

1 **Predictive uncertainty in infrared marker-based dynamic tumor**
2 **tracking with Vero4DRT**

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21 **Running title:** Predictive uncertainty in IR Tracking

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30 ESTRO Forum in Geneva, April 19–23, 2013.

31 **Abstract**

32 **Purpose:** To quantify the predictive uncertainty in infrared (IR)-marker-based dynamic
33 tumor tracking irradiation (IR Tracking) with Vero4DRT (MHI-TM2000) for lung
34 cancer using logfiles.

35 **Methods:** A total of 110 logfiles for 10 patients with lung cancer who underwent IR
36 Tracking were analyzed. Before beam delivery, external IR markers and implanted gold
37 markers were monitored for 40 s with the IR camera every 16.7 ms and with an
38 orthogonal kV x-ray imaging subsystem every 80 or 160 ms. A predictive model
39 [four-dimensional (4D) model] was then created to correlate the positions of the IR
40 markers (P_{IR}) with the three-dimensional (3D) positions of the tumor indicated by the
41 implanted gold markers (P_{detect}). The sequence of these processes was defined as 4D
42 modeling. During beam delivery, the 4D model predicted the future 3D target positions
43 ($P_{predict}$) from the P_{IR} in real-time, and the gimbaled x-ray head then tracked the target
44 continuously. In clinical practice, we updated the 4D model at least once during each
45 treatment session to improve its predictive accuracy. This study evaluated the predictive
46 errors in 4D modeling (E_{4DM}) and those resulting from the baseline drift of P_{IR} and P_{detect}
47 during a treatment session (E_{BD}). E_{4DM} was defined as the difference between $P_{predict}$ and
48 P_{detect} in 4D modeling, and E_{BD} was defined as the mean difference between $P_{predict}$
49 calculated from P_{IR} in updated 4D modeling using (a) a 4D model created from training
50 data before the model update and (b) an updated 4D model created from new training
51 data.

52 **Results:** The mean E_{4DM} was 0.0 mm with the exception of one logfile. Standard
53 deviations of E_{4DM} ranged from 0.1–1.0, 0.1–1.6, and 0.2–1.3 mm in the left-right (LR),
54 anterior-posterior (AP), and superior-inferior (SI) directions, respectively. The median

55 elapsed time before updating the 4D model was 13 (range, 2–33) min, and the median
56 frequency of 4D modeling was twice (range, 2–3 times) per treatment session. E_{BD}
57 ranged from -1.0–1.0, -2.1–3.3, and -2.0–3.5 mm in the LR, AP, and SI directions,
58 respectively. E_{BD} was highly correlated with BD_{detect} in the LR ($R=-0.83$) and AP
59 directions ($R=-0.88$), but not in the SI direction ($R=-0.40$). Meanwhile, E_{BD} was highly
60 correlated with BD_{IR} in the SI direction ($R=-0.67$), but not in the LR ($R=0.15$) or AP
61 ($R=-0.11$) direction. If the 4D model was not updated in the presence of intrafractional
62 baseline drift, the predicted target position deviated from the detected target position
63 systematically.

64 **Conclusions:** Application of IR Tracking substantially reduced the geometric error
65 caused by respiratory motion; however, an intrafractional error due to baseline drift of >3
66 mm was occasionally observed. To compensate for E_{BD} , we recommend checking the
67 target and IR marker positions constantly and updating the 4D model several times
68 during a treatment session.

69

70 **Key words:** Motion management, Predictive uncertainty, IR Tracking, Respiratory
71 surrogates, Vero4DRT.

72 I. INTRODUCTION

73 The management of respiratory motion is one of the most important issues in
74 high-precision radiotherapy.^{1,2} Without managing respiratory motion, normal tissues
75 surrounding the target will receive an unnecessary dose, which might increase the rate
76 of normal tissue complications. A variety of methods have been proposed to reduce the
77 impact of respiratory motion during beam delivery, including motion-encompassing,
78 forced shallow-breathing, breath hold, respiratory gated, and dynamic tumor tracking
79 (DTT) methods.²

80 Of these methods, recent interest has focused on the DTT technique, which can
81 reposition the radiation beam dynamically in accordance with the target position. DTT
82 methods are categorized as direct and indirect.³ Direct methods detect the internal target
83 itself or surrogates within or near the target using imaging modalities. Indirect DTT
84 methods observe external surrogates and then deduce the internal target position from
85 the surrogates.

86 The CyberKnife Robotic Radiosurgery System with the integrated Synchrony
87 Respiratory Tracking System (Accuray, Sunnyvale, CA) was the first clinically
88 available radiotherapy unit to realize indirect DTT irradiation.⁴ The Synchrony system
89 compensates for tumor motion by moving the robotic arm based on the target position
90 predicted from the motion of light-emitting diodes on the chest, which can substantially
91 reduce the geometric error caused by respiratory motion;⁵⁻⁷ however, several researchers
92 reported that the correlation between internal target positions and external surrogates
93 can change in the presence of phase shift and inter- and intrafractional baseline drift,
94 reducing the accuracy of the correlation model.^{5,7}

95 Vero4DRT [MHI-TM2000; Mitsubishi Heavy Industries (MHI), Ltd., Japan,

96 and BrainLAB, Feldkirchen, Germany] is an innovative radiotherapy unit with an
97 integrated DTT system. Vero4DRT has an orthogonal kV x-ray imaging subsystem
98 comprising two sets of x-ray tubes and flat-panel detectors with a spatial resolution of
99 0.2 mm at the isocenter level and a gimbaled x-ray head with a compact 6-MV C-band
100 linac in an O-shaped gantry (O-ring), which provides real-time imaging and tumor
101 motion compensation.^{8,9} With these features, Vero4DRT is capable of both direct and
102 indirect DTT.^{10,11} At present, an infrared (IR)-marker-based DTT (IR Tracking), which
103 is categorized as an indirect DTT method, is available clinically. The IR Tracking
104 system predicts the future target position from the positions of IR markers on the
105 abdominal wall using a predictive model [four-dimensional (4D) model]. We have
106 applied IR Tracking clinically to lung cancer patients since September 2011.¹²

107 A key issue in IR Tracking is the accuracy of the 4D model in terms of
108 predicting the internal target position from the surrogate measurements. Here, we
109 assessed the predictive uncertainty relevant to the 4D model in IR Tracking.

