

A Challenge to New Cancer Therapy (BNCT) !

- Image reconstruction for BNCT-SPECT with conditional probability -

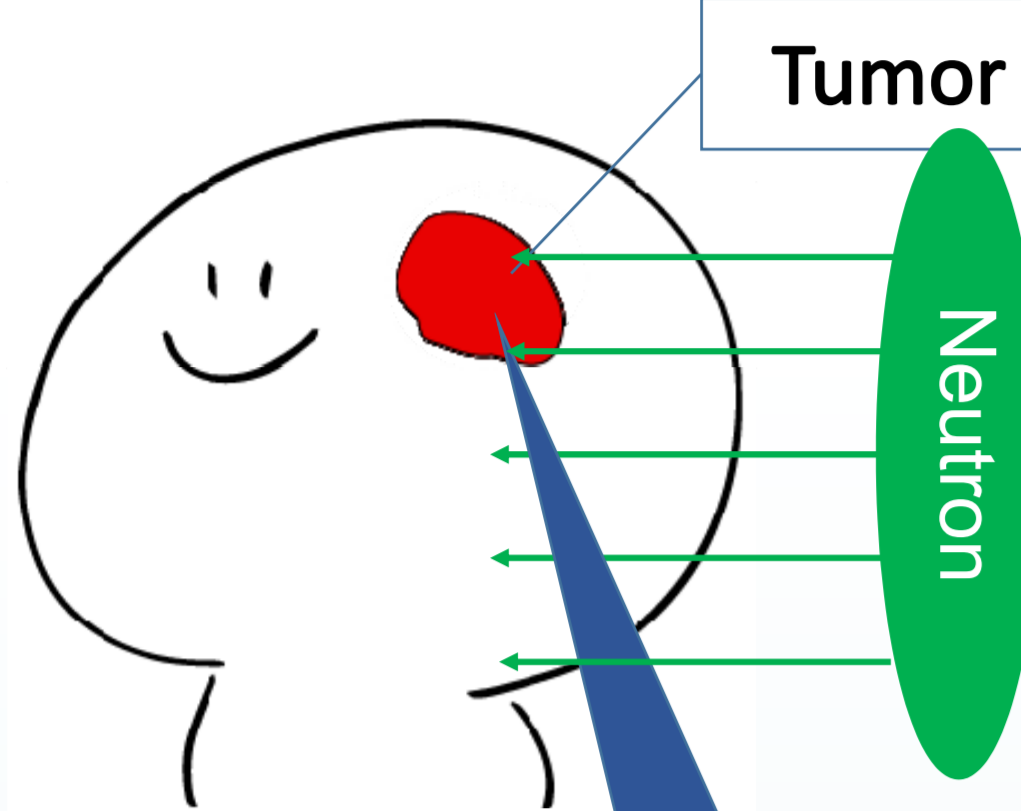
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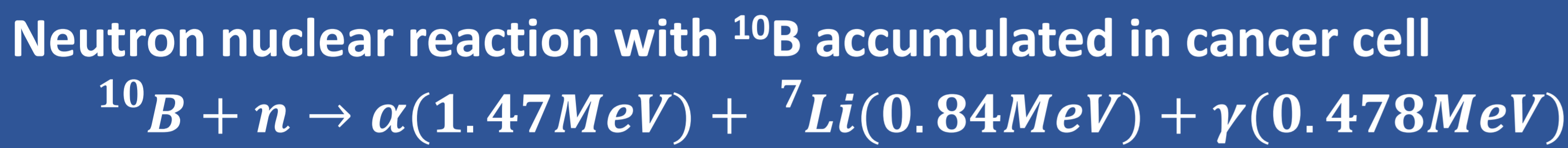
1. Introduction

Ministry of Health, Labour and Welfare reported: ~30 % Japanese people die of cancer.
 ✓ Needless to say, the cancer is a national disease in Japan. Many medical doctors and engineers have researched on new cancer therapies having high treatment effects.
 ✓ Recently, **Boron Neutron Capture Therapy (BNCT)** is known as one of the most promising radiotherapies for cancers. In this study, an **image reconstruction technique has been examined for a SPECT system to monitor the treatment effect during the BNCT in real time. This is an important technique which has not yet been established so far.**

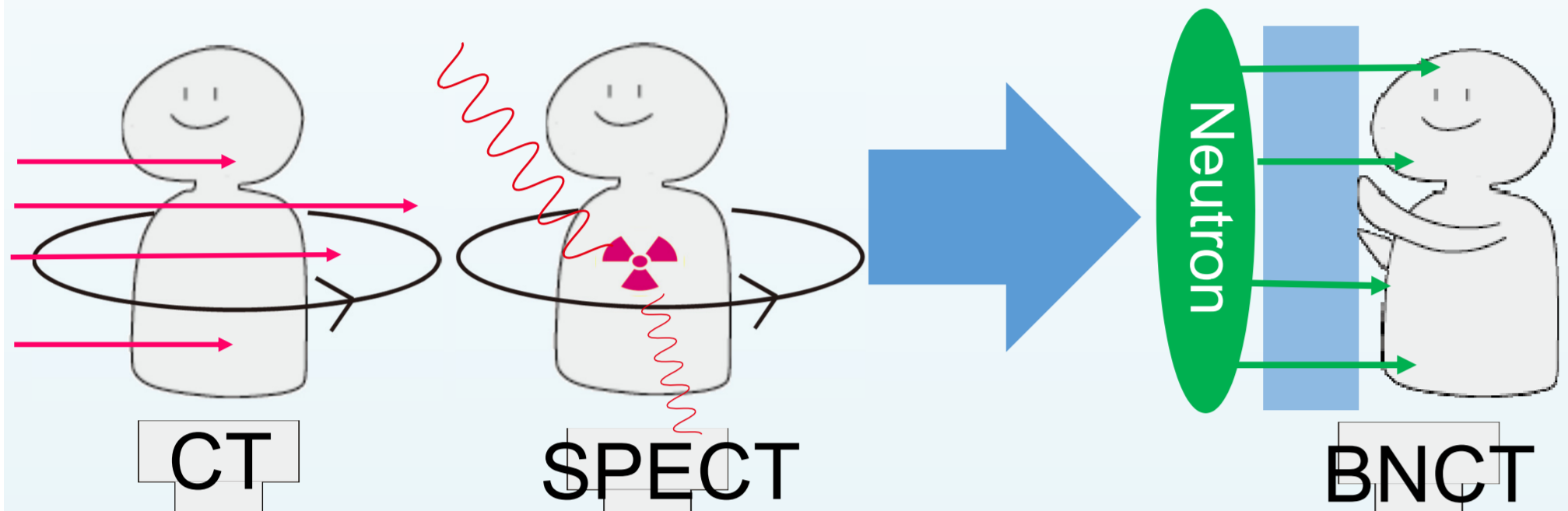
1.1 What is BNCT?



