

Imaging di precisione per la diagnosi, la stadiazione e il monitoraggio dei tumori:

Il contributo dell'Intelligenza Artificiale



UNIVERSITÀ
DEGLI STUDI
DI MILANO

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2. *Department of Oncology and Hemato-Oncology, University of Milan*
3. *Icahn School of Medicine at Mount Sinai, New York*



Icahn
School of
Medicine at
**Mount
Sinai**

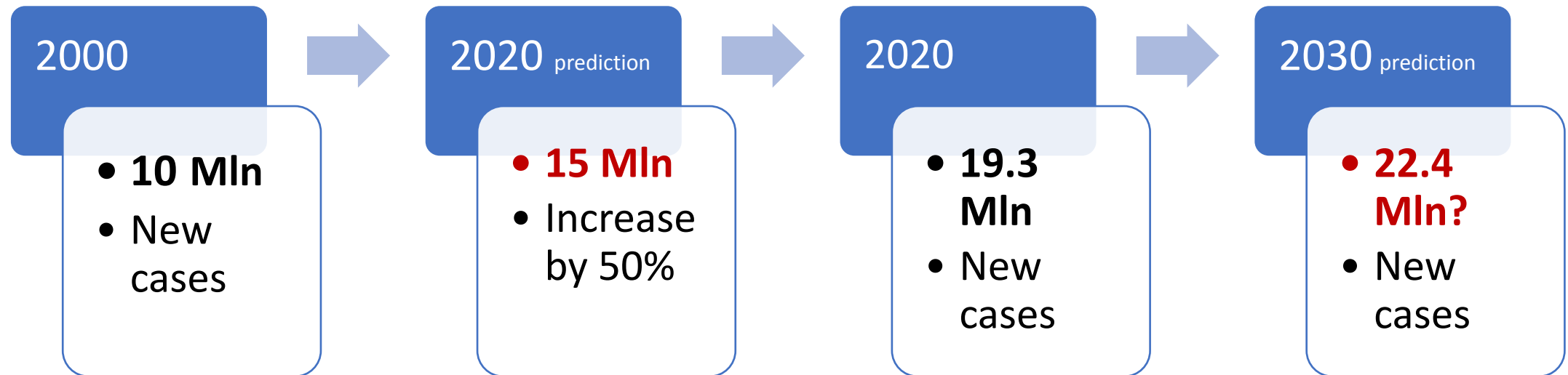


IEO

European Institute of Oncology

Research
for care

By 2030 $\square$ **76 million** deaths caused by the modelled* cancers



Global cancer pandemic

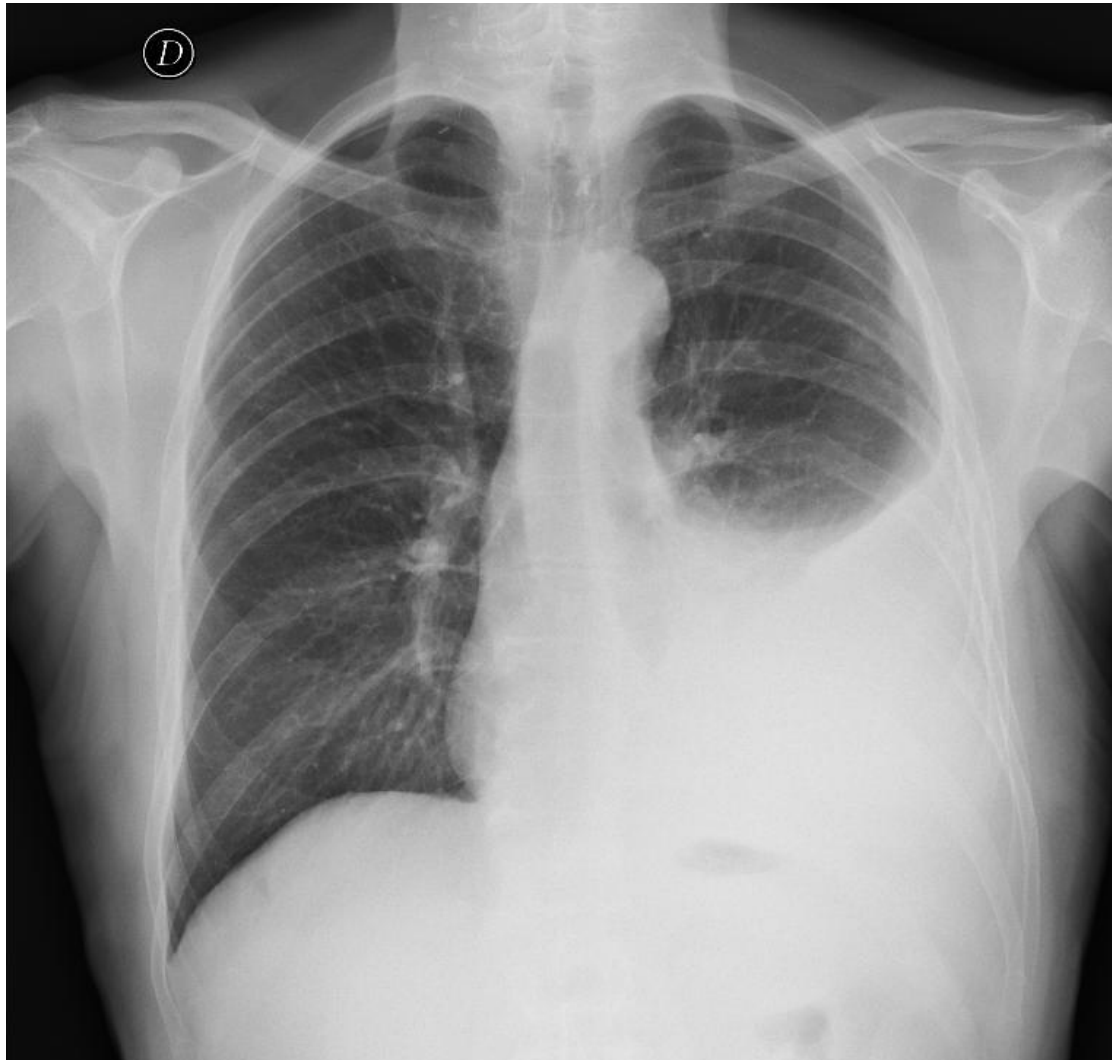
*microsimulation model of 11 cancers

AI for cancer detection & screening

Why? How? Who?

Chest X-ray (AI challenge)

Cheap, available, low radiation ☐ *Elevated workload* ☐ *AI solution*



AI solution interface showing the chest X-ray with bounding boxes and a table of findings.

AI Findings

Radiographic Findings on Posterior - Anterior (PA)

Abbr.	Name	AI Confidence*
PTX	Pneumothorax	-
PEF	Pleural Effusion	10
LES	Pulmonary Lesions	7
CO	Consolidation	-
AT	Atelectasis	-

AI Findings (highlighted) Not found by AI

* Confidence Score Range (1-Low to 10-High)
(AI Confidence above 5 are highlighted)

Caution

AI results are auto generated and can be incomplete or incorrect. Assess original images for any decision.

AI Confidence score should be always interpreted as the non-diagnostic likelihood of the findings.

TP

Chest X-ray (AI challenge)

Cheap, available, low radiation ☐ *Elevated workload* ☐ *AI solution*



removed-
1951-01-01 M 608681881045859...

AI Findings

Radiographic Findings on Posterior - Anterior (PA)

Abbr.	Name	AI Confidence*
PTX	Pneumothorax	-
PEF	Pleural Effusion	-
LES	Pulmonary Lesions	9
CO	Consolidation	-
AT	Atelectasis	-

☒ AI Findings ☐ Not found by AI

* Confidence Score Range (1-Low to 10-High)
(AI Confidence above 5 are highlighted)

Caution

AI results are auto generated and can be incomplete or incorrect. Assess original images for any decision.

AI Confidence score should be always interpreted as the non-diagnostic likelihood of the findings.