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111

112 **II. MATERIALS AND METHODS**

113 **II.A. Patients**

114 This study included 10 lung cancer patients [eight males, two females; median
115 age 84 (range, 60–87) years] who underwent IR Tracking. Their lung tumors were
116 located in the right middle (one patient), right lower (six patients) and left lower (three
117 patients) lobes. The patients were treated with 6–8 non-coplanar beams. The prescribed
118 dose was 48 or 56 Gy in four fractions at the isocenter. Four or five 1.5-mm-diameter
119 gold markers were implanted around the lung tumor transbronchially 1–2 weeks before

120 treatment planning. All patients were fixed in the supine position on an individualized
 121 vacuum pillow with both arms raised.

122

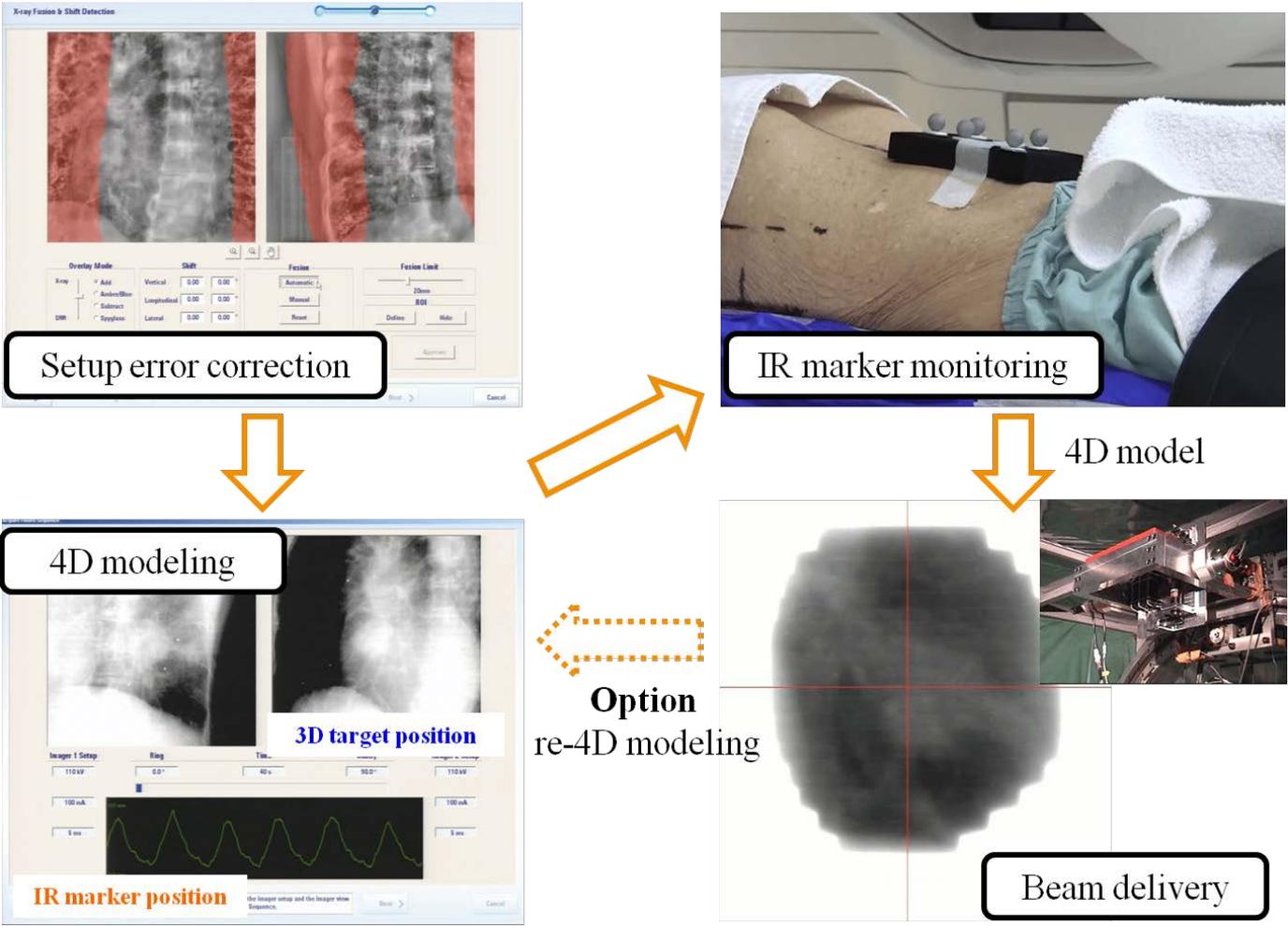
123 **II.B. Procedure of IR Tracking**

124 Figure 1 shows a schematic diagram of the IR Tracking procedure. First, the
 125 setup error was corrected based on the bony anatomy. The IR and implanted gold
 126 markers were then monitored synchronously for 40 s with an IR camera on the ceiling
 127 of the treatment room every 16.7 ms and with the orthogonal kV x-ray imaging
 128 subsystem every 80 or 160 ms. The sampling time of the kV x-ray images automatically
 129 changed to 160 ms when the velocity of the IR marker motion decreased. The attitude of
 130 the O-ring used for monitoring the implanted gold markers was determined with
 131 reference to our previous study.¹³ The positions of gold markers were detected
 132 automatically using the intensity ratio of the gold marker to its surroundings.¹³ Using
 133 these training data, a 4D model was created to correlate the 3D target positions
 134 indicated by the implanted gold markers (detected target positions, P_{detect}) with the IR
 135 marker positions on the abdominal wall (P_{IR}). The 4D model was expressed as follows:

$$136 \quad P_{predict} = aP_{IR}^2 + bP_{IR} + c + dv_{IR}^2 + ev_{IR},$$

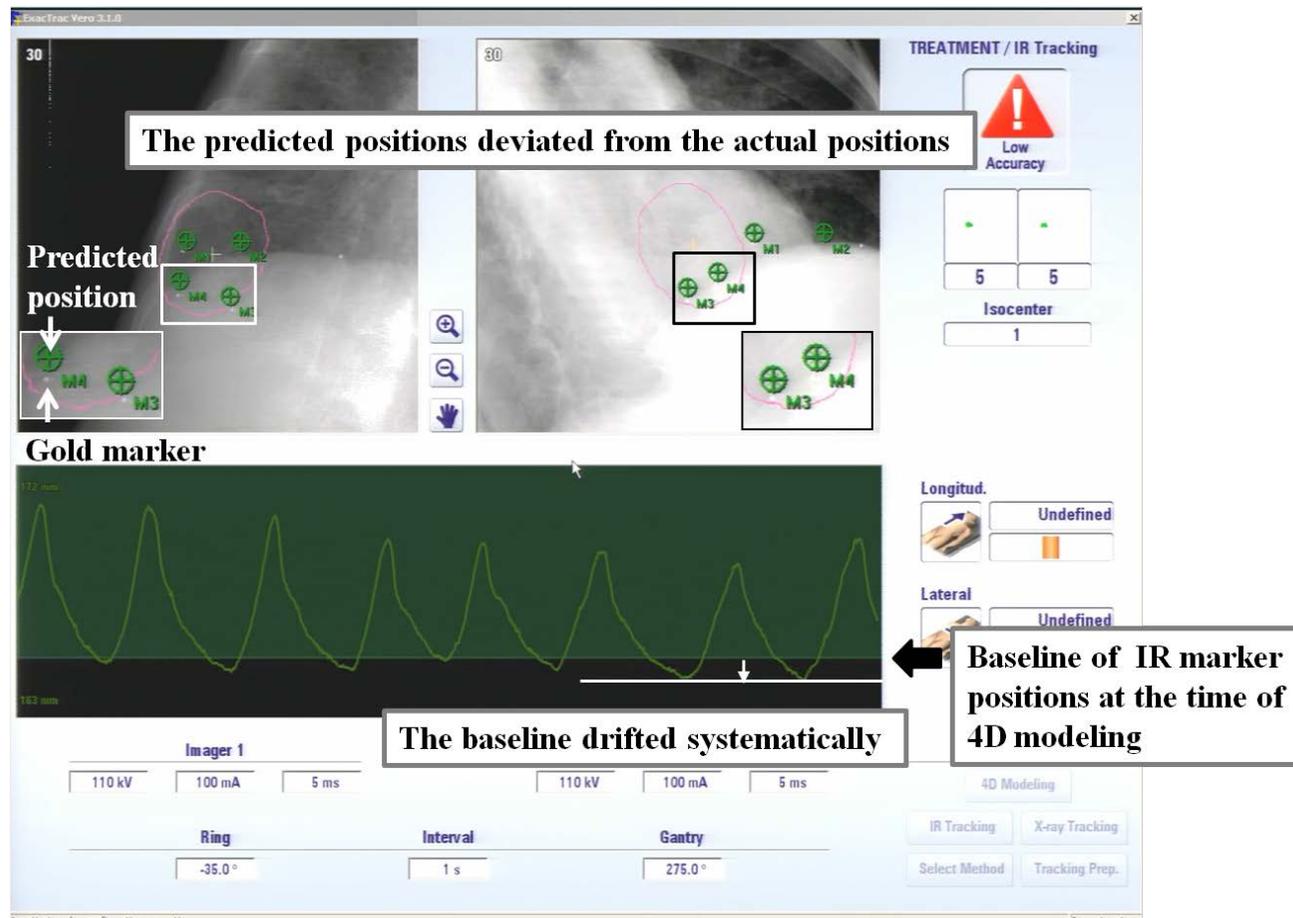
137 where $P_{predict}$ is the predicted target position and v_{IR} is the vertical velocity of the IR
 138 markers. The sequence of these processes was defined as 4D modeling in the current
 139 study. Details of determination of each parameter are described in Section II.C. During
 140 beam delivery, the IR Tracking system anticipates the $P_{predict}$ from P_{IR} using the 4D
 141 model parameters in real time, and the gimballed head then tracks the moving target
 142 continuously. In clinical practice, we monitored the implanted gold markers on
 143 orthogonal kV x-ray images during beam delivery. The predicted positions with

144 arbitrary radius circles around the implanted gold markers (tolerance circles; green
145 circles in Fig. 2) were displayed as a benchmark of the 4D model update. The 4D model
146 update was needed when the implanted gold markers deviated systematically from the
147 tolerance circles. In the current study, the 4D model update was performed at least once
148 during each treatment session to improve the predictive accuracy.



149

150 **Figure 1.** A schematic diagram of the IR Tracking procedure using the Vero4DRT system.



151
 152 **Figure 2.** A screenshot during IR Tracking irradiation in a case of large baseline drift of the IR marker positions. When the predicted
 153 target positions deviated from the internal gold markers systematically, additional 4D modeling was performed.

154 II.C. Calculation of predicted target positions

155 Based on available information from the vendor, the predicted target position
 156 was calculated from P_{IR} and P_{detect} as follows;

- 157 (1) Prediction of the IR marker position after 25 ms: Using the previous multiple
 158 consecutive positions of the k^{th} IR marker ($P_{IR,k}$; $1 \leq k \leq 5$) before time t , the
 159 P_{IR} after 25 ms [$P_{IR,k}'(t+25)$] was predicted using a linear approximate equation
 160 that was determined using the weighted least-squares method. A time interval
 161 of 25 ms was required to compensate for the system latency of IR Tracking,
 162 which was disclosed by MHI.
- 163 (2) Calculation of the velocity of IR marker motion: The velocity at time $t+25$ ms
 164 [$v_{IR,k}'(t+25)$] was calculated from $P_{IR,k}$ and $P_{IR,k}'$, assuming that the velocity was
 165 constant at $t+25$ ms.
- 166 (3) Association of 3D target position with IR marker position and velocity: Using
 167 multiple regression analysis, 4D model parameters (a_k , b_k , c_k , d_k , and e_k) were
 168 determined by minimizing the residual errors between P_{detect} and the target
 169 positions predicted from the displacement of the k^{th} IR marker using the above
 170 equation in Section II.B.
- 171 (4) Calculation of 3D target position based on multiple IR markers: Processes (1)
 172 to (3) were repeated for each IR marker, and the predicted target position for
 173 the k^{th} IR marker ($P_{predict,k}$) was then calculated from the displacement of the k^{th}
 174 IR marker using the determined 4D model parameters. The mean of $P_{predict,k}$
 175 was regarded as $P_{predict}$.