BNCT is a radiotherapy using neutrons. Tumors previously and selectively loaded with ^{10}B can be killed by α -ray and ^7Li particles produced by neutron- ^{10}B nuclear reaction.
Advantage : Cancer cells are selectively destroyed
 Ranges of the two particles in tissue: ~ tumor cell size.
 ✓ If ^{10}B is accumulated only in tumor cells, the tumor cells can selectively be killed, while neighboring cells are not damaged.
 ✓ As a result, the same tumor can be treated repeatedly (impossible for other radiotherapies).



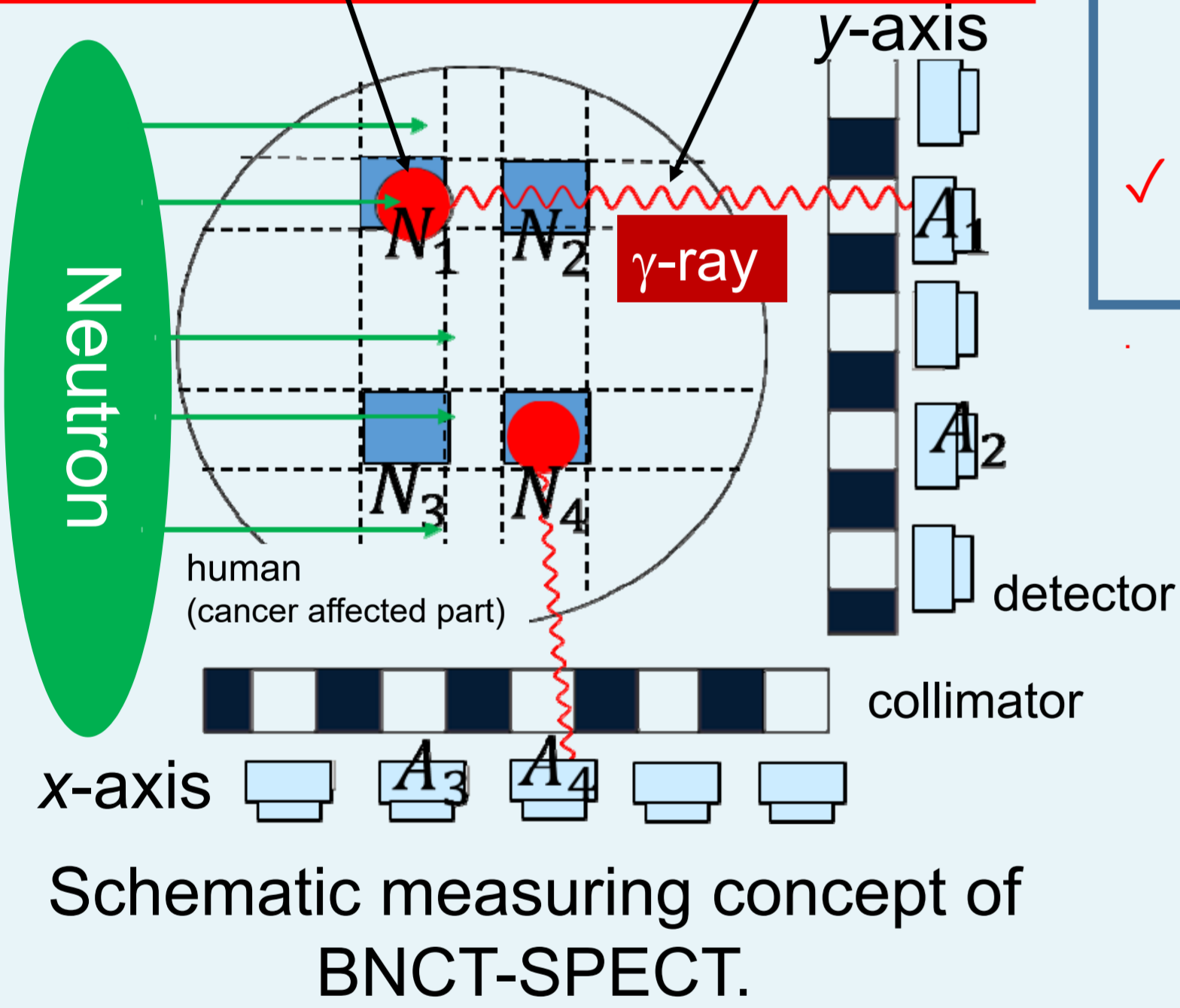
1.2 A challenge to BNCT-SPECT



✓ A patient should be fixed firmly on a neutron exit window.
 ✓ Thus impossible to rotate the patient and other measuring devices around the patient.
 ✓ The number of SPECT views is limited to be approximately three.

✓ A novel real-time SPECT is required to finally establish BNCT.
 ⇒ Murata labo., Osaka Univ. has proposed a sophisticated BNCT-SPECT system. In this study, **an image reconstruction technique for the system was examined.**

In cancer cells ^{10}B is loaded with a suitable chemical agent. 0.478MeV γ -rays emitted from neutron- ^{10}B reaction are measured with detectors outside.