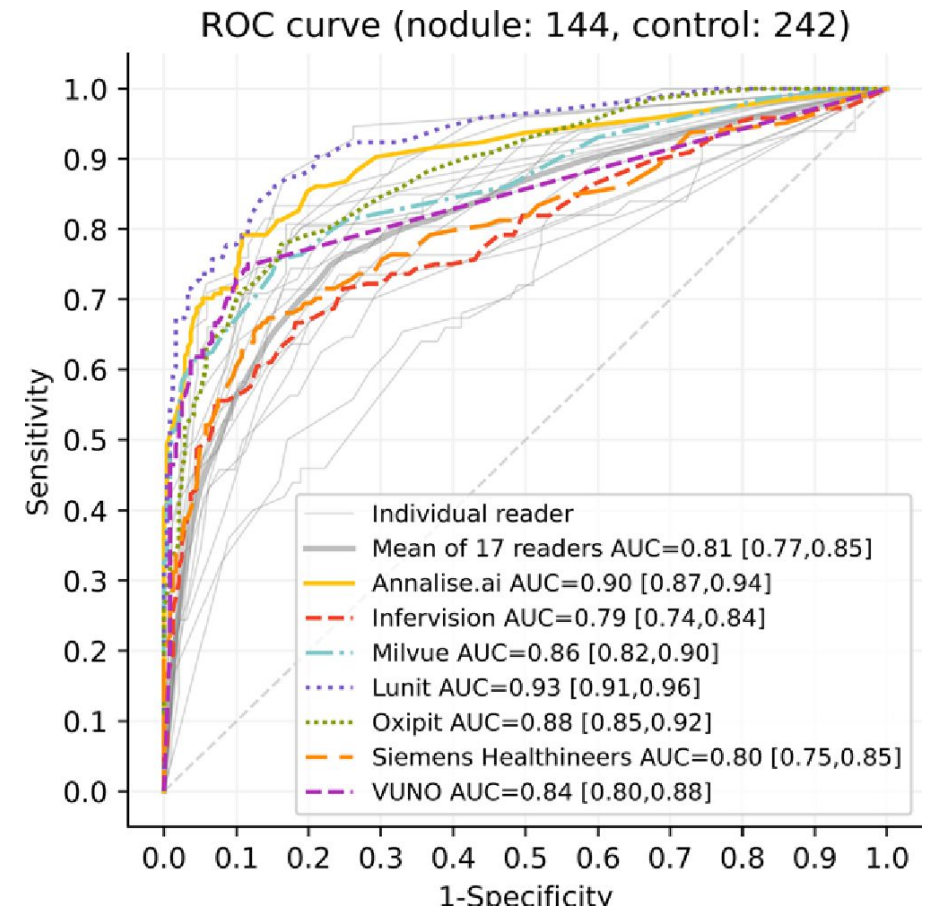
Show Labeling

TP

Comparison of Commercial AI Software - Lung Nodule Detection

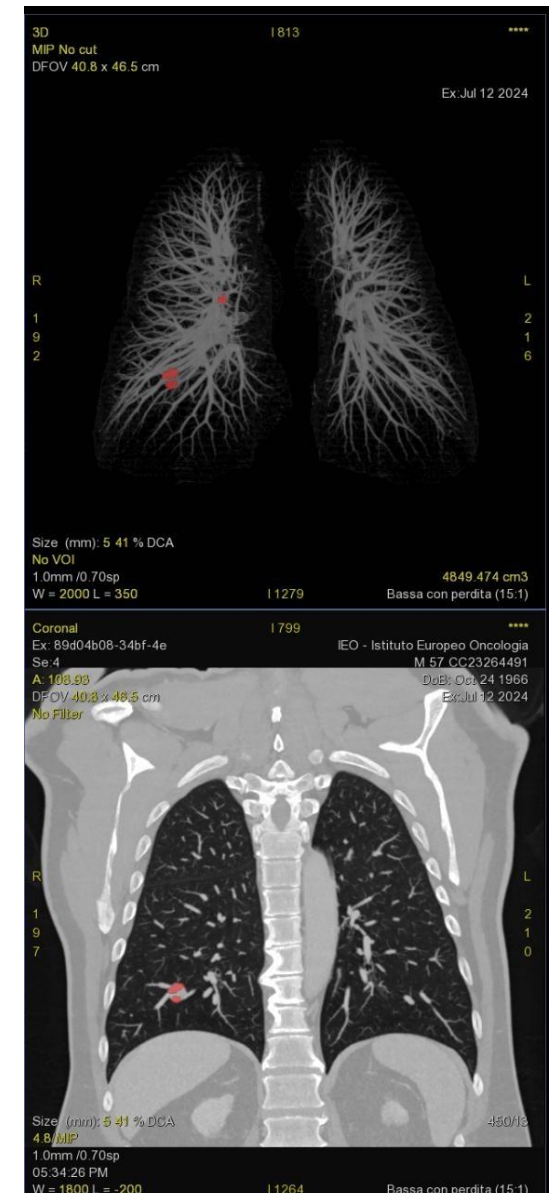
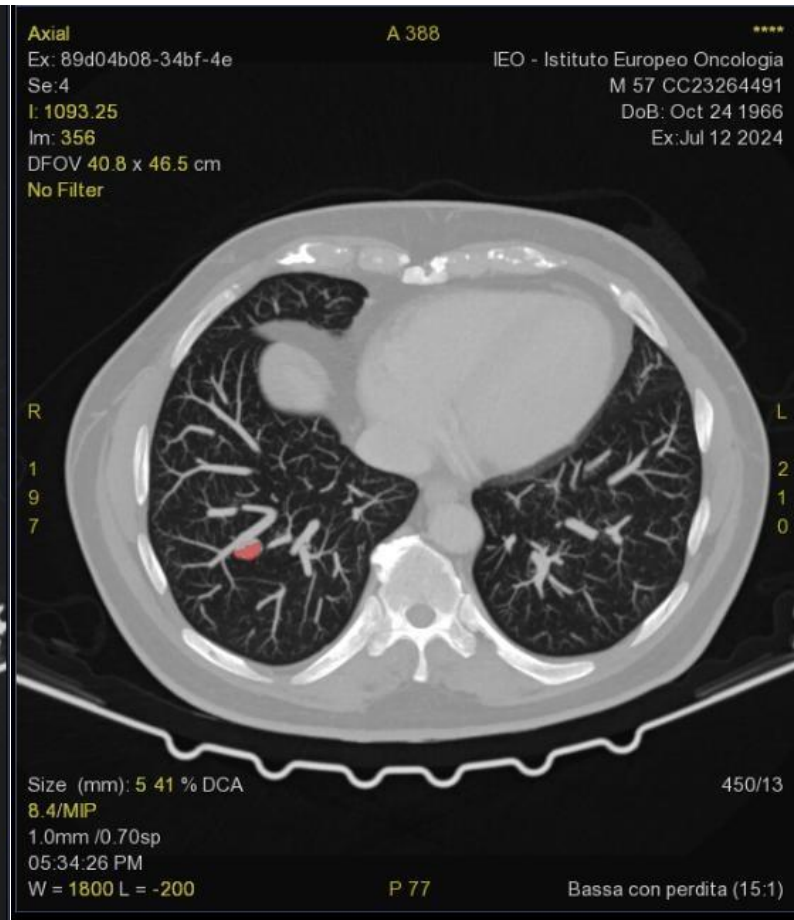
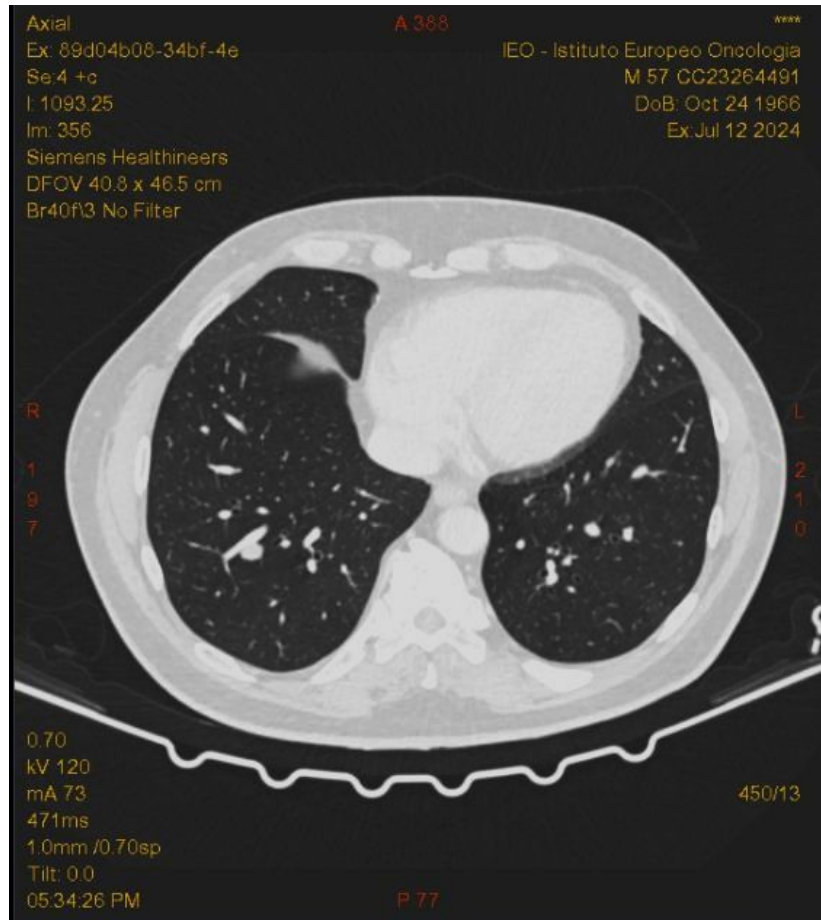
404 cases / 7 centres¹

- Human readers (n = 17)
 - Mean AUC = 0.81 (95% CI: 0.77, 0.85)
- Superior performance for:
 - Annalise.ai (AUC, 0.90 [95% CI: 0.87, 0.94]; P < .001)
 - Lunit (AUC, 0.93 [95% CI: 0.91, 0.96]; P < .001)
 - Milvue (AUC, 0.86 [95% CI: 0.82, 0.90]; P = .04)
 - Oxipit (AUC, 0.88 [95% CI: 0.85, 0.92]; P = .005)
- No difference for:
 - Infervision (AUC, 0.79 [95% CI: 0.74, 0.84]; P = .33)
 - Siemens (AUC, 0.80 [95% CI: 0.75, 0.85]; P = .60)
 - VUNO (AUC, 0.84 [95% CI: 0.80, 0.88]; P = .26).



Lung cancer screening with low-dose CT (<1mSV)

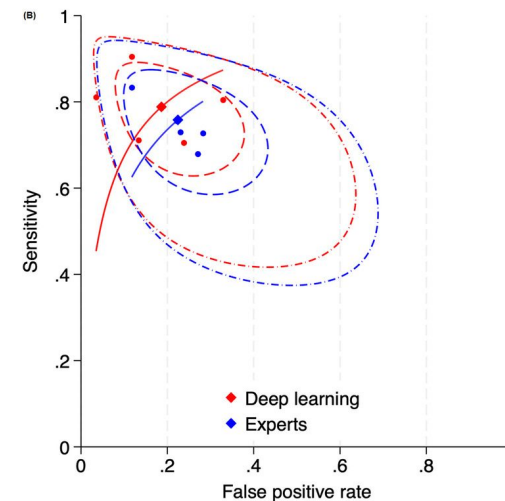
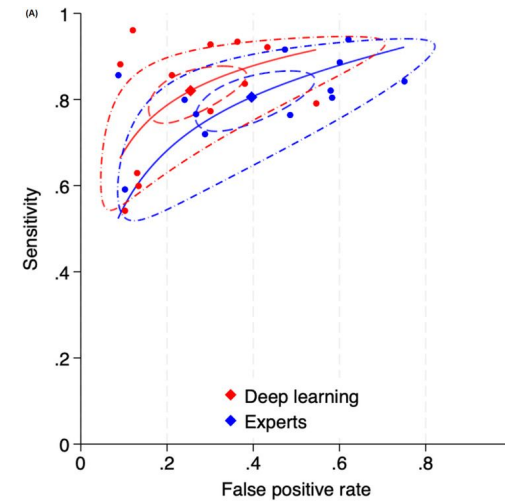
Established programmes worldwide (including Lombardia)