177 II.D. Data analysis

178 The logfiles of 4D models containing P_{IR} , $P_{predict}$, and P_{detect} were used for the
 179 data analysis. The metrics for assessing them and their definitions were as follows:

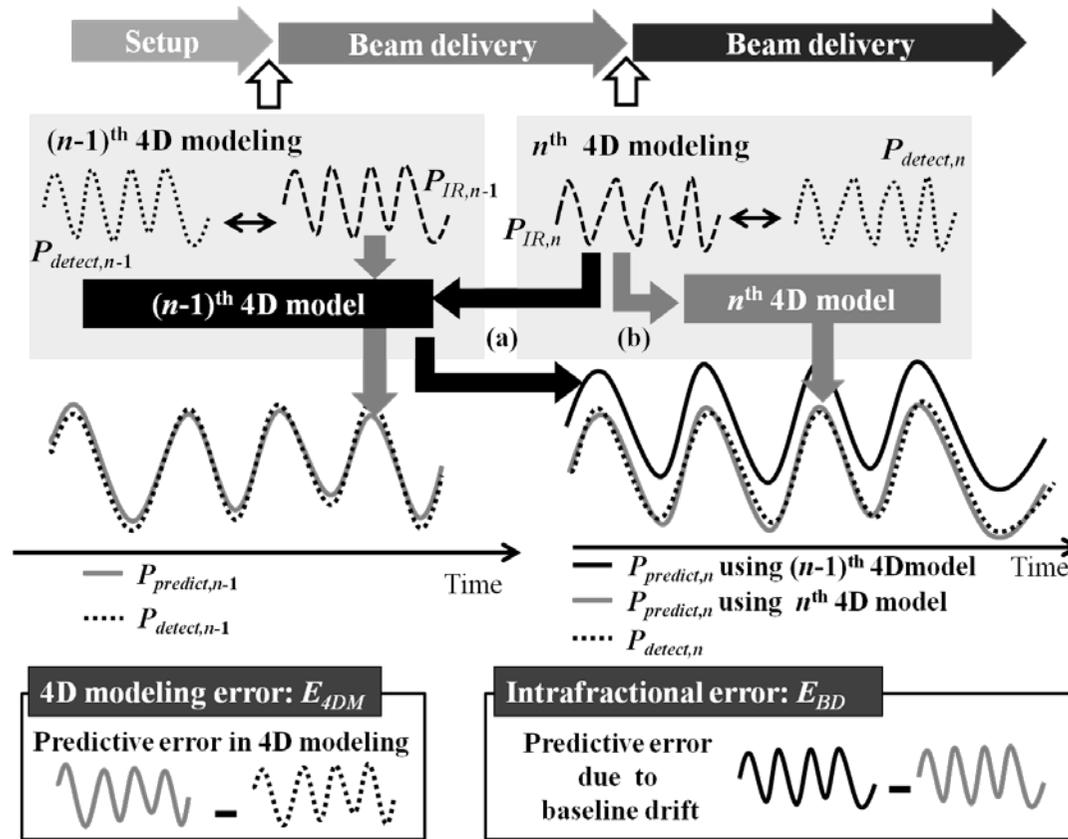
180 (1) Motion amplitude of the detected target positions (A): Median peak-to-peak
 181 amplitude of P_{detect} .

182 (2) Baseline drift of the IR marker (BD_{IR}) and detected target (BD_{detect}) positions:
 183 The difference in the baselines of P_{IR} and P_{detect} between the last 4D modeling
 184 before re-4D modeling [$(n-1)^{th}$ 4D modeling] and re-4D modeling (n^{th} 4D
 185 modeling). The baselines were defined as the median position among the peaks
 186 of P_{IR} and P_{detect} at the end-expiration phase during the 4D modeling. Positive
 187 values of BD_{IR} indicate an anterior direction and those of BD_{detect} indicate left,
 188 anterior, and inferior directions.

189 (3) Absolute correlation coefficient between internal and external respiratory
 190 signals ($/R_{IR}^{target}/$): Absolute correlation coefficient between P_{detect} and P_{IR} .

191 (4) 4D modeling errors (E_{4DM}): The predictive errors in 4D modeling. E_{4DM} was
 192 defined as the difference between P_{detect} and $P_{predict}$ in 4D modeling (Fig. 3).

193 (5) Intrafractional errors due to baseline drift (E_{BD}): The predictive errors resulting
 194 from BD_{IR} and BD_{detect} during a treatment session. E_{BD} was defined as the mean
 195 difference between $P_{predict}$ calculated from P_{IR} in the updated 4D modeling
 196 using (a) a 4D model created from training data before the model update
 197 [$(n-1)^{th}$ 4D model], and (b) an updated 4D model created from the new training
 198 data (n^{th} 4D model) ($n=2-3$) (Fig. 3).



199
 200 **Figure 3.** A schematic diagram for calculating 4D modeling errors (E_{4DM}) and intrafractional errors due to baseline drift (E_{BD}). E_{4DM}
 201 was defined as the difference between P_{detect} and $P_{predict}$ in 4D modeling. E_{BD} was defined as the mean difference between $P_{predict}$
 202 calculated from P_{IR} in n^{th} 4D modeling using (a) a $(n-1)^{\text{th}}$ 4D model, and (b) a n^{th} 4D model.

203 In total, 110 logfiles were analyzed to assess the predictive uncertainties in IR
 204 Tracking. For BD_{IR} , BD_{detect} , and E_{BD} , a dataset of 53 paired logfiles was analyzed.