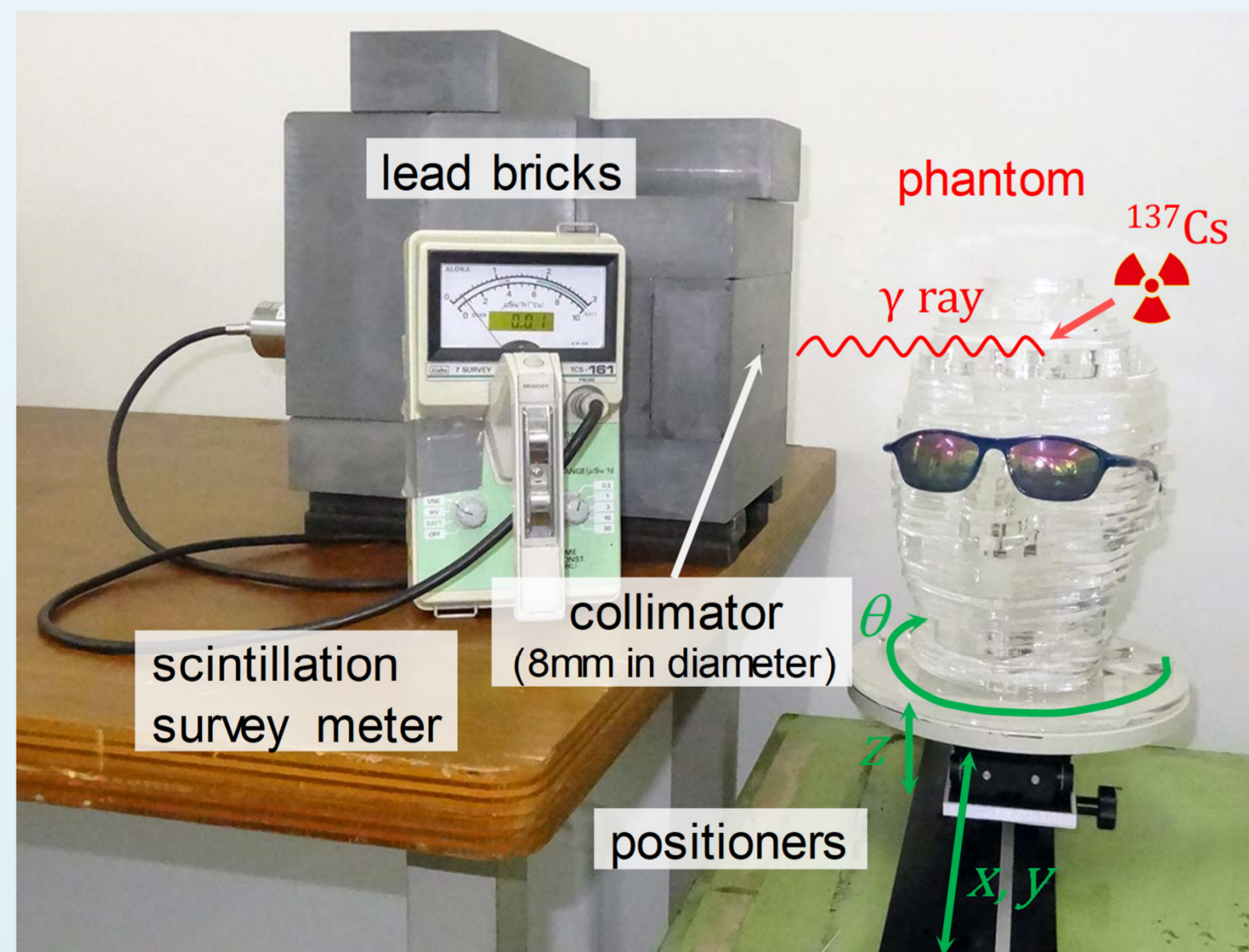


Idea
Image reconstruction for BNCT-SPECT
 ✓ 478keV γ -rays measured during BNCT.
 ✓ Linear equations formed from the count, A (counts: CPS), and attenuation terms and detection efficiencies, R
 ✓ Neutron- ^{10}B reaction rate is determined by solving the equations.

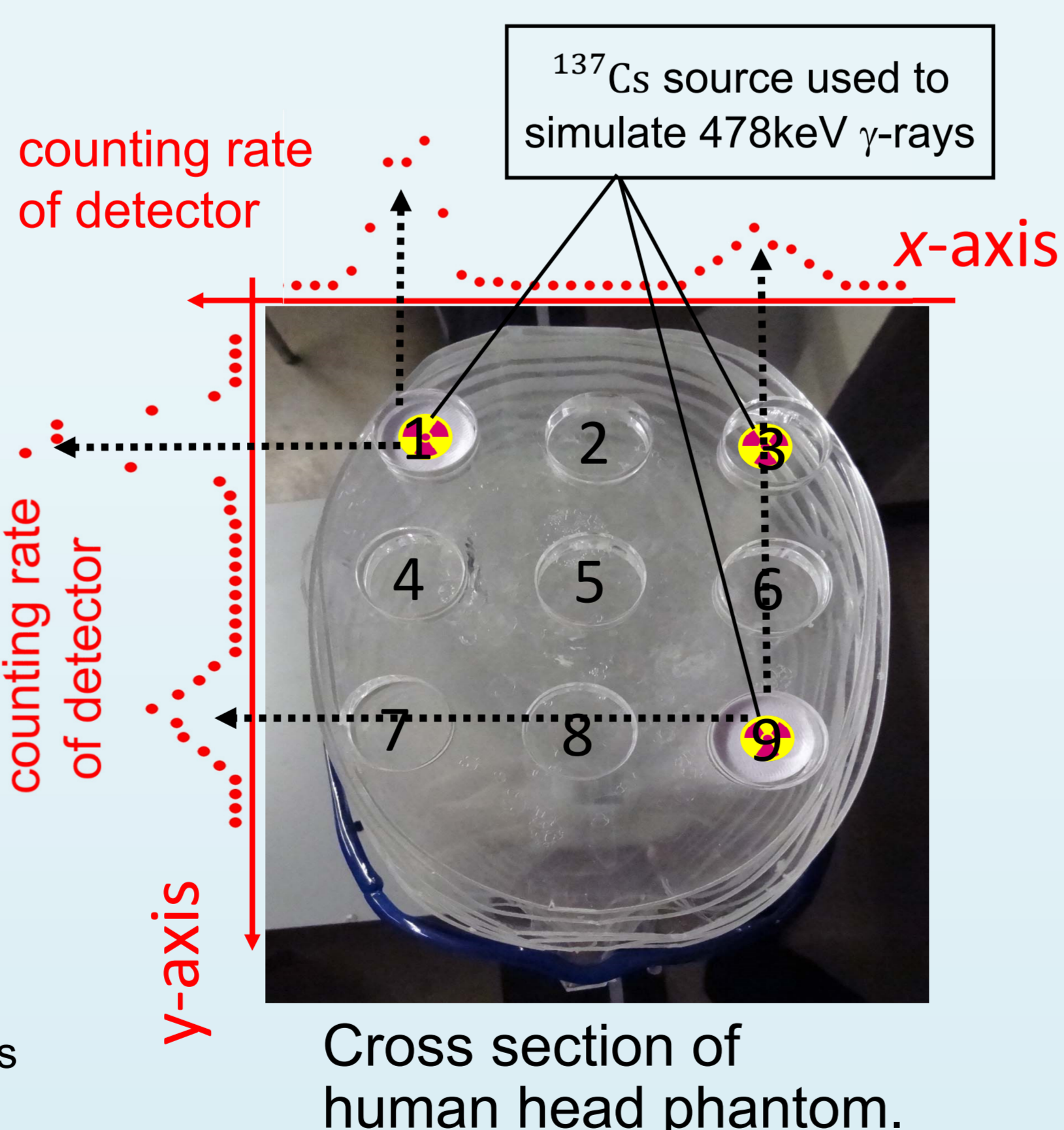
From the left figure, nuclear reactions (in cancer cells) possibly happen in four places (■). Simultaneous-linear-equation for the reaction rates, $N_1 \sim N_4$, is expressed as