Lung cancer screening with low-dose CT (<1mSV)

AI outperforms radiologists

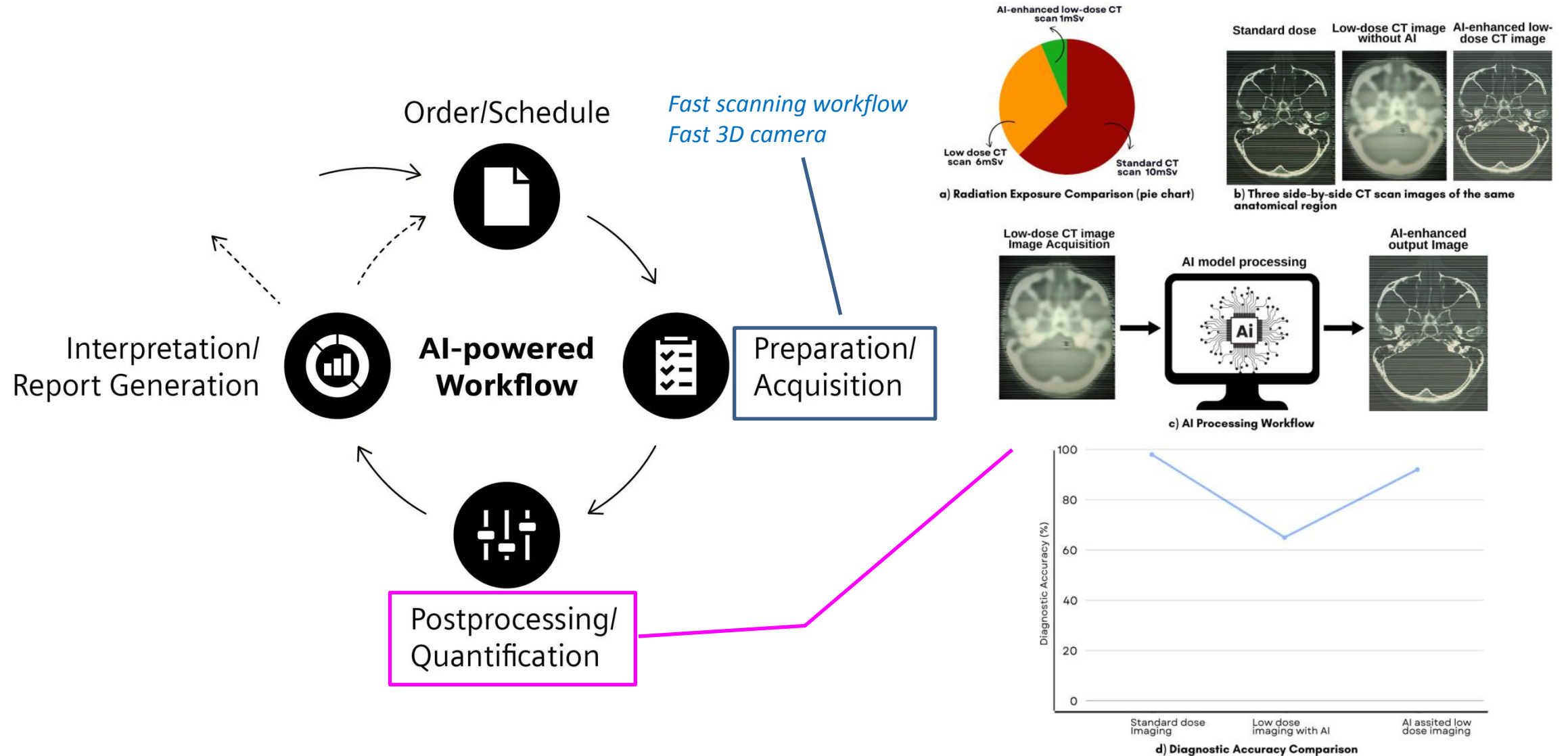
- Review on 20 studies¹
 - DL algorithms exhibited superior SE (82%) and SP (75%) compared to human experts (SE 81%, SP 69%)
 - Difference in SP was statistically significant
- Multicentre prospective study (3678 CT scans)²
 - Radiologists, as first reader, would have led to 11.8 % missed referrals, higher than the 2.9 % of AI
 - AI significantly less negative missclassifications



1. Wang TW, et al. Eur Radiol 2024 Nov;34(11):7397-7407
2. Walstra AN, et al. Eur J Cancer 2025 Feb 5;216:115214

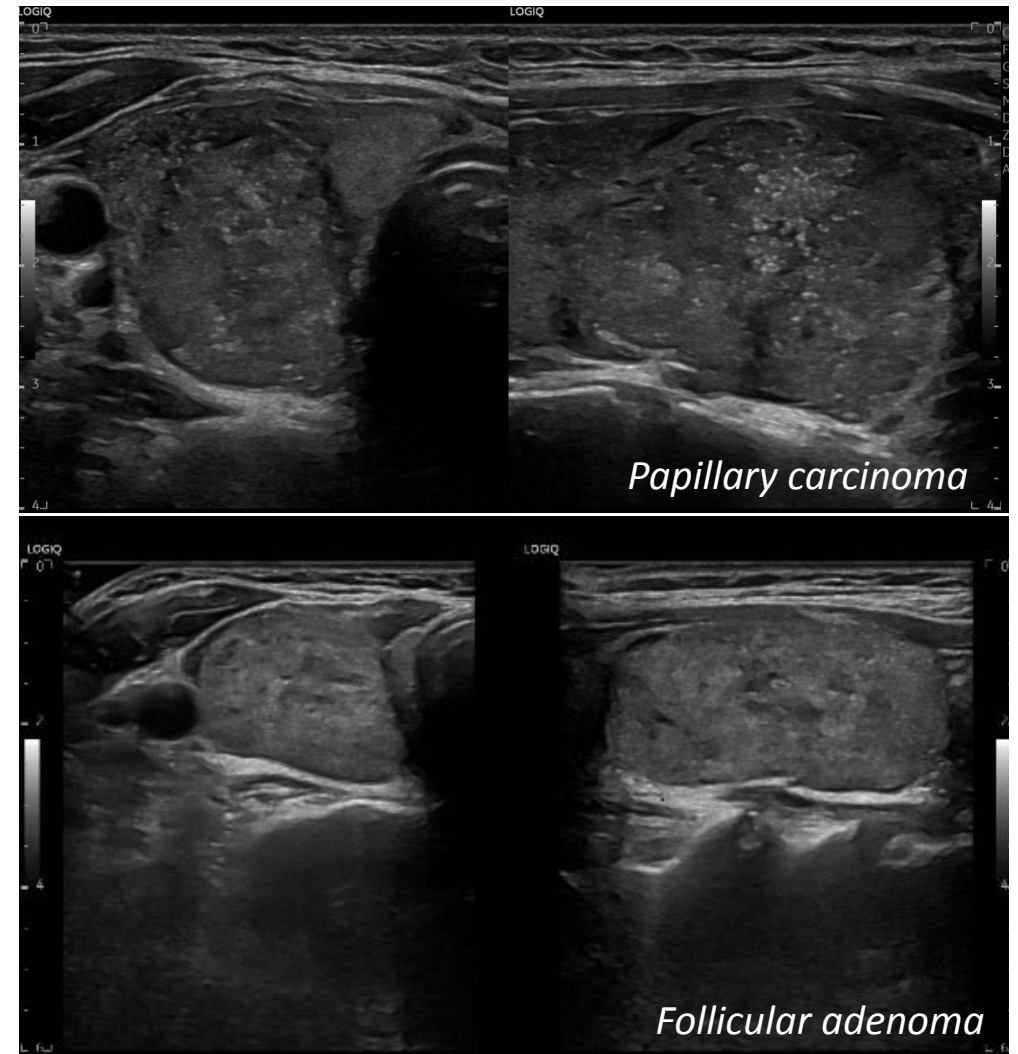
AI Minimizes Radiation at Every Step of the Imaging Workflow

More efficient workflow enables safer CT Imaging



Thyroid cancer diagnosis with US is challenging

Complex assessments (TI-RADS 1-5), time consuming, variability, too many biopsies