205

206

207 **III. RESULTS**

208 **III.A. Motion amplitude and baseline drift**

209 The median A was 1.4 (range, 0.2–5.6), 3.0 (range, 0.9–6.6), and 11.0 (range,
 210 1.4–23.5) mm in the left-right (LR), anterior-posterior (AP), and superior-inferior (SI)
 211 directions, respectively.

212 The median elapsed time before updating the 4D model was 13 (range, 2–33)
 213 min, and the median frequency of 4D modeling was twice (range, 2–3 times) per
 214 treatment session. The median BD_{IR} was -0.3 (range, -3.2–1.3) mm. The baseline of the
 215 IR markers drifted mainly in the posterior direction for 39 paired logfiles (74%). The
 216 median BD_{detect} was 0.0 (range, -1.2–0.9), -0.4 (range, -3.6–1.8), and 0.2 (range,
 217 -1.6–5.0) mm in the LR, AP, and SI directions, respectively. BD_{detect} drifted in the
 218 posterior and superior directions for 38 (72%) and 35 (66%) paired logfiles, respectively.
 219 There were no significant correlations between BD_{IR} and BD_{detect} in the LR ($R=-0.01$),
 220 AP ($R=0.40$), and SI directions ($R=-0.30$).

221

222 **III.B. Correlation between internal and external respiratory signals and 4D** 223 **modeling errors**

224 The median $|R_{IR}^{target}|$ was 0.76 (range, 0.03–0.98), 0.80 (range, 0.01–0.97),
 225 and 0.98 (range, 0.15–1.00) in the LR, AP, and SI directions, respectively. $|R_{IR}^{target}| >$
 226 0.7, which indicates high correlation,¹⁴ was observed for 63 (57.3%), 65 (59.1%), and

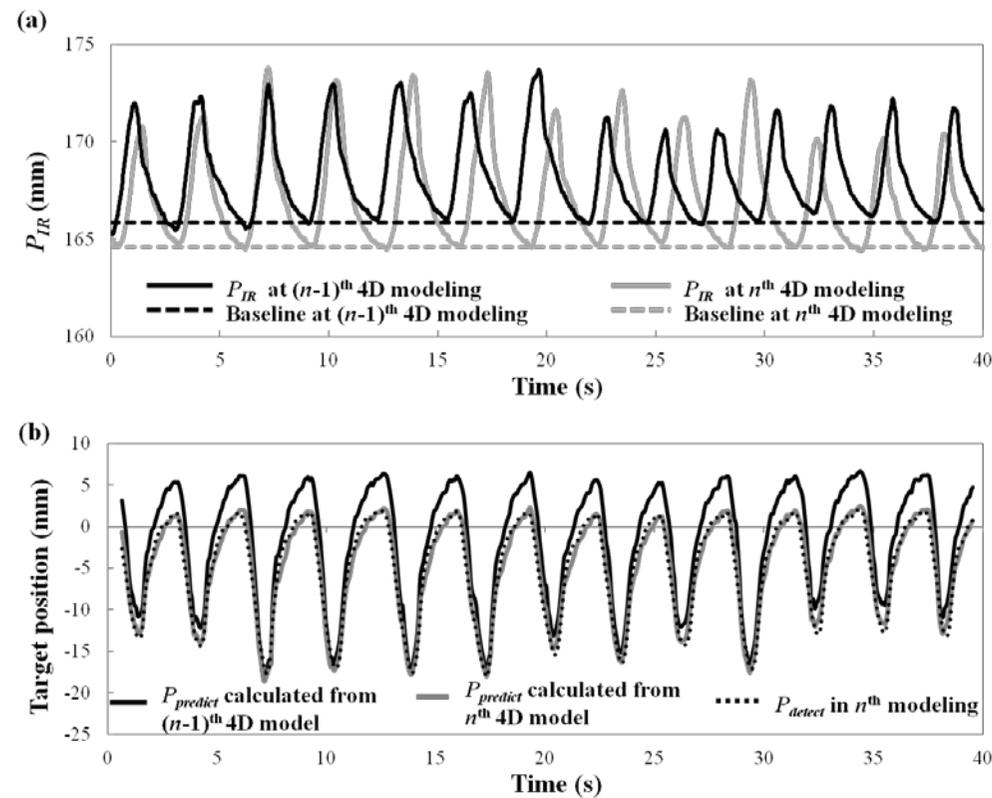
227 100 (91.0%) logfiles in the LR, AP, and SI directions, respectively. Meanwhile,
 228 $|R_{IR}^{target}| < 0.2$, which indicates poor correlation,¹⁴ was observed for seven (6.4%),
 229 eight (7.3%), and two (1.8%) logfiles in the LR, AP, and SI directions, respectively.

230 Excluding the case in which the mean E_{4DM} was -0.1 mm in the AP direction
 231 for one logfile (0.9%), the mean E_{4DM} was 0.0 mm for all remaining logfiles. The SD of
 232 E_{4DM} ranged from 0.1–1.0, 0.1–1.6, and 0.2–1.3 mm in the LR, AP, and SI directions,
 233 respectively.