$$\begin{aligned} A_1 &= R_{x1} \times N_1 + R_{x2} \times N_2 \\ A_2 &= R_{x3} \times N_3 + R_{x4} \times N_4 \\ A_3 &= R_{y2} \times N_2 + R_{y4} \times N_4 \\ A_4 &= R_{y1} \times N_1 + R_{y3} \times N_3 \end{aligned}$$

2. Experimental



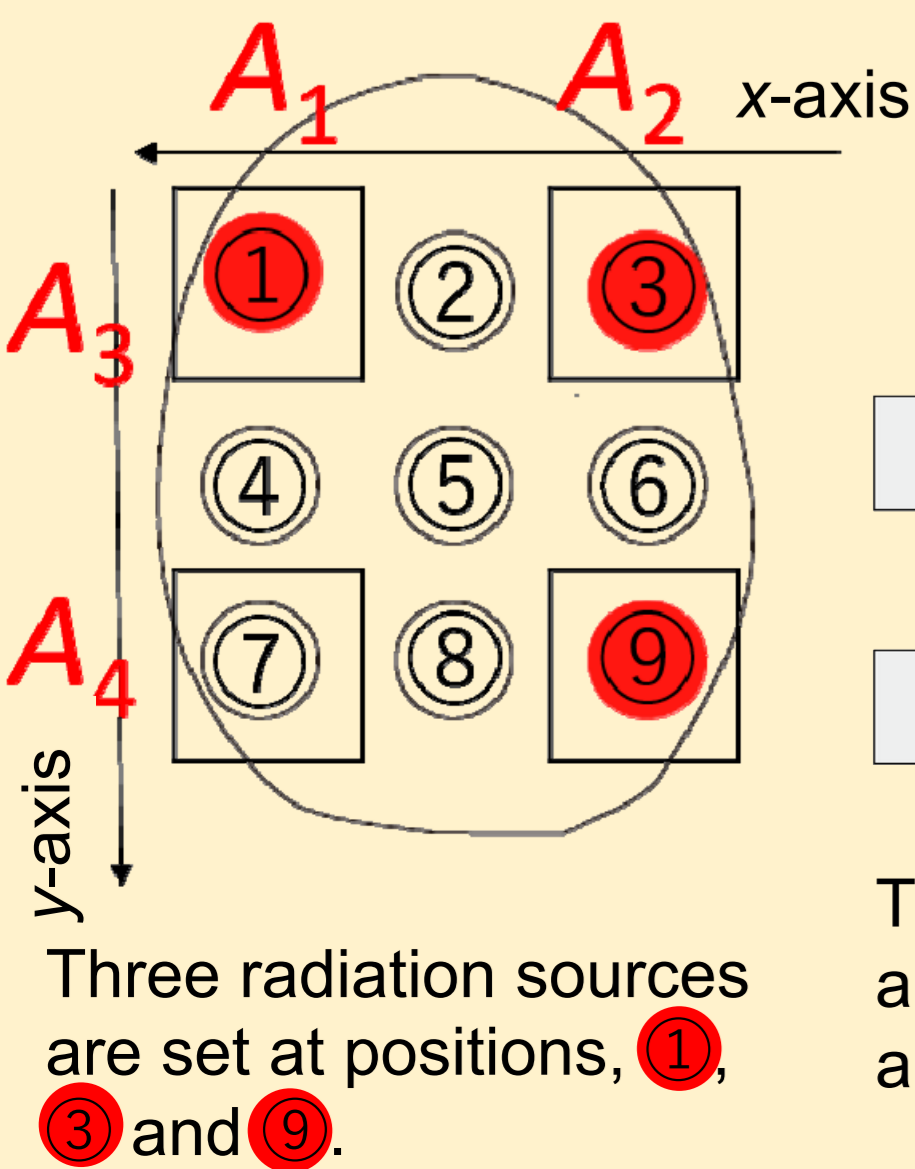
Photograph of experimental system
 An experimental system with standard γ -ray sources was developed to simulate the BNCT-SPECT.



Cross section of human head phantom.

• In the case of 2 × 2 arrangement of radiation sources

A system of 4 linear equations to determine 4 intensities is obtained from 4 measured values.