Thyroid Assistant, powered by Koios DS™

Analysis return examples



Benign



Not suspicious



Mildly suspicious



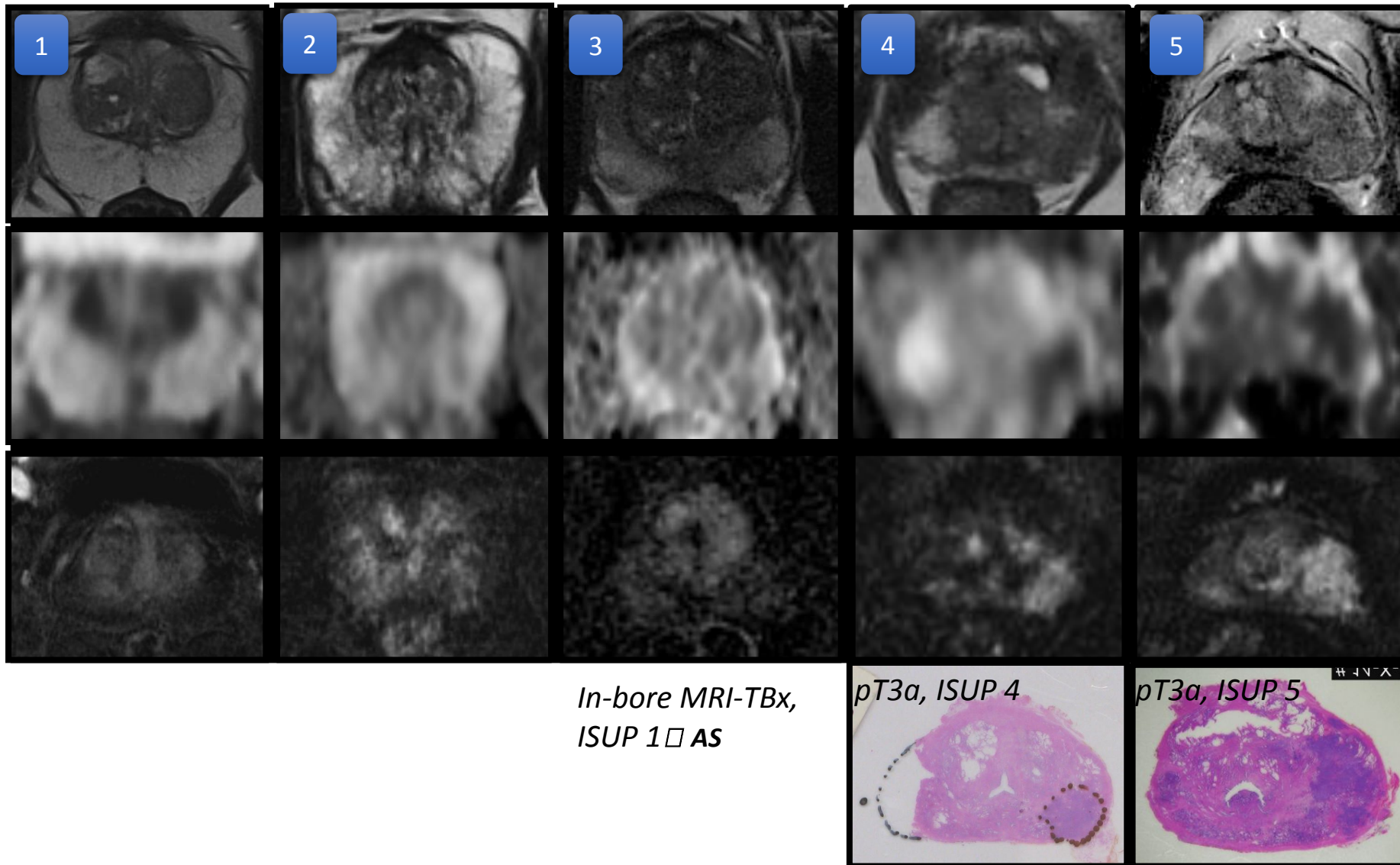
Moderately suspicious



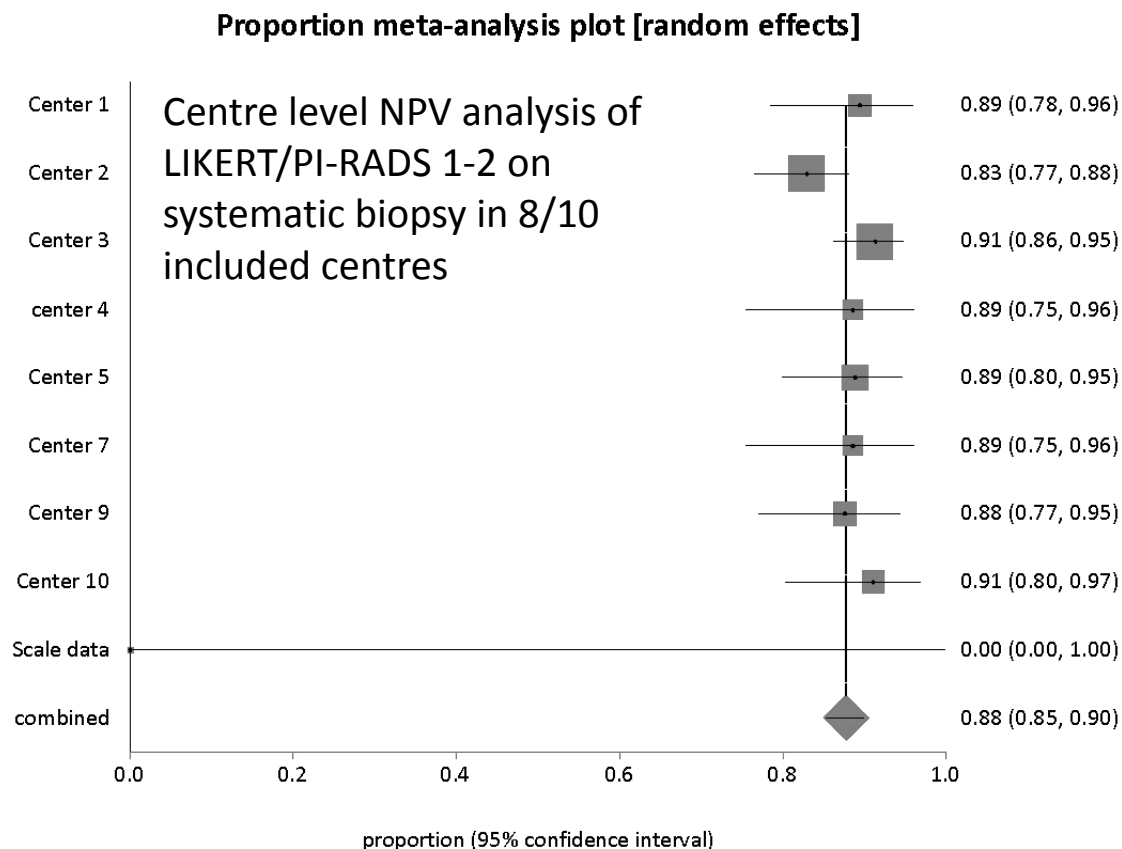
Highly suspicious

Multiparametric MRI of the prostate

Complex assessments (PI-RADS 1-5), time consuming, variability, too many biopsies

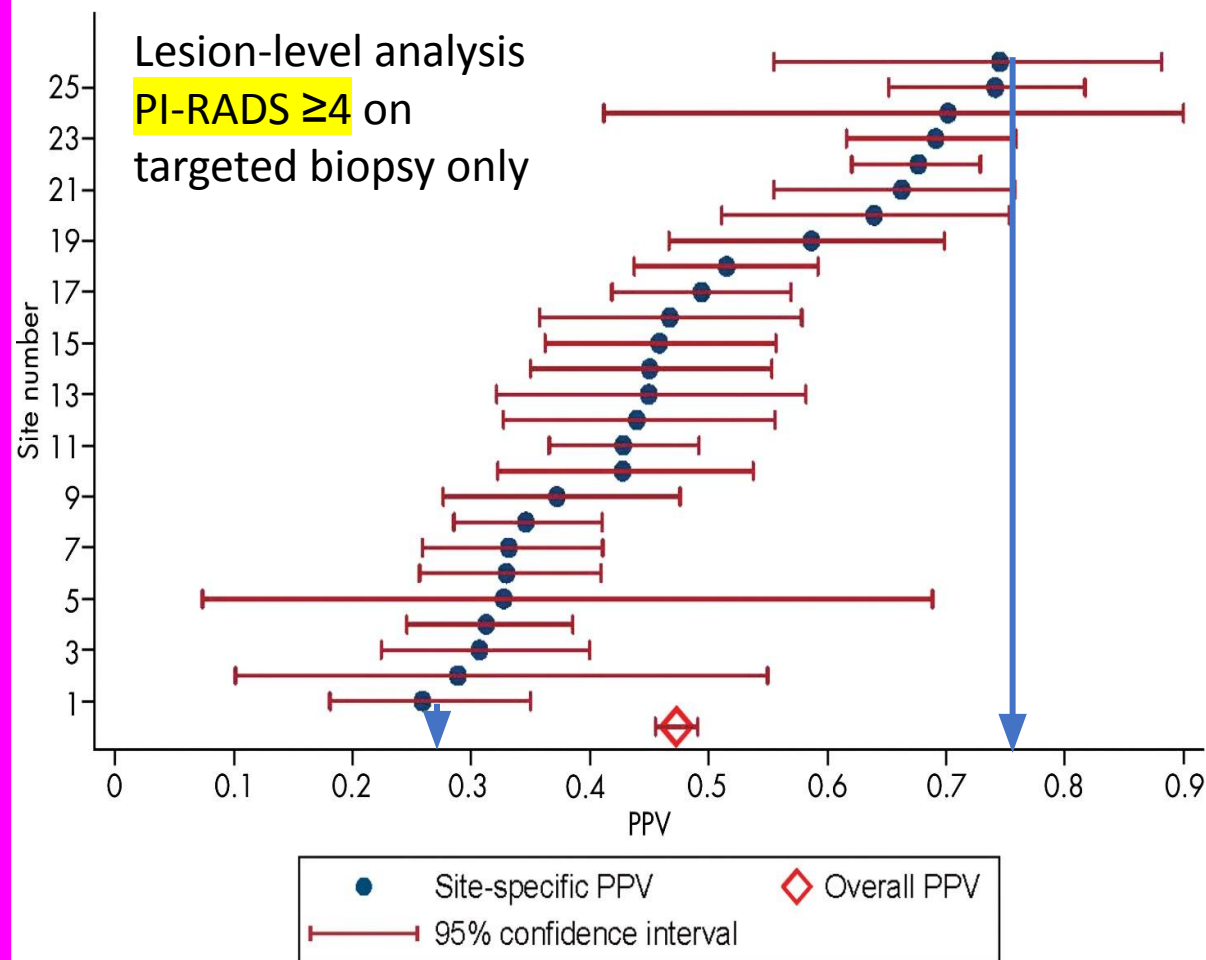


High sensitivity (low FNR) and NPV with low variability → consistent biopsy avoidance



Stonier T, et al. The “Is mpMRI Enough” or IMRIE Study: A Multicentre Evaluation of Prebiopsy Multiparametric MRI Compared with Biopsy. Eur Urol Focus 2020; S2405-4569(20)30271-6.