234

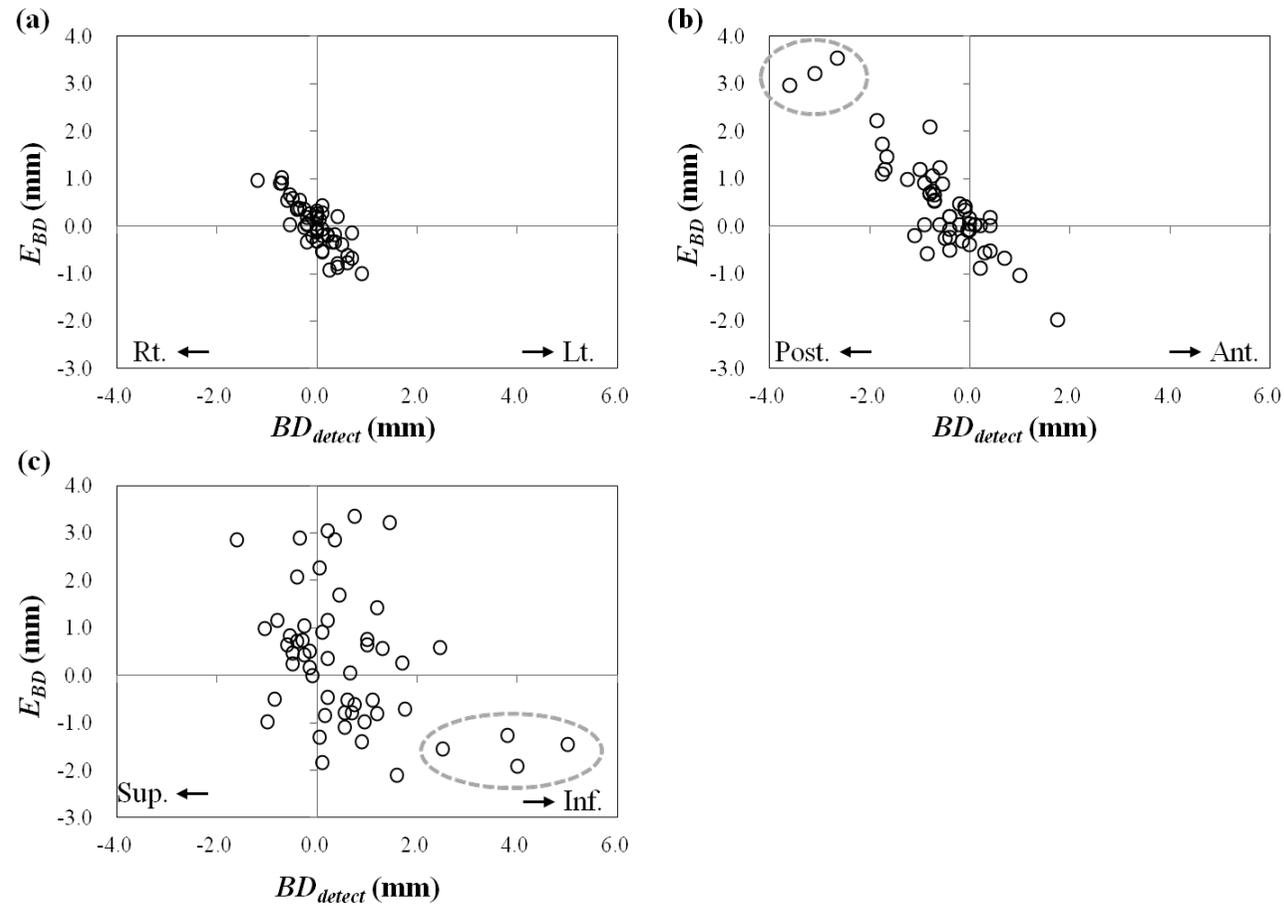
235 **III.C. Intrafractional errors due to baseline drift**

236 E_{BD} ranged from -1.0–1.0, -2.1–3.3, and -2.0–3.5 mm in the LR, AP, and SI
 237 directions, respectively. Figure 4(a) shows P_{IR} and its baseline during the $(n-1)^{th}$ and n^{th}
 238 4D modeling, and Fig. 4(b) shows P_{detect} and $P_{predict}$ calculated from P_{IR} in the n^{th} 4D
 239 modeling using $(n-1)^{th}$ and n^{th} 4D models in Patient 2, who had the largest E_{BD} . As
 240 shown in Fig. 4(b), $P_{predict}$ deviated from P_{detect} systematically if the 4D model was not
 241 updated in the presence of intrafractional baseline drift.



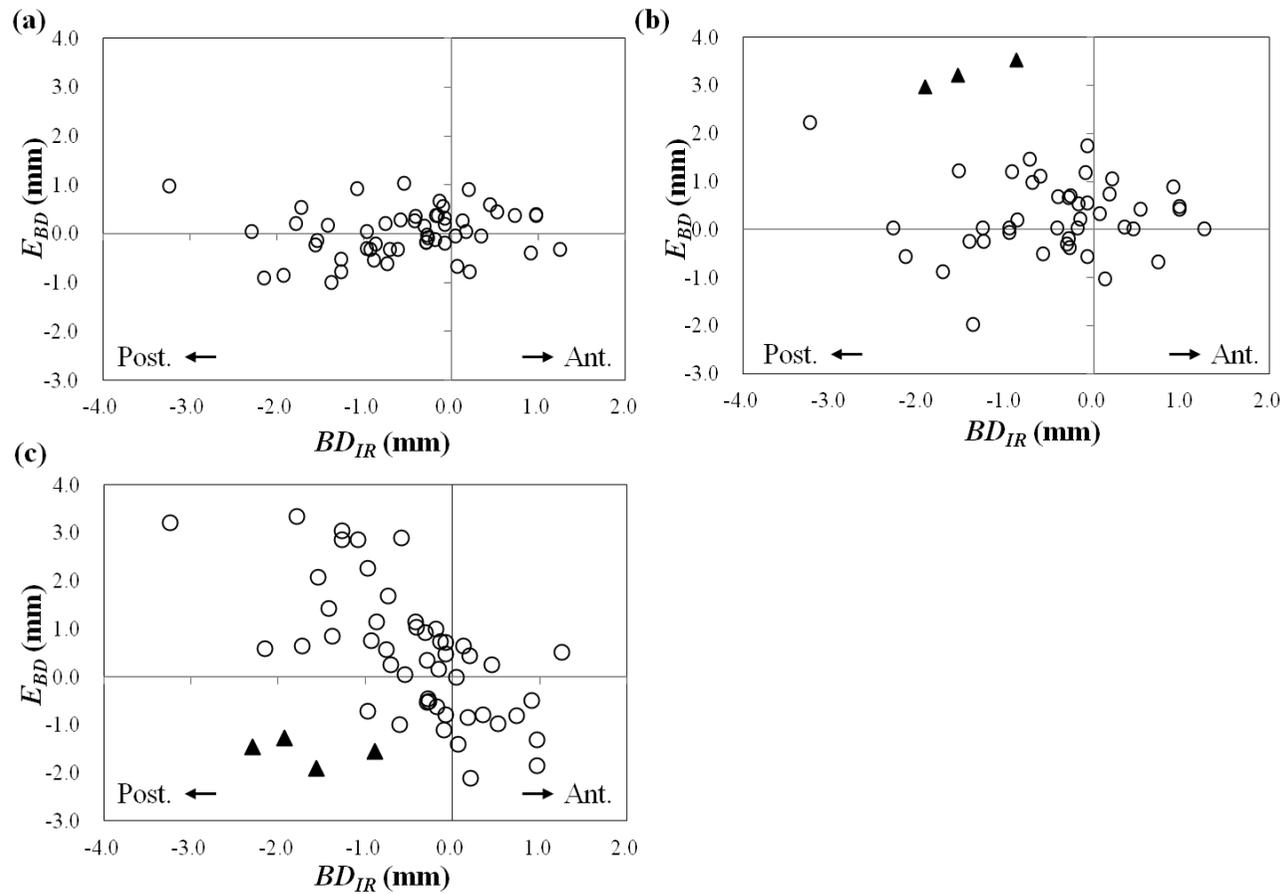
242
 243 **Figure 4.** (a) The IR marker positions (P_{IR} ; solid curve) and their baselines (dotted curve) during the $(n-1)^{th}$ (black curve) and n^{th} 4D
 244 modeling (gray curve), and (b) the predicted target positions ($P_{predict}$) calculated from P_{IR} in the n^{th} 4D modeling using the $(n-1)^{th}$
 245 (black curve) and n^{th} 4D models (gray curve) and the detected target positions in n^{th} 4D modeling (P_{detect} ; dotted curve) for Patient 2,
 246 who had the largest E_{BD} .

