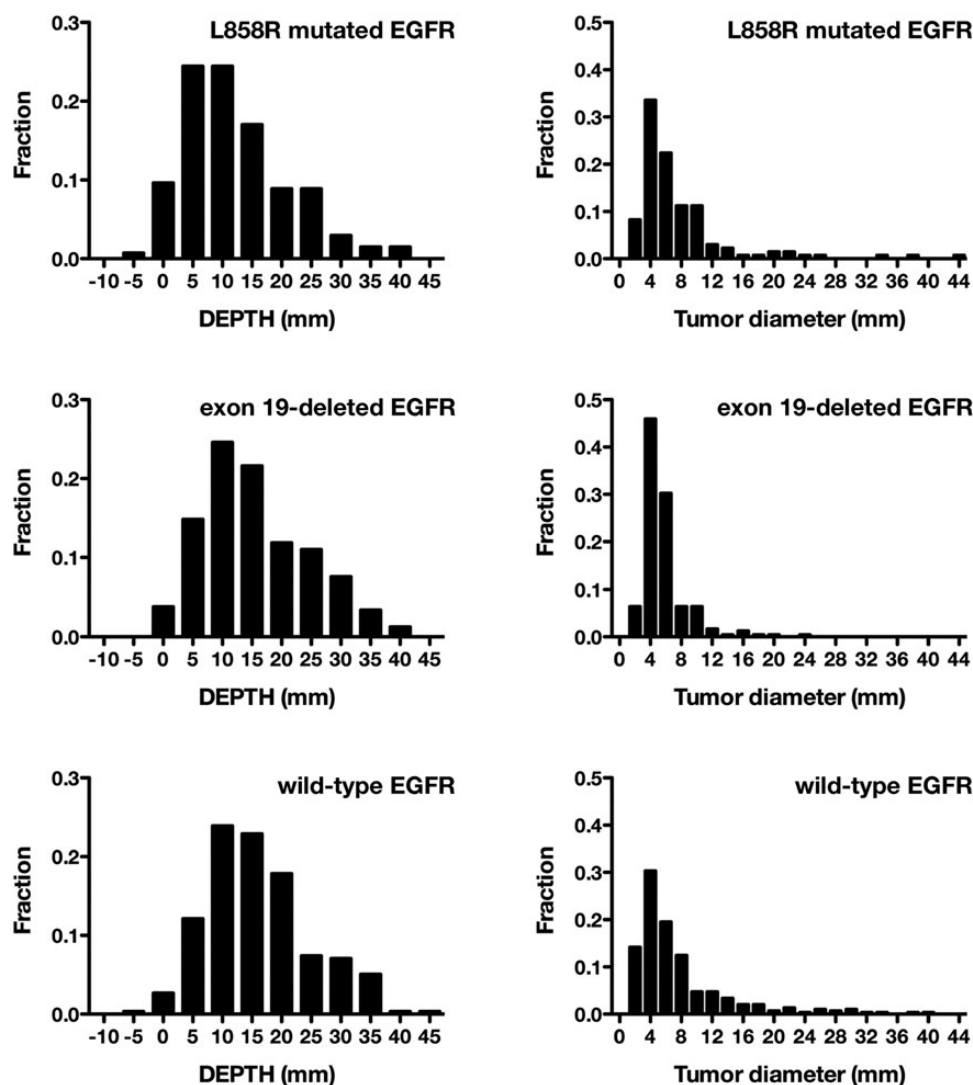
## Discussion

One of the purposes of the present study was to evaluate the spatial distribution of BMs from lung cancer more objectively than past reports. Individual images were registered to a standard brain atlas for spatial standardization. Taking the different sizes of the lesions into account, the center of the lesion was selected for analysis on the assumption that this site would reflect the origin more accurately than the whole lesion. This procedure could be considered as “rewinding” the chronological changes of the lesions to the initial stage of lesion development. By combining spatial and chronological standardization, the frequency map shown in Fig. 2 and Supplementary Figs. S4–S7 could be called the 4-dimensional standardized frequency map of BMs from lung cancer. Preferential involvement by lung cancer BMs of the posterior fossa, the anatomic watershed areas, and the gray-white matter junction was visually reconstructed, confirming findings from past reports.<sup>10,12,13,15,16,18,19</sup> Furthermore, the heterogeneity of BMs in the brain was statistically verified, confirming past reports with more objectivity.<sup>10–16,18,19</sup> With a more detailed frequency map of BMs, prophylactic irradiation for patients with malignant tumor could be optimized to enhance preventive effects and reduce side effects.<sup>18</sup> Intensity-modulated radiotherapy with hippocampal avoidance, which was performed in the Radiation Therapy Oncology Group trial 0933, could be an effective radiotherapy for lung cancer

patients, as BM occurrence within the hippocampus seems to be infrequent, as revealed by the current study.<sup>29</sup>