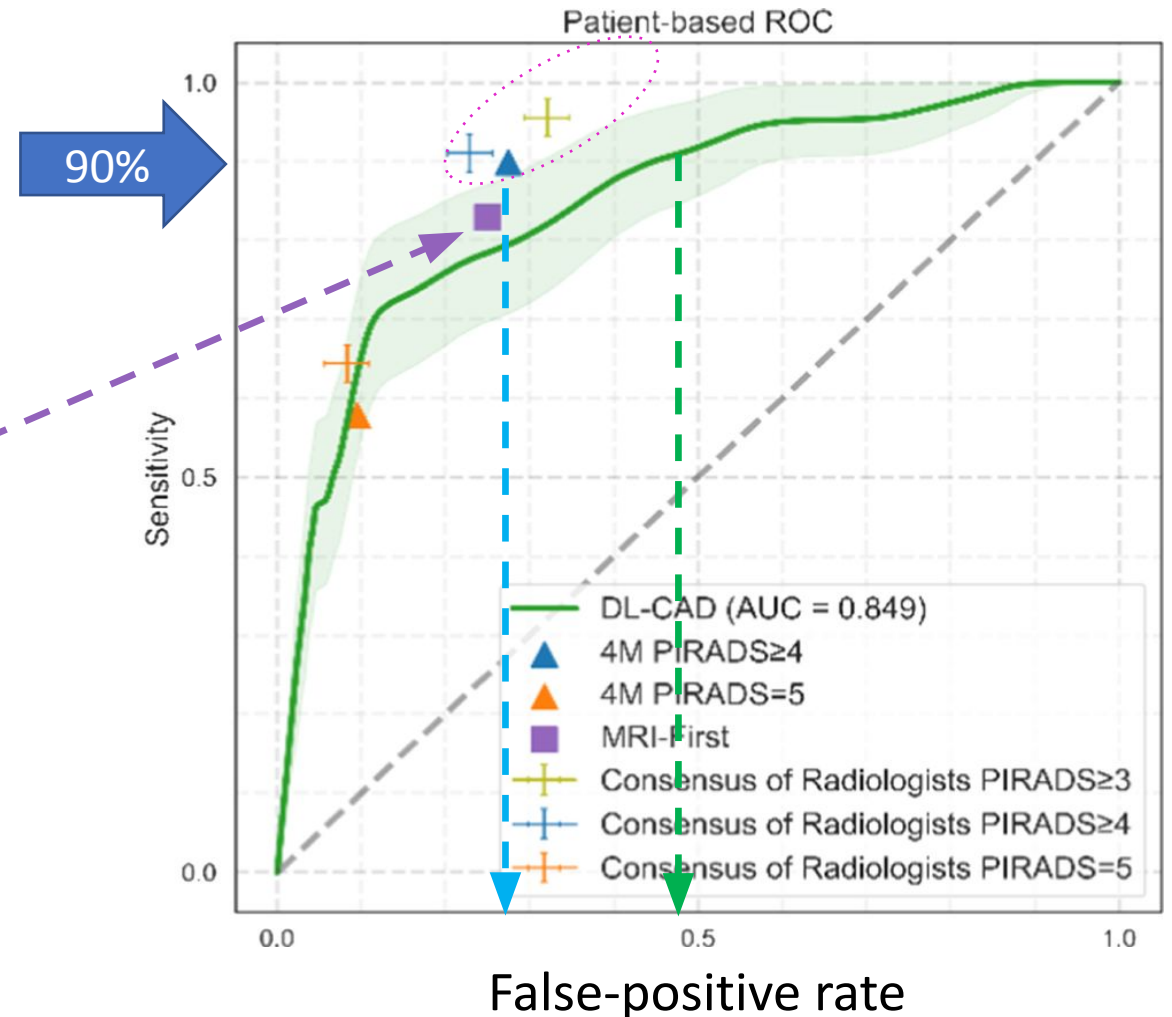
Intermediate specificity (FPR) and PPV with high variability → inconsistent biopsy yields



Focus on excluding patients unlikely to have csPCa

Highest SE/NPV possible

- Cohort (2438 cases vs Radiologist)
 - 1586 training
 - 852 validation
- External validation
 - 296 mpMRI exams followed by biopsy*
- Matches **general radiologists**²
- Below the **expert level**³
 - DL-CAD shows higher FPR
- Moderate agreement with radiologist
 - $k=0.53$ ☐ comparable to the inter-reader agreement



1. Hosseinzadeh M, et al. Eur Radiol. 2022 Apr;32(4):2224-2234.
2. Rouvière O, et al. Lancet Oncol. 2019 Jan;20(1):100-109.
3. van der Leest M, et al., Eur Urol. 2018 Nov 23.

* All patients had systematic Bx, PI-RADS 3-5 in-bore MR-TBx

100 cases with GG $\geq$ 2 prevalence of 56% reviewed by 7 radiologists

High accuracy for PI-RADS 4-5 patient-level detection (93%); average false detection/case 0.7

Improves consistency between readers

Reduces reading times

Performance metric	Radiologist	Radiologist with AI	P-value
AUC for PI-RADS $\geq$ 4 lesion detection	0.84	0.88	+4%; P=0.01
Inter-reader concordance (kappa)	0.22	0.36	P=0.003
Median reading time	103 seconds	81 seconds	-21%; P<0.001

A Novel Deep Learning Based Computer-Aided Diagnosis System Improves the Accuracy and Efficiency of Radiologists in Reading Biparametric Magnetic Resonance Images of the Prostate

Results of a Multireader, Multicase Study

Winkel, David J. MD¹; Tong, Angela MD²; Lee, Bin PhD³; Kamen, AJ PhD⁴; Comaniciu, David PhD⁵; Dinkelhorst, Jonathan A. PhD⁶; Rodriguez-Ruiz, Alejandro PhD⁷; Huisman, Hendrik PhD⁸; Szeles, Dieter MD⁹; Shalunin, Ivan MD¹⁰; Choi, Ross Hyung MD¹¹; Xing, Pengyi MD¹²; Penabazken, Tobias MD^{13,14}; Orban, Robert PhD¹⁵; von Busch, Heinrich PhD¹⁶; Wolf, Burkert T. MD¹⁷

Author information @

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doi: 10.1017/IR.0000000000000780

ISSN

Metrics

WB-MRI can detect the most common cancers

Top-ten 2024¹

- The most common (Screened already)

1. Prostate / Breast
2. Lung
3. Colon & rectum
4. Uterine corpus

- Other top-ten cancers (Not screened)

- Urinary bladder
- Kidney
- NHL
- Pancreas, Liver, etc.

	Male				Female		
		Estimated New Cases				Estimated New Cases	
	Prostate	299,010	29%		Breast	310,720	32%
	Lung & bronchus	116,310	11%		Lung & bronchus	118,270	12%
	Colon & rectum	81,540	8%		Colon & rectum	71,270	7%
	Urinary bladder	63,070	6%		Uterine corpus	67,880	7%
	Melanoma of the skin	59,170	6%		Melanoma of the skin	41,470	4%
	Kidney & renal pelvis	52,380	5%		Non-Hodgkin lymphoma	36,030	4%
	Non-Hodgkin lymphoma	44,590	4%		Pancreas	31,910	3%
	Oral cavity & pharynx	41,510	4%		Thyroid	31,520	3%
	Leukemia	36,450	4%		Kidney & renal pelvis	29,230	3%
	Pancreas	34,530	3%		Leukemia	26,320	3%
	All sites	1,029,080			All sites	972,060	

	Male				Female		
		Estimated Deaths				Estimated Deaths	
	Lung & bronchus	65,790	20%		Lung & bronchus	59,280	21%
	Prostate	35,250	11%		Breast	42,250	15%
	Colon & rectum	28,700	9%		Pancreas	24,480	8%
	Pancreas	27,270	8%		Colon & rectum	24,310	8%
	Liver & intrahepatic bile duct	19,120	6%		Uterine corpus	13,250	5%
	Leukemia	13,640	4%		Ovary	12,740	4%
	Esophagus	12,880	4%		Liver & intrahepatic bile duct	10,720	4%
	Urinary bladder	12,290	4%		Leukemia	10,030	3%
	Non-Hodgkin lymphoma	11,780	4%		Non-Hodgkin lymphoma	8,360	3%
	Brain & other nervous system	10,690	3%		Brain & other nervous system	8,070	3%
	All sites	322,800			All sites	288,920	

Estimates are rounded to the nearest 10, and cases exclude basal cell and squamous cell skin cancers and in situ carcinoma except urinary bladder. Estimates do not include Puerto Rico or other US territories. Ranking is based on modeled projections and may differ from the most recent observed data.

©2024, American Cancer Society, Inc., Surveillance and Health Equity Science

1. CA A Cancer J Clinicians, Volume: 74, Issue: 1, Pages: 12-49, First published: 17 January 2024, DOI: (10.3322/caac.21820)

WB-MRI in high-risk individuals (cancer predisposition syndromes)

Recommended by International guidelines ☐ *Measurable benefit*

Syndromes	Age
Li-Fraumeni syndrome (LFS) ¹⁻⁸	Any (Annual)
Hereditary Paraganglioma-Pheocromocytoma syndromes (HPP) ⁹⁻¹⁰	From 6-8yy (Every 2 years)
Constitutional mismatch repair deficiency syndrome (CMMRD) ¹¹⁻¹⁴	From 6-8yy (Annual)
Hereditary retinoblastoma ¹⁵	From 8yy (Annual)

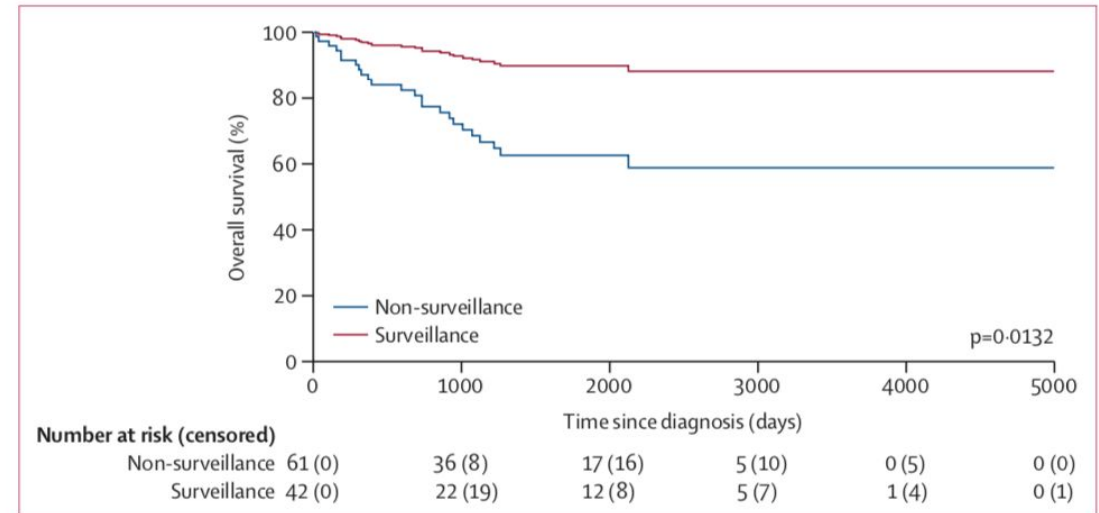


Figure 1: Overall survival in the surveillance and non-surveillance groups

Number at risk refers to the number of tumours, not individuals.