247 Figure 5 shows E_{BD} as a function of BD_{detect} . E_{BD} was highly correlated with
248 BD_{detect} in the LR ($R=-0.83$) and AP directions ($R=-0.88$), but not in the SI direction
249 ($R=-0.40$). While BD_{detect} in the LR direction was within 2 mm for all paired logfiles,
250 $BD_{detect} > 2$ mm was observed in three paired logfiles (6%) in the AP direction and in
251 five paired logfiles (9%) in the SI direction. This large BD_{detect} was observed mainly in
252 Patient 6.



253
 254 **Figure 5.** E_{BD} as a function of the baseline drift of the detected target positions (BD_{detect}) in the (a) LR, (b) AP, and (c) SI directions.
 255 $|BD_{detect}| > 2$ mm in Patient 6 is surrounded by a gray dotted ellipse.

256 Figure 6 shows E_{BD} as a function of BD_{IR} . Excluding the case in which BD_{detect}
257 was >2 mm in Patient 6 (triangles), E_{BD} was highly correlated with BD_{IR} in the SI
258 direction ($R=-0.67$), but not in the LR ($R=0.15$) or AP ($R=-0.11$) direction.

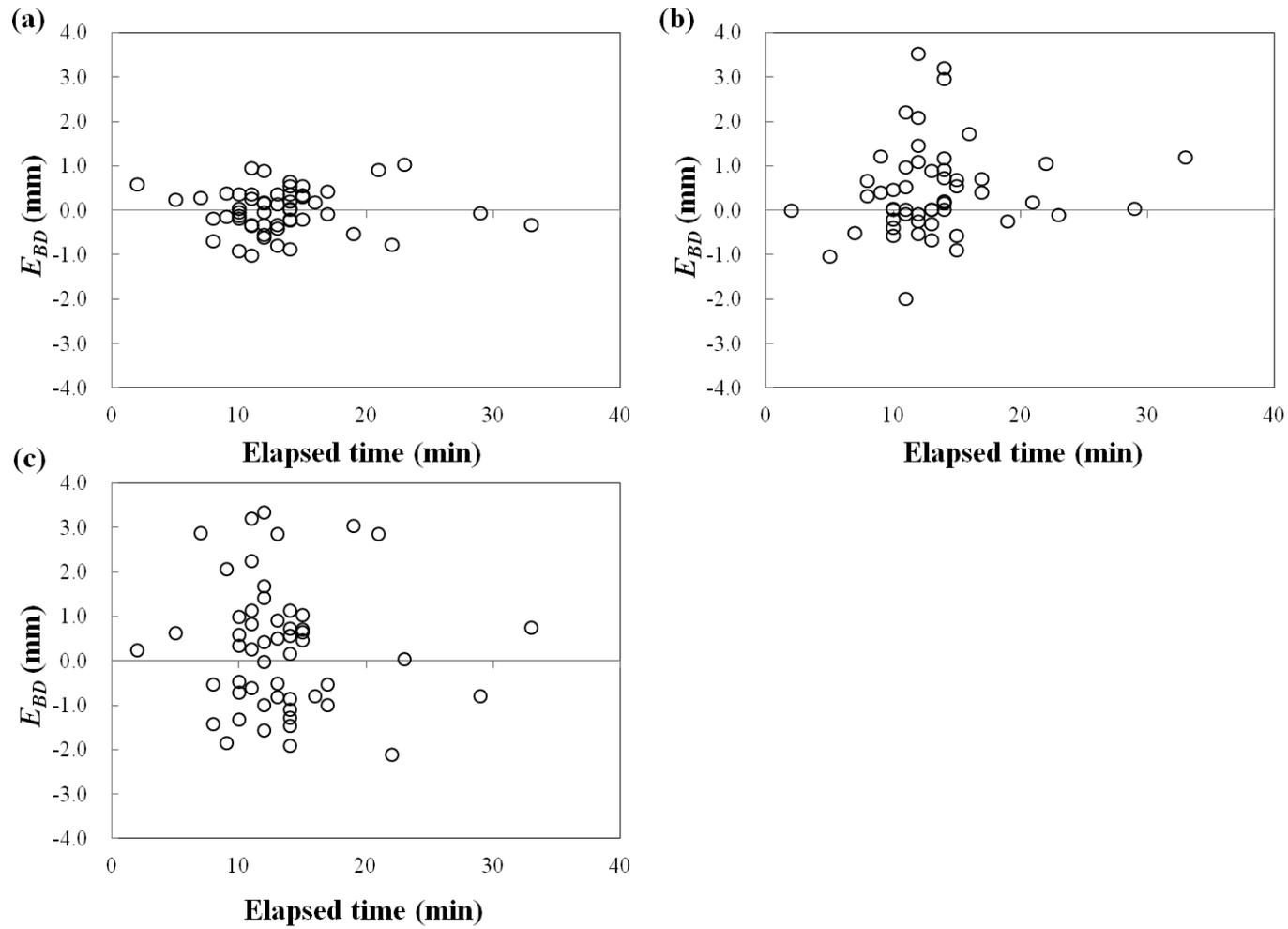


259

260 **Figure 6.** E_{BD} as a function of the baseline drift of the IR marker positions (BD_{IR}) in the (a) LR, (b) AP, and (c) SI directions. $|BD_{detect}|$

