Various Criteria of Lung Cancer Response Evaluation: Overview

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Abstract— Lung cancer is a widely spread disease that is really wreaking havor these days. Therefore, clinicians should find efficient solutions to prevent the lung tumor from growing or traveling to other parts of the body. To do so, it's important to use the imaging modalities in the interest of disease evolution assessment, as time goes by. This article is concerned with an overview of the major existing anatomic criteria used over the time for response evaluation in lung tumor. In addition, this paper summarizes the concepts of RECIST, revised RECIST, and the WHO guidelines. Added to that, an examination of the correlation between the various set of criteria is presented and the shortcomings and advantages of each one are highlighted. Further, the usefulness of these guidelines for the image processing community is also studied. We aim by this paper to help the oncology community develop the treatment procedure, forecast whether a treatment has enough merit to be used by larger numbers of patients and provide a more efficient care for the patient.

Keywords— RECIST; WHO criteria; RECIST 1.1; Lung Cancer; Advantages; Limitations; Image Processing.

I. INTRODUCTION

Imaging represents 90% of the arguments for the therapeutic choice, and indicates the therapeutic evaluation of the tumor. Assessment of the change in tumor burden is an important feature of the clinical evaluation of cancer therapeutics: both tumor shrinkage (objective response) and disease progression are useful endpoints in clinical trials. For this purpose, many definitions and assumptions of tumor response criteria have been explored over the years. In order to tell whether cancer patients improve ("respond"), stay the same ("stable") or worsen ("progression") during the treatment, different sets of published rules were defined.

Early attempts to define the objective response of a tumor to anticancer agent or drugs, were made in the early 1960's and were developed over the years. Lung cancer is the leading cause of cancer death for men and women all over the world [1]. In fact, according to the World Health Organization

(WHO) rankings, lung cancer is the most commonly diagnosed cancer worldwide (1.8 million,13.0% of total) [2] and accounts for more deaths annually than breast, prostate and colon cancer combined [3]. These statics were not always so. About 150 years ago, lung cancer was a rare disease. In 1878, malignant lung tumors represented only 1% of all cancers. By 1918, the percentage has increased to almost 10% and by 1927 to more than 14% [4]. When radiation and x-ray [5] were discovered at the end of the 19th century, physicist took advantage of these discoveries to probe the human body and non-surgical cancer treatment approaches came along [6]. Surgeons and hospital radiologists started to work together. In 1968, a large amount of cancer data started to be compiled with the use of computers. Great efforts have been spent over the past 50 years.

The imaging modalities or tests that are commonly performed [7], [8] in order to determine the stage of lung cancer are: CT scan of the chest and abdomen [9] [10] which provides detailed pictures of lung tumor and anatomy and is important for staging and treatment planning. PET scan [11] [10] that uses radioactive sugar because cancer cells use sugar rapidly and is important for identifying spread to lymph nodes or other organs. MRI scan of the brain which is also one of the best currently available and reproducible methods to measure target lesions selected for response assessment. MRI scan of the brain may be necessary to determine if the tumor has spread to the brain.

II. QUANTITATIVE IMAGING BIOMARKERS

In order to determinate the effectiveness of new oncology drugs, a number of sets of rules and morphological criteria were developed over the years: The World Health Organization (WHO) criteria that were published since 1981 by Miller et al. [12] and continues to be used [13] even more than a decade after the introduction of Response Evaluation Criteria In Solid Tumors version 1.0 (RECIST 1.0) criteria that were published in 2000 by Therasse et al. [14] and the revised in 2009 as version 1.1 (RECIST 1.1) [15]. These sets

of criteria were developed to estimate response to cytotoxic chemotherapeutic agents [16] and to observe change in tumor size during treatment [17].