- | | | | |
|------------------------|-------------------------------------|----------------------------|----------------------|
| 1. TORONTO protocol | 5. GENTURIS guidelines | 9. Rednam SP et al | 13. C4CMMRD |
| 2. ESMO guidelines | 6. UKCGG Consensus Group guidelines | 10. Garcia-Carbonero et al | 14. IRRD consortium |
| 3. ESO-ESMO guidelines | 7. Kumamoto et al. | 11. AACR | 15. Greer MC, et al. |
| 4. NCCN guidelines | 8. Australian Recommendations | 12. US task force | |

WB-MRI in low-risk individuals (general population)

Benefit not yet measured, but increasingly used

- Challenges
 - Abnormal findings □ Up to 99%
 - How to *minimise harm*?
 - Trust a negative WB-MRI
 - Do not over-investigate
 - High NPV & low prevalence of cancer
 - Cancer □ About 1-2%
 - How to *maximise potential*?
 - Oncological expertise in multi-organ evaluations

	Subjects	Cancer	Abnormal findings
Bamberg F et al. (2015)	30,000	Ongoing	Ongoing
Hegenscheid K et al. (2013)	2,500	5,9%*	/
Hu YS et al. (2024)	2064	1.2 %	99%
Baumgart D et al. (2007)	1007	0.44 %	/
Cieszanowski A et al. (2014)	666	1.05 %	99%
Basar Y et al. (2021)	576	2.6 %	/
Goede SC et al. (2005)	298	0.33 %	/
Lee SY et al. (2018)	229	0.8%	93%
Lo GG et al. (2008)	132	1.5 %	94%
Ulus S et al. (2016)	118	1.7 %	72%
Tarnoki DL et al. (2014)	22	4.5 %	91%

* No histological confirmation

Oncologically Relevant Findings Reporting and Data System (ONCO-RADS): Guidelines for the Acquisition, Interpretation, and Reporting of Whole-Body MRI for Cancer Screening

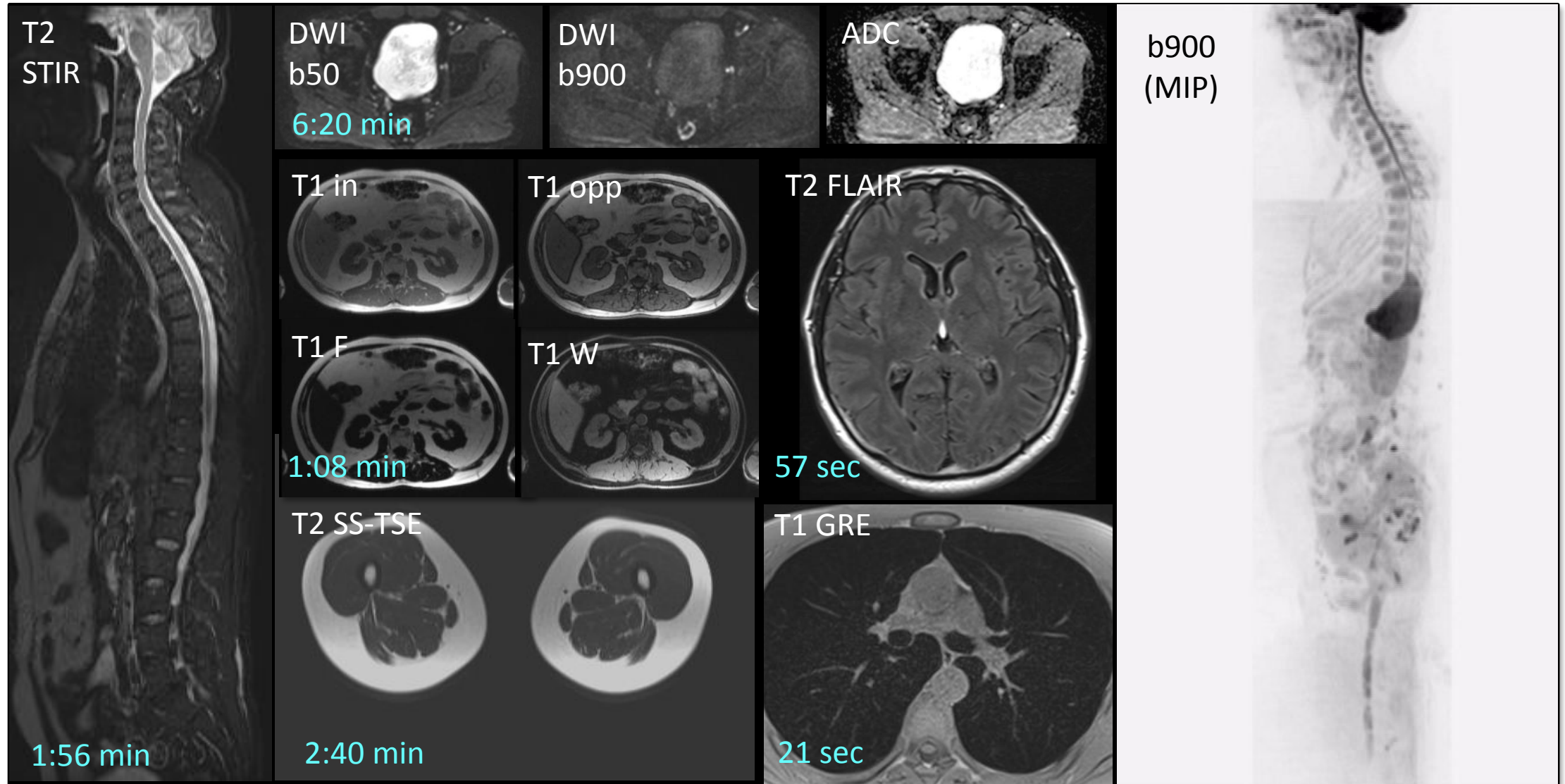
Giuseppe Petralia, MD • Dow-Mu Koh, MD • Raj Attariwala, MD, PhD • Joseph J. Busch, MD • Ros Eeles, MD • David Karow, MD, PhD • Gladys G. Lo, MD • Christina Messiou, MD • Elvis Sala, MD, PhD • Hebert A. Vargas, MD • Fabio Zugni, MD • Anwar R. Padhani, MD

From the Precision Imaging and Research Unit, Department of Medical Imaging and Radiation Sciences (G.P.), and Department of Radiology (E.Z.), IEO European Institute of Oncology IRCCS, Via Giuseppe Ripamonti 435, 20141 Milan, Italy; Department of Oncology and Hemato-Oncology, University of Milan, Italy (G.P.); Department of Radiology, Royal Marsden Hospital and Institute of Cancer Research, Sutton, England (D.M.K., C.M.); AIM Medical Imaging, Vancouver, Canada (R.A.); Busch Center, Alpharetta, Ga (J.J.B.); The Institute of Cancer Research and Royal Marsden NHS Foundation Trust, London, England (R.E.); Human Longevity, San Diego, Calif (D.K.); Department of Diagnostic & Interventional Radiology, Hong Kong Sanatorium & Hospital, Hong Kong (G.G.L.); Department of Radiology and Cancer Research, UK Cambridge Center, Cambridge, England (E.S.); Department of Radiology, Memorial Sloan-Kettering Cancer Center, New York, NY (H.A.V.); and Paul Strickland Scanner Centre, Northwood, England (A.R.P.). Received April 24, 2020; revision requested June 16; revision received November 5; accepted November 17. Address correspondence to G.P. (e-mail: giuseppe.petralia@ieo.it).

Conflicts of interest are listed at the end of this article.

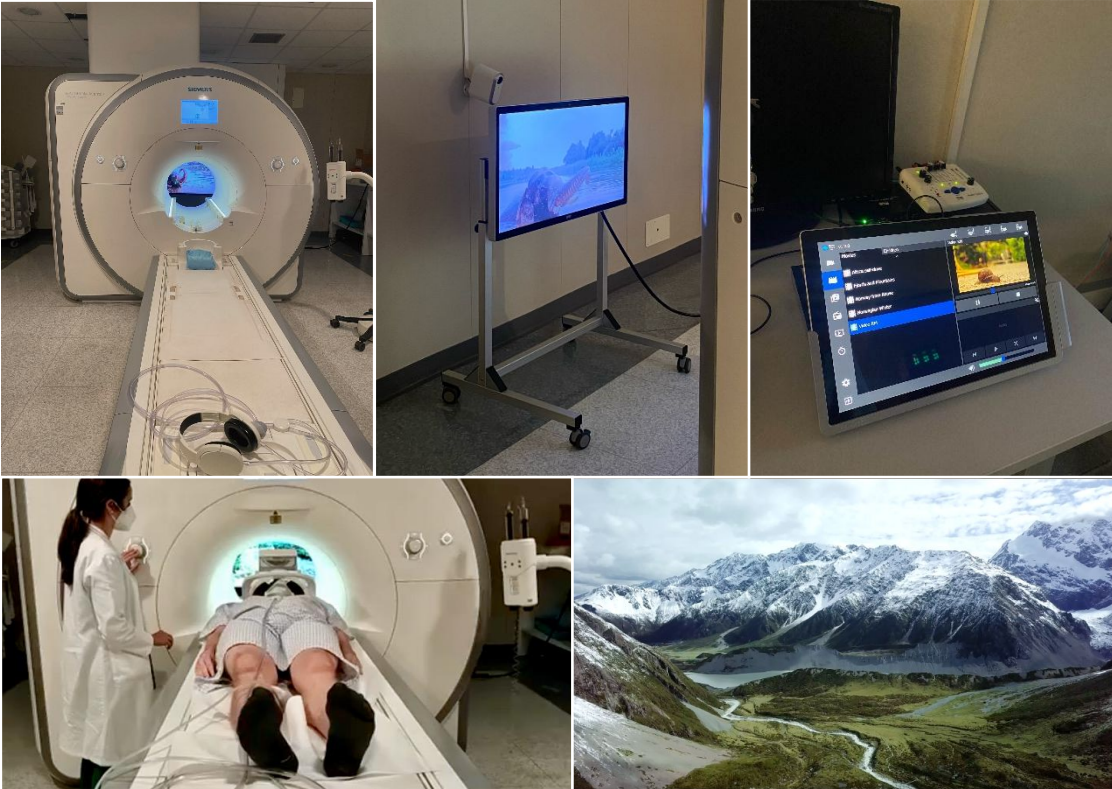
1. Acquisition

WB-MRI protocol @ 1.5 & 3T (35-40mins) (*TA = 13:22 sec @1.5T with AI*)



How to make acquisition easier?