(4 equations, 4 variables)

$$\begin{aligned} A_1 &= 3.70 \approx 4.0 N_1 + 0.96 N_7 \\ A_2 &= 16.8 \approx 4.1 N_3 + 0.97 N_9 \\ A_3 &= 7.69 \approx 3.7 N_1 + 0.95 N_3 \\ A_4 &= 2.85 \approx 3.7 N_7 + 0.96 N_9 \end{aligned}$$

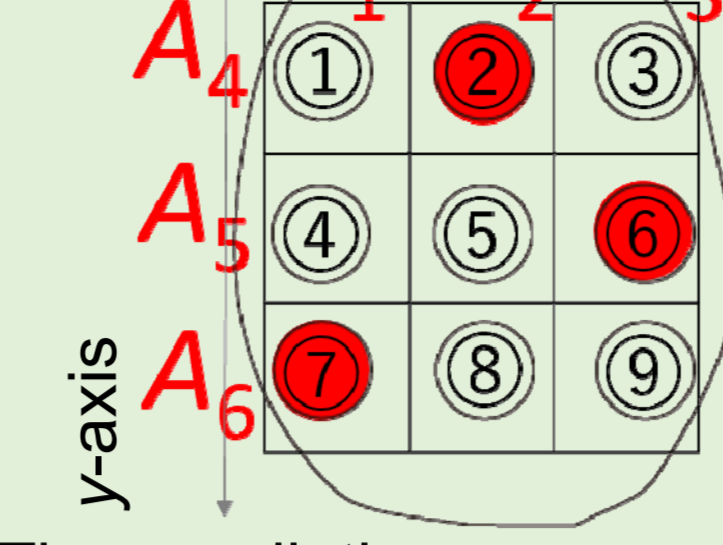
Average error: 2800 %

Mathematical solutions	True values
$N_1 = 12.0 \text{ MBq}$	$N_1 = 0.91 \text{ MBq}$
$N_3 = -39.3 \text{ MBq}$	$N_3 = 2.90 \text{ MBq}$
$N_7 = -46.1 \text{ MBq}$	$N_7 = 0.00 \text{ MBq}$
$N_9 = 180 \text{ MBq}$	$N_9 = 2.90 \text{ MBq}$

The problem becomes 2 × 2 arrangement for ①, ③, ⑦ and ⑨ positions. ⇒ Acceptable solutions not obtained, because A and R have their uncertainties.

• In the case of 3 × 3 arrangement of radiation sources

A system of 6 linear equations to determine 9 intensities is obtained from 6 measured values.



(6 equations, 9 variables)

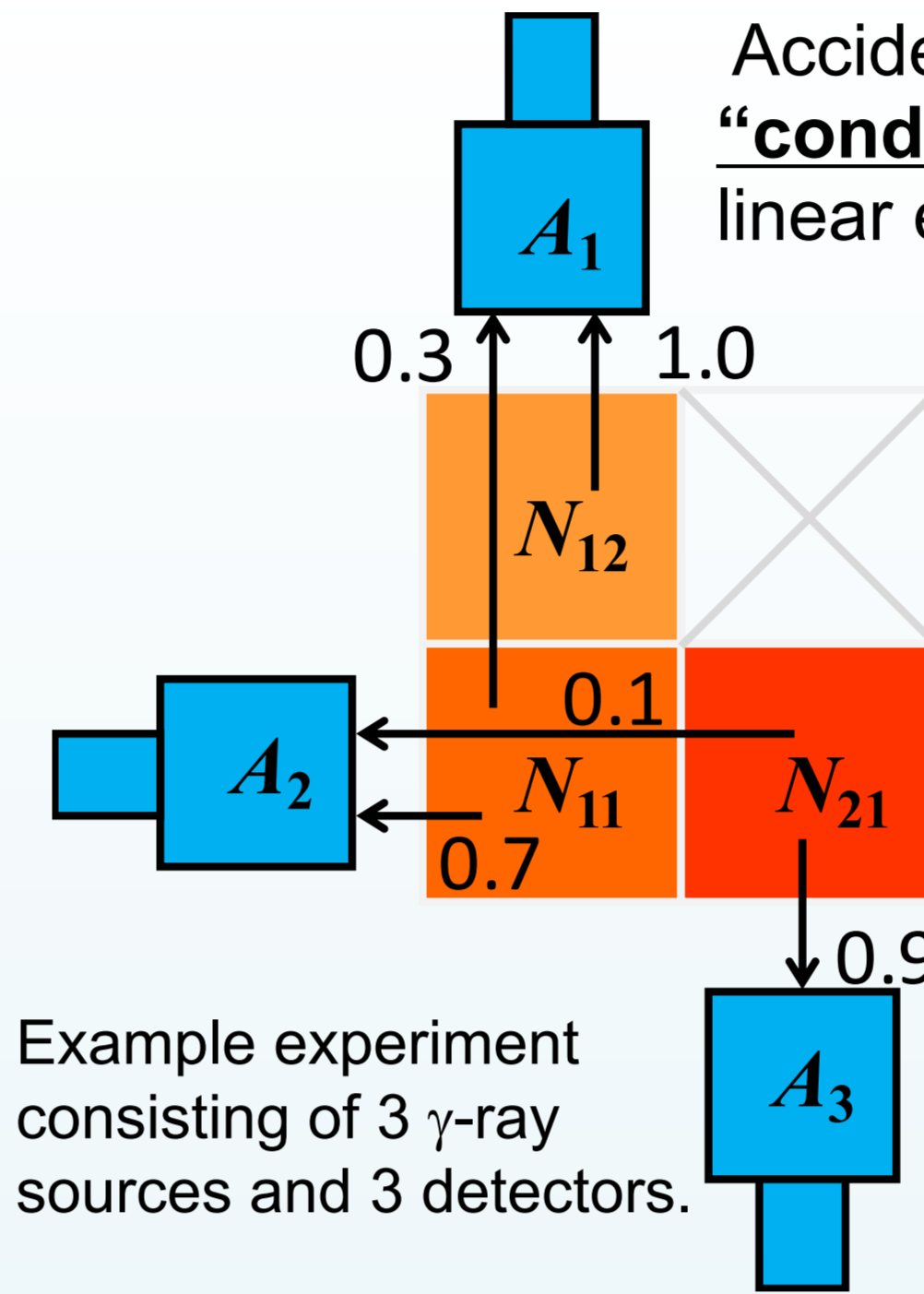
$$\begin{aligned} A_1 &= 2.78 \approx 4.1 N_1 + 2.0 N_4 + 0.91 N_7 \\ A_2 &= 38.7 \approx 3.6 N_2 + 1.7 N_5 + 0.84 N_8 \\ A_3 &= 5.77 \approx 4.3 N_3 + 2.0 N_6 + 1.0 N_9 \\ A_4 &= 10.5 \approx 3.9 N_1 + 1.9 N_2 + 0.96 N_3 \\ A_5 &= 2.78 \approx 3.7 N_4 + 1.8 N_5 + 0.91 N_6 \\ A_6 &= 19.4 \approx 3.9 N_7 + 1.9 N_8 + 0.96 N_9 \end{aligned}$$

This simultaneous-linear-equation cannot be solved mathematically.