The World Health Organization (WHO) criteria are based on a two-dimensional measurement as shown in Figure 1 and the sum of the products of the longest diameters (LD) with its greatest perpendicular in the target lesion, or in other terms the surface of the rectangle that englobes the target. The objective response of a measurable disease [18] can be confirmed 4 weeks [19] after the beginning of the treatment and is depending upon the percentage of the evolution in the product of the longest diameters, four response types were identified: Complete response (CR)-The disappearance of all known disease [12] and all signs of cancer in response to treatment. The complete response does not always mean the cancer has been cured and is also called complete remission and that's the positive response that the treatment aims to give [20]. Partial response (PR)-A decrease of at least 50% from baseline (BL) in the size of a tumor [19]. Stable disease(SD)-Cancer that is neither decreasing nor increasing in extent or severity. According to the WHO criteria the stable disease is a decrease of lower than 50% or increase of lower than 25% with regard to the previous test [19]. Progressive disease (PD)-Cancer that is growing, spreading or getting worse. It is an increase of greater than 25% of one or more lesions or appearance of new lesions [19].

WHO criteria were progressively abandoned because of its lack of standardization over time. The Response Evaluation Criteria in Solid Tumor (RECIST) [21] [14] are based on the measurement of the longest diameter of lesions as shown in Figure 1; unidimensional rather than bi-dimensional measures for evaluating the tumor burden. It introduces the notion of the measurable minimal size, and the maximal number of lesions that will be taken into account (up to 10, a maximum of 5 per organ), thus, the notion of target and non-target lesion.

CT scans presented in Figure 1 are provided by Radiology service of Salah Azaiez Institute in Tunisia. The revised RECIST guideline version 1.1 (RECIST 1.1) [22] was presented by the RECIST Working Group, based in part on investigations using a database consisting of more than 6,500 patients with about 18,000 target lesions [23]. Major changes in RECIST 1.1 included lymph node LN measurement, the maximum number of target lesions, and the definition of disease progression [24].

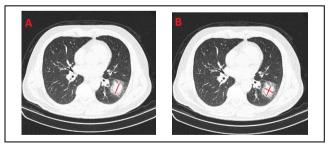


Fig. 1. A: RECIST unidimensional and B: WHO two-dimensional

The maximum number of target lesions have been reduced from ten to fine in total, and from five to two per organ. Disease progression have been clarified [25]. RECIST 1.1 showed almost perfect agreement with RECIST 1.0 in tumor response assessment of patients with non-small cell lung cancer (NSCLC) [23].

III. RECIST 1.1

Currently, the standard metric, by which disease progression is measured, is the set of guidelines RECIST (version 1.1).

Initially, there are two types of tumor lesions: *Measurable lesions*- that can be accurately measured in at least one dimension with longest diameter ≥ 20 mm using conventional techniques or greater than 10 mm by spiral CT scan. *Non-measurable lesions*- all other lesions, including small lesions where longest diameter < 20 mm with conventional techniques or <10 mm with spiral CT scan. Only patients with measurable disease at baseline should be included in protocols where objective tumor response is the primary endpoint [26].

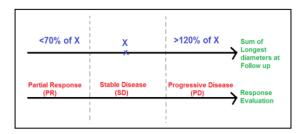
All measurable lesions up to a maximum of two lesions per organ and five lesions in total, representative of all involved organs should be identified as target lesions and recorded and measured at baseline [27]. Target lesions should be selected on the basis of their size (lesions with the longest diameter LD). A target lesion is a measurable lesion whose longest diameter is greater than 10 mm if it is clinically assessed or with CT, and greater than 20 mm if it is radiographically assessed. If the target lesion is a LN, the short-axis measurements should be used and recorded \geq 15 mm.

All lesions not identified as target lesions, including pathological lymph nodes and all non-measurable lesions, should be identified as non-target lesions and be recorded at baseline [28]. Lymph nodes, if considered as a non-target lesion, should be used and recorded < 15 mm.

All lesions (or sites of disease) not identified as target lesions, including pathological lymph nodes and all non-measurable lesions, should be identified as non-target lesions and be recorded at baseline [28]. Measurement of these lesions are not required and they should be followed as 'present', 'absent' or in rare cases 'unequivocal progression'. Lymph nodes, if considered as a non-target lesion, should be used and recorded < 15 mm.

The response quantification criteria of target lesions can be: Complete response(CR)-Disappearance of all target lesions. Partial Response (PR)-At least a 30% decrease in the sum of the longest diameter of target lesions, taking as reference the baseline sum of the longest diameter. Stable Disease (SD)-Neither sufficient shrinkage to qualify for PD nor sufficient increase to qualify for PD, taking as reference the smallest sum LD since the treatment started. Progressive Disease (PD)-At least a 20% increase in the sum of the LD of target lesions, taking as reference the smallest sum LD since the treatment started or the appearance of one or more new lesions. Figure 2 below depicts the response quantification of target lesions.