Communication / Music / TV



62 individuals	Acceptability	Comfort	Satisfaction
AV Vs Standard	$t(105)=3.8$ $p<0.05$	$t(105)=2.35$ $p<0.05$	$t(105)=4.1$ $p<0.01$
AV vs Music	$t(105)=0.69$ $p=0.82$	$t(105)=1.37$ $p=0.39$	$t(105)=2.2$ $p<0.05$
Music Vs Standard	$t(88)=2.72$ $p<0.05$	$t(88)=0.95$ $p=0.26$	$t(88)=1.79$ $p=0.33$

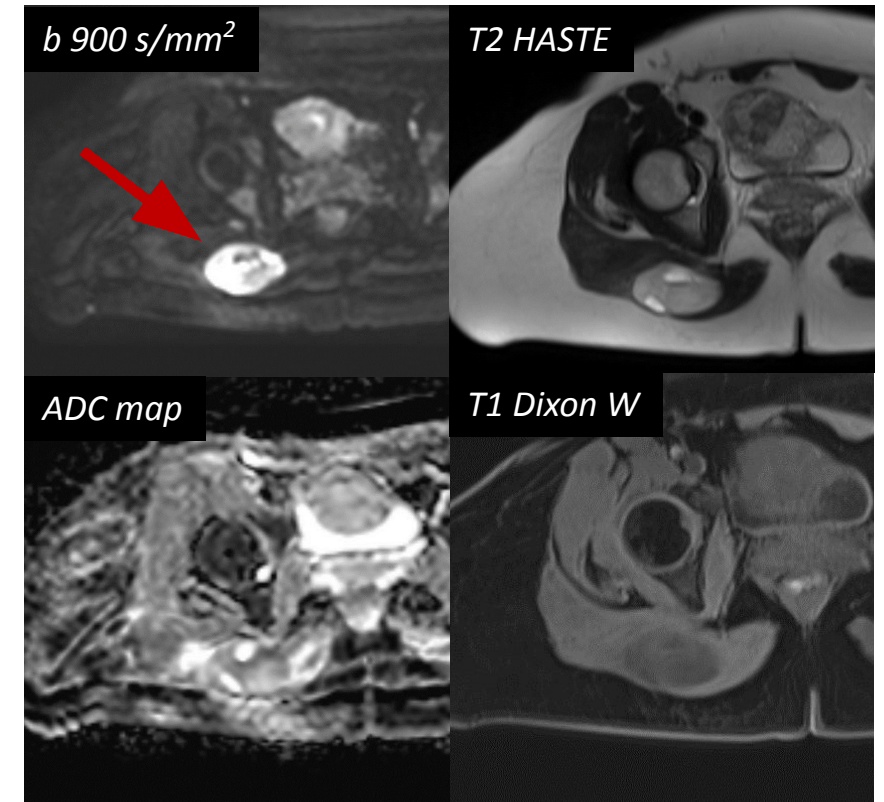
2. Interpretation

Abnormal findings assigned to one of the 7 body regions (bone, head, neck, chest, abdomen, **pelvis**, limbs)

- ONCO-RADS category (1 to 5)

- ONCO-RADS 1: normal
- ONCO-RADS 2: benign finding highly likely
- ONCO-RADS 3: benign finding likely
- ONCO-RADS 4: malignant finding likely
- ONCO-RADS 5: malignant finding highly likely

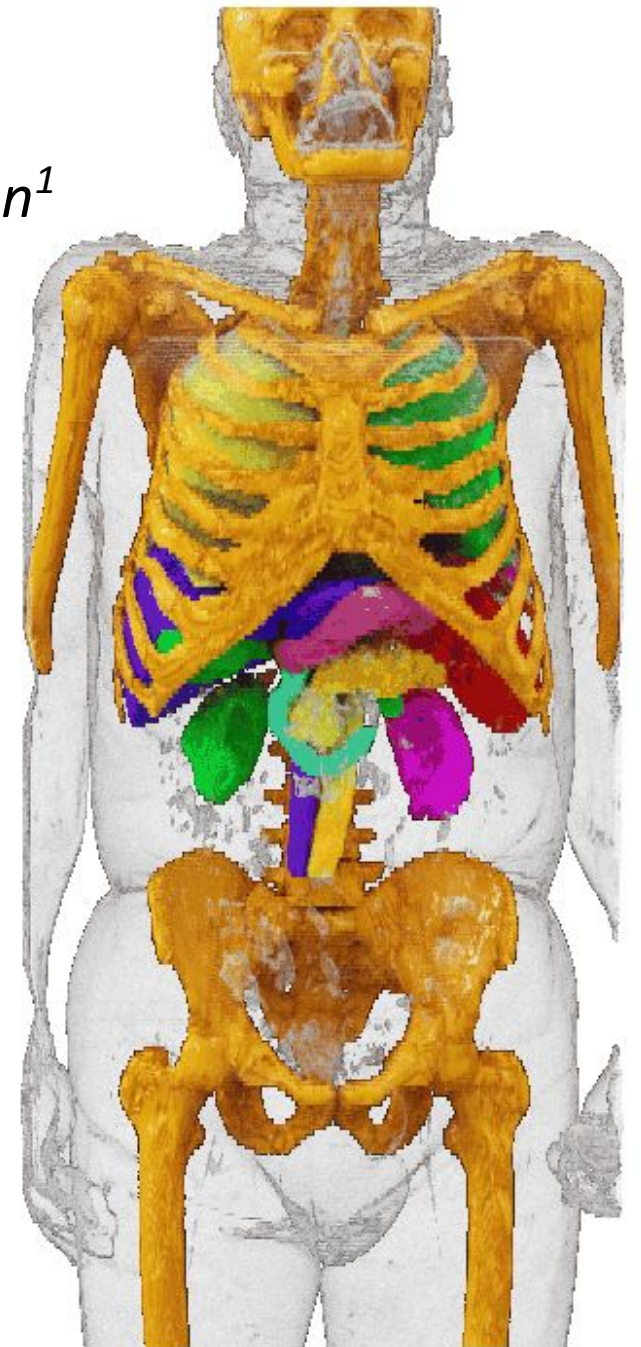
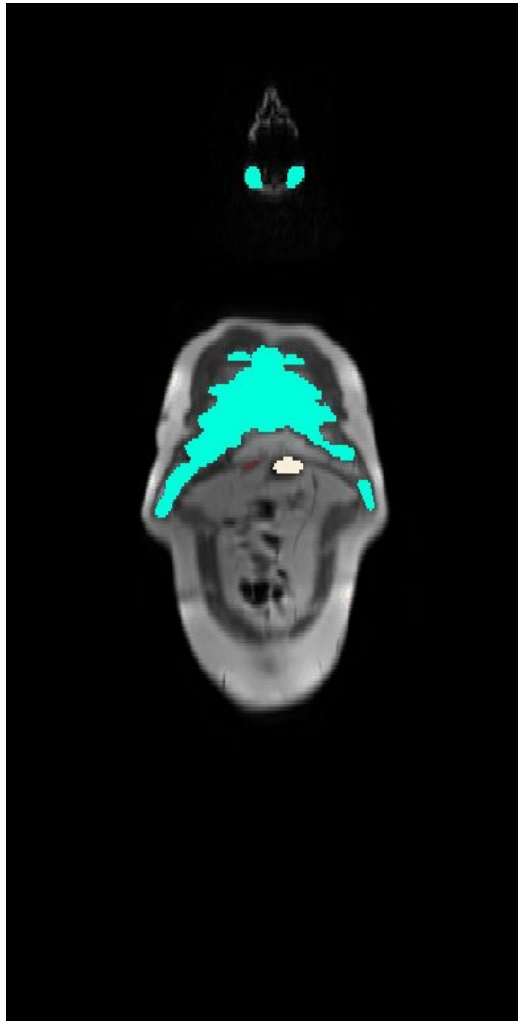
- 29yo, F (LFS)
 - 2013 ☐ Breast cancer
 - 2017 ☐ Right inguinal dermatofibrosarcoma protuberans
 - 2018 ☐ Recurrence (Surgery + RT)
 - 2020 ☐ WB-MRI for cancer screening



ONCO-RADS 5 ☐ Surgery / Biopsy

How to make interpretation easier?

AI assisted ONCO-RADS assessments ☐ *Bone & organ segmentation*¹

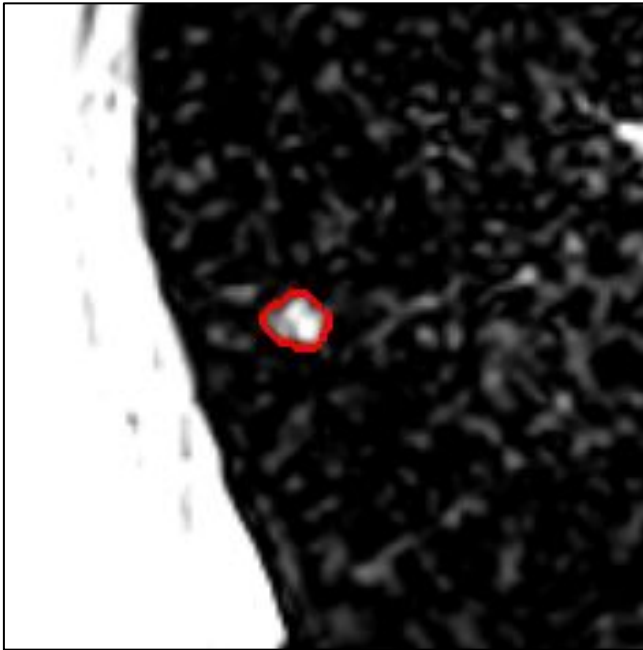


1. Cornelius Jacob, IEO & Siemens Healthineers

How to make interpretation easier?