In the present study, we hypothesized that BMs may distribute differently within the brain according to their molecular biological characteristics. First, the spatial distribution of BMs was compared among lung cancer subtypes, revealing a significant difference between SCC and Ad or Sq. This observation confirms that histological subtypes of lung cancer have significant influence over the location of preference for brain metastasis (Table 2). When BMs were further compared according to EGFR mutation status among Ad lung cancers, there were no significant differences in the number or size of BMs, which was inconsistent with the past report that showed that patients with exon 19 deleted EGFR have more and smaller BMs than patients with wild-type EGFR.<sup>26</sup> This contradiction may be because of the number of analyzed patients. Further analysis with a larger cohort is required to reach definite conclusions. There were, however, significant differences in the spatial distribution of BMs between EGFR mutation statuses with 2 different analytical methods. BMs with L858R mutated EGFR showed preferential involvement of the caudate, cerebellum, and temporal lobe and a tendency to nest nearer to the brain surface. It was also confirmed that this tendency was independent of tumor size or history of prior systemic chemotherapy.

Organ-specific metastasis of cancer has been proposed for more than a century, known as “Paget’s theory” or “seed and soil theory.” Paget suggested that the site of metastasis depends on the affinity of the tumor (the “seed”) to the microenvironment (the “soil”),<sup>30</sup> and the molecular mechanism of this has been partially revealed. In breast cancer, chemokine receptors such as CXCR4 and CCR7 have been reported to have a



**Fig. 4.** Histogram of the distance of brain metastases from the surface of the brain (DEPTH) and the maximal diameters of brain metastases after image transformation. The histogram compares adenocarcinoma patients grouped by EGFR mutation status. The lesions with L858R mutated EGFR are located significantly closer to the brain surface than the lesions with exon 19 deleted or wild-type EGFR ( $P = .0032$  and  $P < .0001$ , respectively). As to the diameters of brain metastases after image transformation, there is a borderline difference by EGFR mutation status ( $P = .086$ ).

critical role in determining the metastatic destination of tumor cells, as well as leukocytes.<sup>31</sup> For metastases to brain, some molecules have been reported to participate in crossing over the blood-brain barrier,<sup>32</sup> and some have been reported to be necessary to defend tumor cells from highly expressed tissue plasminogen activator in the brain.<sup>33</sup> On the other hand, the molecular mechanism of preferential involvement of specific areas within the brain remains largely unknown. Although a definite explanation of our findings is challenging, the affinity of the tumor to microenvironment of specific areas within the brain is thought to affect the spatial distribution of BMs, as well as organ-specific metastasis, and mutated EGFR or correlative molecules with EGFR mutation status may be among the key molecules.

Systemic chemotherapy was also a factor affecting DEPTH in the present study. To the best of our knowledge, no previous

analysis focused on the effects of systemic chemotherapy on the spatial distribution of BMs. Although it has not been confirmed, it is possible that the distance from the cerebrospinal fluid could be a key factor related to this result, since the tissue concentration of anticancer drugs is thought to be higher at the brain surface directly contacting the CSF.

Limitations of our study should also be noted. Firstly, although statistical spatial distribution analysis with 3D structure deformation has already been adopted in many studies,<sup>17-19,27</sup> “4-dimensional standardization” has not yet been widely accepted. Since BMs are usually round in shape and develop concentrically, unlike primary CNS tumors such as glioblastoma, the center of the tumor could be approximated as the occurrence point, especially when the BMs are small. Secondly, we included CT and MRI with variable resolutions together in this analysis, which could affect different sensitivities for BMs.

In order to answer this concern, we further analyzed DEPTH, size, and number of BMs within MRI only ( $n = 177$ ) or 3.0T MRI with 0.8 mm thickness only ( $n = 76$ ), obtaining nearly identical results compared with those done using all the data available (Supplementary Table S1).

Finally, it should be emphasized that the analytical method used for this study is useful to detect significant factors affecting the spatial distribution of metastases within the brain, and the current study is the first to uncover the relationship between a tumor's molecular biological characteristics and the spatial distribution of BMs. It seems safe to speculate that this kind of analysis enables the identification of more molecules affecting the spatial distribution of BM, which would lead to the development of new molecular targeted drugs to prevent brain metastases and novel radiological diagnostic methods that reveal the biological characteristics of the tumor.

## Supplementary Material

Supplementary material is available at *Neuro-Oncology* Journal online (<http://neuro-oncology.oxfordjournals.org/>).

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