True value
 $N_2 = 10 \text{ MBq}$
 $N_6 = 2.9 \text{ MBq}$
 $N_7 = 2.9 \text{ MBq}$

Three radiation sources set at positions ②, ⑥ and ⑦ ⇒ The 3 × 3 arrangement problem cannot be solved mathematically, because the number of variables are more than that of the equations.

3. Image reconstruction (radioactivity distribution estimation) with conditional probability



Accidentally, observing the equation, I found a **very simple way with "conditional probability"** For an experiment in the left, a system of 3 linear equations with 3 variables is obtained from 3 measured values.

True intensities $(N_{11}, N_{12}, N_{21}) = (100, 200, 300)$
 Counting rates $(A_1, A_2, A_3) = (230, 100, 270)$

The simultaneous-linear-equation is expressed as
 $A_1 = 0.3 \times N_{11} + 1.0 \times N_{12} + 0.0 \times N_{21} = 230$
 $A_2 = 0.7 \times N_{11} + 0.0 \times N_{12} + 0.1 \times N_{21} = 100$
 $A_3 = 0.0 \times N_{11} + 0.0 \times N_{12} + 0.9 \times N_{21} = 270$

Trying to calculate A_1 from true intensities and attenuation terms.

$$A_1 = 0.3 \times 100 + 1.0 \times 200 + 0 \times 300 = 230$$

Counting rate, $A_1 (=230 \text{ CPS})$ is the sum of
 { 30 CPS from N_{11} ,
 200 CPS from N_{12} ,
 0 CPS from N_{21} .

It tells me, if one count in A_1 is detected,
 conditional probability of A_1 coming from N_{11} $\left(\frac{30}{230}\right)$,
 conditional probability of A_1 coming from N_{12} $\left(\frac{200}{230}\right)$,
 conditional probability of A_1 coming from N_{21} $\left(\frac{0}{230}\right)$.

Can this simple way be effective to estimate true values ?

→ I tried to solve previous problems of 2 × 2 and 3 × 3 arrangements using conditional probabilities.

The above way is available, if the true values are known. In real experiments, one does not know the real values and in addition the measured values have their uncertainties.

Now let's assume a **white spectrum** as below.

$$(N_{11}^0, N_{12}^0, N_{21}^0) = (200, 200, 200)$$

$$\begin{aligned} A_1' &= 0.3 \times 200 + 1.0 \times 200 + 0.0 \times 200 = 260 \\ A_2' &= 0.7 \times 200 + 0.0 \times 200 + 0.1 \times 200 = 160 \\ A_3' &= 0.0 \times 200 + 0.0 \times 200 + 0.9 \times 200 = 180 \end{aligned}$$

$$A_1' = 0.3 \times 200 + 1.0 \times 200 + 0.0 \times 200 = 260$$

$$= 60 + 200 + 0$$

It means if one count is given to A_1' , the conditional probability of coming to A_1' from N_{11} is $\frac{60}{260}$.
 ⇒ Among A_1 the contribution from N_{11} is,

$$\begin{aligned} \text{from } N_{11} \text{ to } A_1 (=230) &: \frac{60}{260} \times 230 = 53.08 \text{ CPS} \\ \text{from } N_{11} \text{ to } A_2 (=100) &: \frac{0.7 \times 200}{160} \times 100 = 87.92 \text{ CPS}, \\ \text{from } N_{11} \text{ to } A_3 (=270) &: \frac{0.0 \times 200}{180} \times 270 = 0.0 \text{ CPS}. \end{aligned}$$

$$\text{The sum: } N_{11}' = 53.08 + 87.92 + 0.0 = 141 \text{ CPS.}$$

I tried to estimate the radioactivities by this simple way.

✓ Initial values:
 $(N_{11}^0, N_{12}^0, N_{21}^0) = (200, 200, 200)$
 ✓ The 1st estimation
 $(N_{11}'^1, N_{12}'^1, N_{21}'^1) = (141, 177, 283)$.
 ✓ The 2nd estimation
 $(N_{11}'^2, N_{12}'^2, N_{21}'^2) = (122, 186, 292)$

Really close !

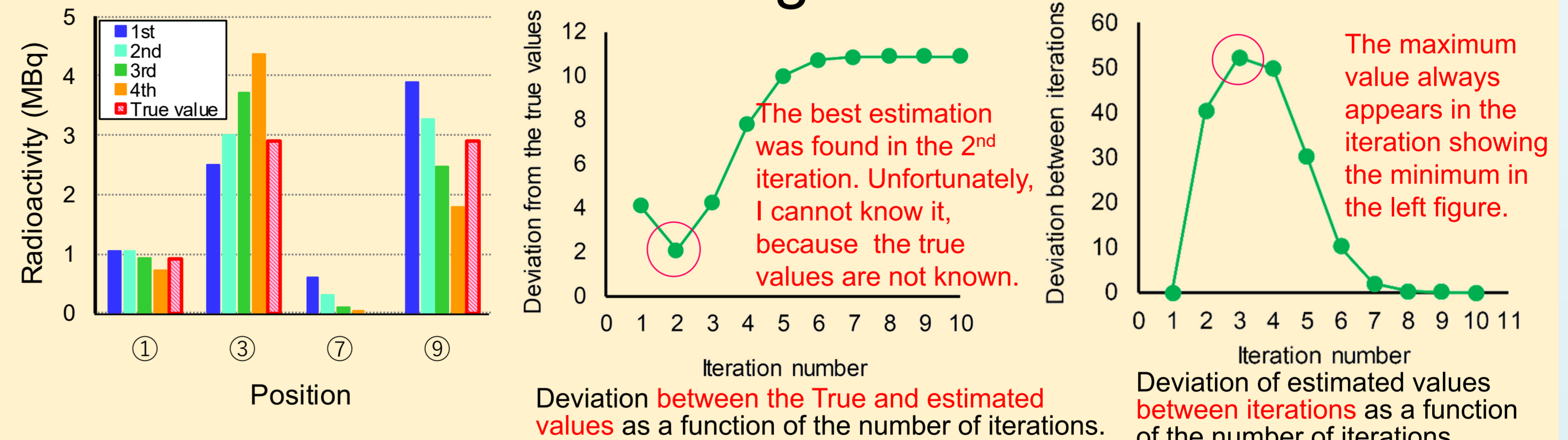
TRUE values of radiation intensities:
 $(N_{11}, N_{12}, N_{21}) = (100, 200, 300)$