Fig. 2. Schematic representation of response quantification



The response quantification criteria of non-target lesions can be: Complete response (CR)-Disappearance of all non-target lesions [29] and normalization of tumor marker level. Incomplete response/ Stable Disease (SD)-Persistence of one or more non-target lesion(s) or/and maintenance of tumor marker level above the normal limits. Progressive Disease (PD)-Appearance of one or more new lesions and/or unequivocal progression of existing non-target lesions.

IV. CRITICS

The table 1 summarizes the advantages and the drawbacks that WHO criteria, RECIST criteria and RECIST 1.1 criteria present in the evaluation of the tumor response to treatment of patients with lung cancer.

V. IMAGE PROCESSING COMMUNITY AND RECIST CRITERIA

RECIST criteria have been of use for the image processing community in terms of tumor measurement and growth rate computation. Levine et al. [30] used geometrical considerations from synthetic tumor data embedded in CT data to prove that RECIST criteria give relatively better results for union of ellipsoids than realistic lung tumors. Bevilacqua et al. [31] proposed a technique for measuring and classifying lung nodules. Starting with a framework that fully and automatically segment the respiratory system and semiautomatically segment pulmonary nodules using a set of synthetic data [32]. These first two steps have been established for accurate assessment of tumor progression and its classification according to its malignancy. Prescott et al. [33] emphasizes in their study that WHO and RECIST criteria are the only two quantitative imaging biomarkers for solid tumor and discuss their challenges. Emaminiad et al. [34] used chest CT scans of NSCLC patients for lung tumor segmentation, tumor-related image features measurement and cancer recurrence risk prediction. Their study highlights the difficulty faced by radiologists in interpreting a large number of CT scans and subjectively measuring tumors longest diameter and the unreliability of RECIST criteria due to the inter-reader variability. Diciotti et al. [35] proposed an estimation on nodule size that doesn't need tumor segmentation. Their method comprises a scale-space representation where lung nodules are analyzed by Laplacian of Gaussian kernels. Using a set of CT scans, RECIST criteria where utilized to prove the high correlation between the characteristic scale computed in the Laplacian of Gaussian scale-space and the diameter of the sphere that have the same volume. Brown et at. [36] presented

a Computer Aided lung nodule Detection system, with a law false positive rate and a measurement system that generates RECIST criteria reports. Paskin et al. [37] modeled a set of clinical tumors that cover various geometries and locations within the lung. The set of tumor models are meant to be used as ground truth data for volumetric methods comparison and volumetric RECIST application. Beaumont et al. [38] proposed a method to predict the reliability of assessment of lung tumor volume changes on CT scans using RECIST criteria.

CONCLUSION

We provide in this paper an exhaustive summary of lung cancer and the imaging modalities that are commonly used for its diagnosis. An overview of the various morphological criteria used for cancer response evaluation is presented followed by a comparative study between them. We described then the existing works of the literature that are concerned with the usefulness of the guideline for the image processing community. One can foresee the role of quantitative imaging biomarkers will not only continue to grow, but will also benefit significantly, in terms of accuracy, from the future advancements in medical image processing techniques.

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 $TABLE\ I.\ SUMMARIZATION\ OF\ ADVANTAGES\ AND\ DRAWBACKS\ OF\ TUMOR\ RESPONSE\ EVALUATION\ CRITERIA\ TO\ LUNG\ CANCER\ TREATMENT.$