261 > 2 mm in Patient 6 is indicated by triangles.

262 Figure 7 shows E_{BD} as a function of the elapsed time before updating the 4D
263 model. E_{BD} was distributed randomly rather than systematically. $E_{BD} > 3$ mm was
264 occasionally observed, even at the median elapsed time.



265

266 **Figure 7.** E_{BD} as a function of the elapsed time before updating the 4D model in the (a) LR, (b) AP, and (c) SI directions.

267 **IV. DISCUSSION**

268 We estimated the predictive errors in 4D modeling and those resulting from the
269 baseline drift of the IR marker and detected target positions from logfiles for 10 lung
270 cancer patients who underwent IR Tracking. Our results showed that the Vero4DRT
271 system creates a highly accurate 4D model, although the baseline drift of the IR marker
272 and target positions reduced this accuracy.

273 Hoogeman *et al.* quantified the clinical accuracy of the Synchrony system,
274 showing that SDs describing intrafraction variations around the whole-fraction mean
275 error were 0.1–1.9 mm for the LR, 0.2–2.5 mm for the AP, and 0.2–1.9 mm for the SI
276 directions.⁵ The SD of E_{4DM} was up to 1.6 mm in the current study, which is comparable
277 with their results. In both clinical cases and a phantom study, IR Tracking substantially
278 reduced the geometric error caused by respiratory motion.¹¹ In the current study, high or
279 moderate correlations between internal target and external IR marker positions were
280 observed for most patients. Meanwhile, small correlations were observed for logfiles of
281 6.4%, 7.3%, and 1.8% in the LR, AP, and SI directions, respectively. These poor
282 correlations were caused by small motion amplitudes of a target, fluctuations in
283 respiratory signals resulting from heartbeats, and phase shifts between internal target
284 and external IR marker positions. As shown in E_{4DM} , however, the Vero4DRT system
285 was able to compensate for the respiratory motion with high accuracy even under these
286 conditions.

287 Breathing patterns can vary in magnitude and period during treatment sessions,
288 and expiration baseline drift of the respiratory signals also occurs.¹⁵⁻¹⁷ In general, the
289 cause of baseline drift involves a gradual mechanism, such as muscle relaxation or a
290 change in the method of breathing, and transit events such as deep breathing or a brief

291 halts in breathing.^{7,18-21} It is very difficult to manage these events because they occur
292 unconsciously or unexpectedly. Hoogeman *et al.* concluded that the inter- and
293 intrafractional baseline drift altered the correlation between the positions of the internal
294 and external markers.⁵ These tendencies were also observed in our study (Figs. 5 and 6).
295 In addition, our data indicated that BD_{IR} was not directly related to BD_{detect} , which was
296 also reported by Malinowski *et al.*,⁷ indicating that the 4D model should be updated to
297 correct the relationship between the internal target and external IR marker positions.

298 E_{BD} in the LR and AP directions had a strong correlation with BD_{detect} (Fig. 5).
299 Meanwhile, E_{BD} in the SI direction was caused mainly by BD_{IR} , with the exception of
300 Patient 6 (Fig. 6). The speculated reason for the lack of a correlation between BD_{IR} and
301 E_{BD} in this patient was that abdominal breathing may have switched to chest breathing
302 during a treatment session. When the baselines of the IR marker and target positions
303 systematically deviated from those at the time of 4D modeling during beam delivery, the
304 gimbaled x-ray head would not aim at the actual target position. The best method of
305 avoiding such an unfavorable situation is frequent updating of the 4D model.
306 Malinowski *et al.* reported that the tumor-surrogate relationship mostly changed over a
307 30-min treatment fraction and concluded that such changes must be taken into account
308 for optimal motion management.⁷ Our data suggest that it is difficult to determine the
309 optimal timing for 4D model updating because the inter-patient variation in the
310 correlation of E_{BD} with the elapsed time was random (Fig. 7); however, the IR marker
311 and target positions can be monitored during IR Tracking irradiation (Fig. 2). Using this
312 feature, Vero4DRT users should carefully monitor the IR marker and target positions for
313 safe beam delivery and update the 4D model when systematic deviation of these
314 positions is observed.

315 E_{4DM} and E_{BD} are important components in determining the margin size in IR
316 Tracking. In addition, one must consider the interfractional differences in the geometric
317 arrangement between the target and gold markers. Van der Voort van Zyp *et al.*
318 investigated the displacement of 4.0-mm-long platinum markers in 42 lung cancer
319 patients, showing that the displacement of fiducial markers was around 1.0 mm on
320 repeat CT.²² A similar problem might occur with the implanted gold markers²³; therefore,
321 the displacement of the implanted gold markers should be considered when determining
322 the overall margin size other than E_{4DM} and E_{BD} .

323

324

325 **V. CONCLUSIONS**

326 We analyzed the predictive errors in 4D modeling and those resulting from
327 baseline drift of the IR marker and target positions for IR Tracking. Application of IR
328 Tracking substantially reduced the geometric error caused by respiratory motion;
329 however, an intrafractional error due to baseline drift of >3 mm was occasionally
330 observed. To compensate for the predictive error resulting from the intrafractional
331 baseline drift, we recommend checking the IR marker and target positions constantly
332 and updating the 4D model several times during a treatment session.

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