Clearly the values are approaching the true values.

I expect this proposed estimation procedure can be applied to the image reconstruction of BNCT-SPECT.

4. Try again ! : Estimate radioactivity by the procedure with conditional probability

• In the case of 2 × 2 arrangement



• Estimation is possible in 2 × 2 (2nd iteration is the best).
 • Deviation between iterations would become an index to estimate the necessary number of iterations.

→ An acceptably accurate results can be estimated by the proposed procedure with conditional probability.

2nd estimated values (deviation)
 $N_1 = 1.0 \text{ MBq (+0.1)}$
 $N_3 = 3.1 \text{ MBq (+0.2)}$
 $N_7 = 0.3 \text{ MBq (+0.3)}$
 $N_9 = 3.3 \text{ MBq (+0.4)}$
 Average error: 8.1 %

• In the case of 3 × 3 arrangement

→ 3 × 3 arrangement cannot be solved mathematically. But I could successfully obtain estimated values by the proposed estimation procedure with conditional probability.

True values
 $N_2 = 10.0 \text{ MBq}$
 $N_6 = 2.90 \text{ MBq}$
 $N_7 = 2.90 \text{ MBq}$

Average error: 26 %

5. Conclusion and future works

A basic estimation procedure for image reconstruction of BNCT-SPECT was proposed only with conditional probability. As a result of investigation especially for a 2 × 2 arrangement problem, the procedure was confirmed to be applicable. This work is summarized as, Yuri Morizane et al., "Simple Image Reconstruction Technique for BNCT-SPECT with Conditional Probability", PLOS ONE, which is under review now.

	mathematically	conditional probability
2 × 2	X	⊙
3 × 3	Cannot solve	○

Future works

- Image of a large object ?
- Number of iterations ?
- Error propagation in the estimation process ?

新しいがん治療(BNCT)への挑戦!

～条件付確率を用いたBNCT用SPECT装置の画像再構成～

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1. はじめに

厚生労働省によると、がんは死因の約3割をしめる日本の国民病である。現在様々な治療法が研究されているなか、外来治療が可能で、効果的な放射線治療法として、ホウ素中性子捕捉療法(Boron Neutron Capture Therapy, BNCT)が注目されている。

本研究では大阪大学大学院工学研究科の村田研究室の協力のもと、**BNCTによる治療効果(治療されたがん細胞の位置)をリアルタイム計測するBNCT用のSPECT(単一光子放射断層撮影)装置の実現を目指し、その画像再構成法の検討**を行った。

1.1 BNCTとは

あらかじめホウ素(^{10}B)化合物をがん細胞にのみ蓄積させ、そこに中性子線をあてて核反応を起こし、その生成物(α 線、 ^7Li)によりがん細胞を死滅させる放射線治療法。

メリット(がん細胞選択性)

- ・ α 線と ^7Li の飛距離は、たかだか細胞1個分(隣の細胞に届かない)
- 正常細胞を傷つけない
- **同一箇所を複数回照射が可能**

がん細胞内で起こる ^{10}B と中性子の核反応



1.2 BNCT-SPECTへの挑戦

CT: 360° 方向から撮影可能

SPECT: 360° 方向からの撮影は不可能

治療効果リアルタイム計測には新たなSPECT装置の開発が必要
⇒BNCT-SPECT装置を提案。本研究ではその画像再構成法を検討する。

BNCT-SPECTの画像再構成方法
⇒治療の際に起こる核反応から生じる γ 線を測定し、得られた測定値 $A(\text{counts/s:CPS})$ と減衰率 R_x, R_y を使って以下のような連立方程式を立て、中性子反応率を推定。

この時、がんが存在する可能性のある位置は■の4か所。その強度を $N_1 \sim N_4$ とすると下の連立方程式が成り立つ。

$$\begin{aligned} A_1 &= R_{x1} \times N_1 + R_{x2} \times N_2 \\ A_2 &= R_{x3} \times N_3 + R_{x4} \times N_4 \\ A_3 &= R_{y2} \times N_2 + R_{y4} \times N_4 \\ A_4 &= R_{y1} \times N_1 + R_{y3} \times N_3 \end{aligned}$$

BNCT-SPECT装置の原理図

2. 実験

標準 γ 線源を用い、BNCT-SPECTを模擬した実験装置を自作し測定を実施した。

実験の様子

ファントムの断面と線源

・線源が2×2に並んでいる場合

測定値からたてた連立方程式(式4個、変数4個)

$$\begin{aligned} A_1 &= 3.70 \approx 4.0 N_1 + 0.96 N_7 \\ A_2 &= 16.8 \approx 4.1 N_3 + 0.97 N_9 \\ A_3 &= 7.69 \approx 3.7 N_1 + 0.95 N_3 \\ A_4 &= 2.85 \approx 3.7 N_7 + 0.96 N_9 \end{aligned}$$

平均誤差: 2800%

上式の数学解

$$\begin{aligned} N_1 &= 12.0 \text{ MBq} \\ N_3 &= -39.3 \text{ MBq} \\ N_7 &= -46.1 \text{ MBq} \\ N_9 &= 180 \text{ MBq} \end{aligned}$$