Method	Ref.	Advantages	Ref.	Limitations
WHO	[39]	-Relatively easy and fast to do (4 mouseclicks,	[14]	-The integration of the change in size of measurable lesions into response
		one multiplication).		assessment vary among research groups.
	[20]	-It's possible to determine the quantity of the	[14]	-The minimum lesion size and number of lesions per organ to be
		effect the treatment upon the tumor.		measured differ from a research group to another.
	[39]	-The distance calculation between two points is	[14]	- The progressive disease is defined as the considerable variation in only
		generally available.		one lesion by some researcher groups and defined as the considerable
	[39]	-Better detection of the change in tumor than	F4.43	variation of overall tumor load by others.
	5007	RECIST.	[14]	- The integration of three-dimensional measures into response assessment
	[20]	-It's possible to compare drugs occording to their		became confusing since the arrival of new imaging modalities like
	[40]	effectivity.		computed tomography CT and magnetic resonance imaging MRI.
		-Even though the WHO criteria are old, they are	F 403	-The volume measurements are not included in the WHO criteria partly
	5443	still beeing practiced and are effective in many	[43]	because of the limitation of the imaging techniques as well as the
	[41]	clinical response evaluation.		restriction of available measurement methods.
	[42]	-WHO criteria shows progression of tumor more	577	-Instable results when acquisition of slice angle and assessment of tumor
		rapidly than RECIST.	[7]	cavitation.
		-WHO criteria are more sensitive then other sets	[20]	-The planning of such studies required too much time.
DECIGE	5001	of criteria to changes in tumor volume.	F 403	The state of the property of the state of th
RECIST	[23]	-RECIST 1.0 has been widely accepted as a	[49]	-The issues that were raises on RECIST 1.0 includes the total number of
1.0		standardized measure of tumor response,		lesions to be assessed, the assessment of LNs and the utility of newer
		particularly in oncologic clinical trials with	F 4 2 3	imaging technologies such as multi-detector computed tomography
	F401	objective response or time to progression as	[43]	(MDCT) and positron emission tomography (PET).
	[40]	primary endpoints.	[50]	-The number of target lesions to be treated is quite big.
	[44]	-The application of RECIST criteria is simpler	[50]	-The step of confirmation can waste a lot of time.
	[45]	and more convenient than the WHO criteria as well as its calculation.	[51] [10]	-Lymph nodes are not adquatly assessedThe imaging guidance is missing (ei .what imaging modalities should
	[40]	-The response evaluation is standardized.	[10]	be uses? Functional imaging such as PET, SPECT, etc or anatomical
	[46]	-There is no major discrepancy with the WHO	[52]	imaging such as CT, MRI,etc)
	[40]	criteria (especially for NSCLC patients) which	[32]	-Uni-dimensional RECIST criteria does not help predict overall survival
	[47]	makes it easier for clinicians in the application of	[53]	as accurately as volumetric measurements.
	[48]	response evaluation criteria.	[55]	-RECIST is not the most sensitive set criteria to detect complete
	[10]	-It's an earlier endpoint than survival. So it's	[54]	remission (e.g. PERCIST is a better detector of complete response).
		really a surrogate.	[0.]	-Non applicability of RECIST in certain disease types (e.g. brain tumor,
		Teany a surrogate.		lymphoma, bone lesions).
RECIST	[46]	-Its major advantage over earlier methods of	[58]	-One of the several weaknesses that RECIST has is that it's only for solid
1.1	[]	response was simplifying the number of lesions	[0.0]	tumors. As a matter of fact, there is no criteria for non-solid tumors,
,-	[55]	that had to be measured and types of	[59]	especially that, in some cancers, tumors can change from solid to non-
	L 1	measurement she took: one measurement instead		solid.
		of two measurements and two lesions in each	[46]	- RECIST also does not treat the case where the tumor growth is non-
		organ instead of up to ten. In brief, RECIST 1.1	[60]	spherical or asymmetric.
	[41]	were published to simplify, optimize and	` 1	-RECIST 1.1 can be misleading in some cases
		standardize the original criteria.	[46]	-RECIST 1.1 can generate a mixed response (i.e. some lesions become
		-Since RECIST 1.1 assess a maximum of 5	[61]	bigger and others become smaller and sometimes there is a new lesion)
	[56]	tumors (vs. 10 in RECIST), they result in a		especially when immune treatments are being used. However, if you wait
		higher complete response rate than the original	[62]	long enough, the tumor may disappear and thus the response may even be
		RECIST criteria (at least in lymph nodes).	[63]	complete.
	[57]		[64]	-RECIST criteria use single 2D slice plane, ignoring the fact that tumors
	[48]	-RECIST 1.1 relatively performs the best		are non-homogenous and are 3D structures.
		prediction of overall survival		