正解値

$$\begin{aligned} N_1 &= 0.91 \text{ MBq} \\ N_3 &= 2.90 \text{ MBq} \\ N_7 &= 0.00 \text{ MBq} \\ N_9 &= 2.90 \text{ MBq} \end{aligned}$$

①、③、⑦、⑨のみを考えればいいので2×2の問題となる。⇒誤差のため値が一致しない。

・線源が3×3に並んでいる場合

測定値から立てた連立方程式(式6個、変数9個)

$$\begin{aligned} A_1 &= 2.78 \approx 4.1 N_1 + 2.0 N_4 + 0.91 N_7 \\ A_2 &= 38.7 \approx 3.6 N_2 + 1.7 N_5 + 0.84 N_8 \\ A_3 &= 5.77 \approx 4.3 N_3 + 2.0 N_6 + 1.0 N_9 \\ A_4 &= 10.5 \approx 3.9 N_1 + 1.9 N_2 + 0.96 N_3 \\ A_5 &= 2.78 \approx 3.7 N_4 + 1.8 N_5 + 0.91 N_6 \\ A_6 &= 19.4 \approx 3.9 N_7 + 1.9 N_8 + 0.96 N_9 \end{aligned}$$

左の式は数学的に解けない。 ≠ 正解値

$$\begin{aligned} N_2 &= 10 \text{ MBq} \\ N_6 &= 2.9 \text{ MBq} \\ N_7 &= 2.9 \text{ MBq} \end{aligned}$$

⇒式よりも変数の数が多いため数学的には解けない

3. 条件付確率による画像化(線源強度推定)

連立方程式をよく見ると以下のような簡単なやり方に気づく。いま、左図(式3個、変数3個の場合)のような計測を行ったとする。

強度真値(N_{11}, N_{12}, N_{21}) = (100, 200, 300)
測定値 (A_1, A_2, A_3) = (230, 100, 270)

図の減衰率を用いて連立方程式を立てると

$$\begin{aligned} A_1 &= 0.3 \times N_{11} + 1.0 \times N_{12} + 0.0 \times N_{21} = 230 \\ A_2 &= 0.7 \times N_{11} + 0.0 \times N_{12} + 0.1 \times N_{21} = 100 \\ A_3 &= 0.0 \times N_{11} + 0.0 \times N_{12} + 0.9 \times N_{21} = 270 \end{aligned}$$

ここで真値を用いて測定値を計算してみると

$$A_1 = 0.3 \times 100 + 1.0 \times 200 + 0 \times 300 = 230$$

そう考えると、 A_1 で1カウント検出されたとき

- N_{11} からくる条件付確率は $\frac{30}{230}$
- N_{12} からくる条件付確率は $\frac{200}{230}$
- N_{21} からくる条件付確率は $\frac{0}{230}$

これを使えば真値がわからない場合でも推定できるのではないかと →条件付確率で解いてみる

今、真値がわからないので($N_{11}^0, N_{12}^0, N_{21}^0$) = (200, 200, 200)と仮定して考える。

上の連立方程式に仮定値を入れ計算すると

$$\begin{aligned} A_1' &= 0.3 \times 200 + 1.0 \times 200 + 0.0 \times 200 = 260 \\ A_2' &= 0.7 \times 200 + 0.0 \times 200 + 0.1 \times 200 = 160 \\ A_3' &= 0.0 \times 200 + 0.0 \times 200 + 0.9 \times 200 = 180 \end{aligned}$$

このようにしてすべて解いてみる。仮定値($N_{11}^0, N_{12}^0, N_{21}^0$) = (200, 200, 200)の時、1回目の推定値を $N_{11}', N_{12}', N_{21}'$ とすると

$$(N_{11}', N_{12}', N_{21}') = (141, 177, 283)$$

もう1回繰り返すと2回目の推定値は

$$(N_{11}'', N_{12}'', N_{21}'') = (122, 186, 292)$$

近い!

真値(N_{11}, N_{12}, N_{21}) = (100, 200, 300)

仮定値よりも段々と真値に近づく

条件付確率を使えば画像再構成が可能になるのではないかと

4. 条件付確率による実験解析の再挑戦

・2×2配列の場合

2×2の時の推定間偏差

2×2の時の正解からの偏差

ピークはいつも右図の極小値とほぼ同じ場所に現れる

2×2では推定可能(2回目の推定がベスト)

推定回数は、右図の通り、推定回間の偏差が最大になった推定回数前後が最適。

⇒条件付確率を使うと精度よく解けた

2回目(答えとの差)

$$\begin{aligned} N_1 &= 1.0 \text{ MBq} (+0.1) \\ N_3 &= 3.1 \text{ MBq} (+0.2) \\ N_7 &= 0.3 \text{ MBq} (+0.3) \\ N_9 &= 3.3 \text{ MBq} (+0.4) \end{aligned}$$

平均誤差: 8.1%

・3×3配列の場合

数学的には解けなかったが、条件付確率を使うと解くことができた

答え

$$\begin{aligned} N_2 &= 10.0 \text{ MBq} \\ N_6 &= 2.90 \text{ MBq} \\ N_7 &= 2.90 \text{ MBq} \end{aligned}$$

6回目(答えとの差)

$$\begin{aligned} N_2 &= 10.3 \text{ MBq} (+0.3) \\ N_6 &= 0.02 \text{ MBq} (-2.8) \\ N_7 &= 0.05 \text{ MBq} (-2.9) \end{aligned}$$

平均誤差: 26%

5. 結論と今後の課題

下の表に示すように、BNCT-SPECTの画像の再構成は、条件付確率を用いた推定法により、実現できる可能性があることが判明した。なお本研究成果は2017年8月、Yuri Morizane et al., "Simple Image Reconstruction Technique for BNCT-SPECT with Conditional Probability", PLOS ONE, として論文投稿(査読)中である。

配置	連立方程式	条件付確率
2×2	×	◎
3×3	解けない	○

今後の課題

- ・被写体が大きいときは?
- ・推定回数の決め方は?
- ・推定の正確さは?