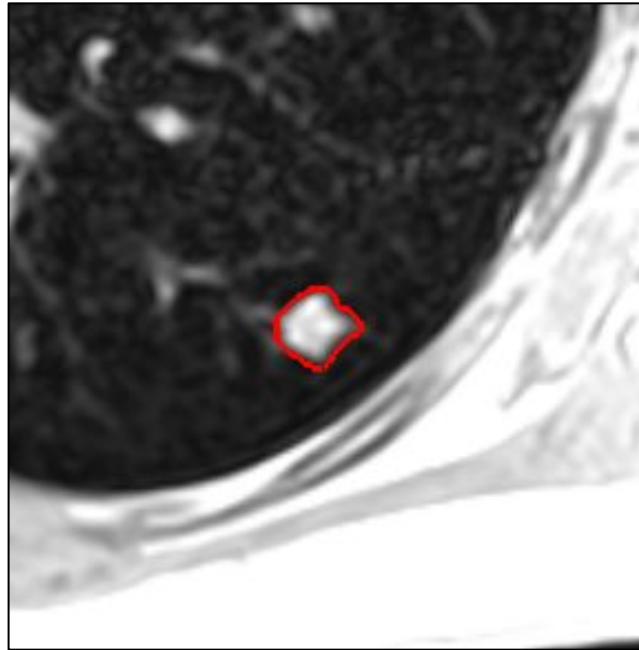
AI assisted ONCO-RADS assessments ☐ *Deep learning model for lung nodule detection*¹

Lung Nodule of **4 mm**



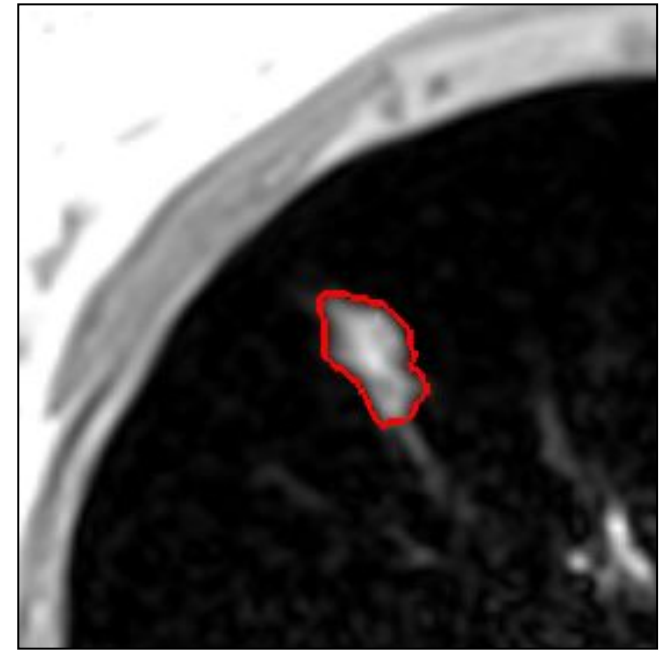
☐ **ONCO-RADS 2**
(< 6 mm)

Lung Nodule of **7 mm**



☐ **ONCO-RADS 3**
(≥ 6 mm and < 8 mm)

Lung Nodule of **14 mm**



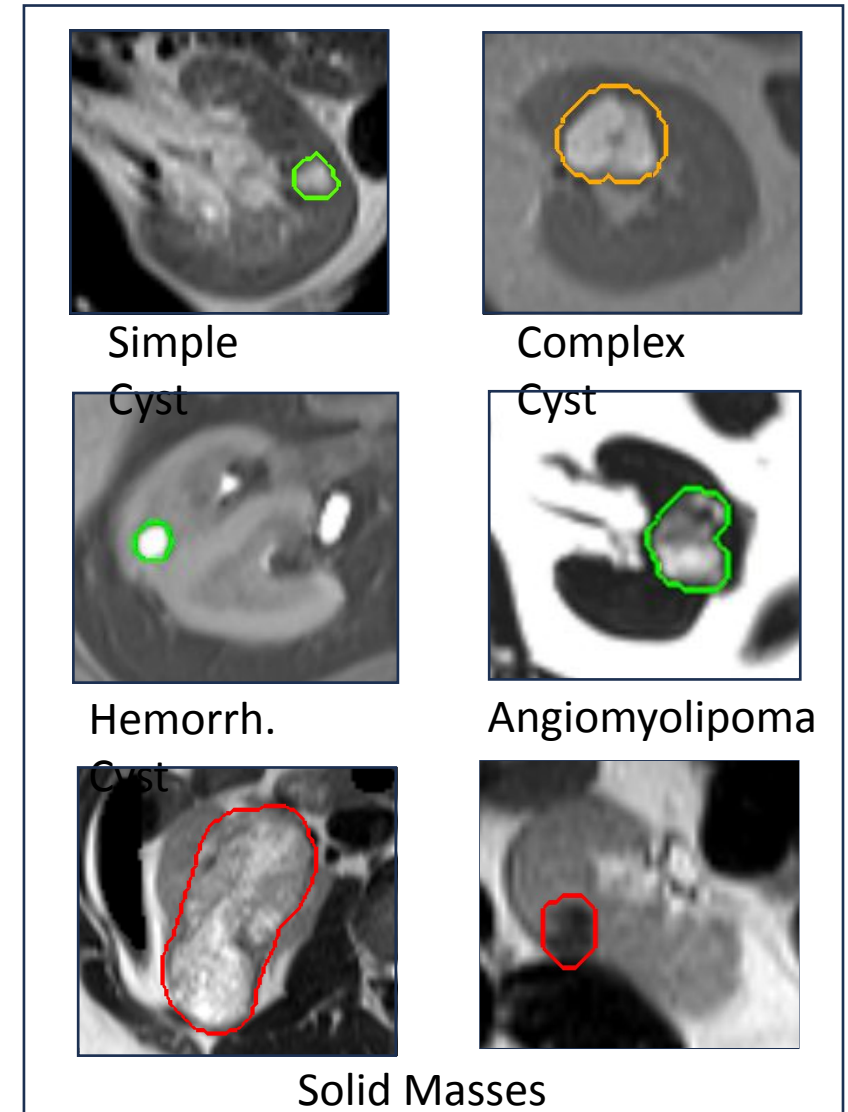
☐ **ONCO-RADS 4**
(≥ 8 mm)

1. ECR 2025, Cornelius Jacob, IEO & Siemens Healthineers

How to make interpretation easier?

AI assisted ONCO-RADS assessments □ *Deep learning model for kidney lesion detection*¹

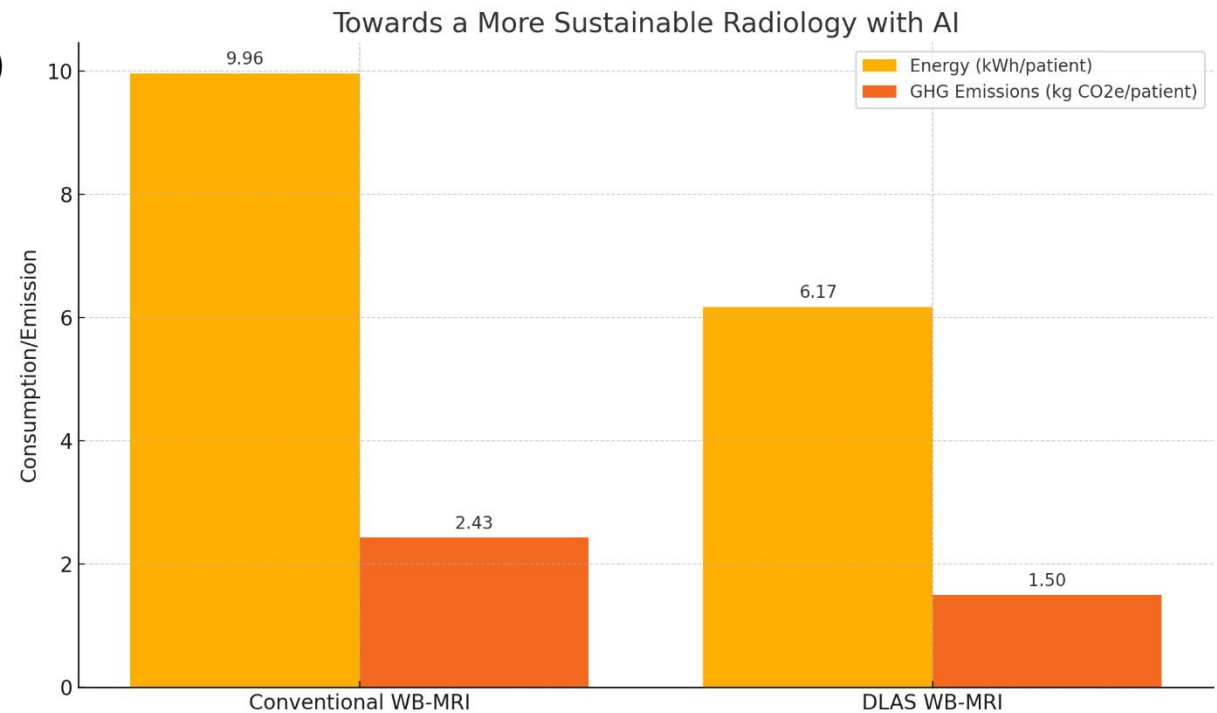
- Simple Cysts (ONCO-RADS 2)
- Complex Cysts (ONCO-RADS 3)
- Hemorrhagic Cysts (ONCO-RADS 2)
- Angiomyolipoma (ONCO-RADS 2)
- Solid Masses (ONCO-RADS 4-5)



Towards a more sustainable radiology with AI

WB-MRI examinations performed with deep learning–accelerated sequences (DLAS)

- WB-MRI DLAS vs WB-MRI conv
 - 38% reduction in both energy consumption and greenhouse gas emissions
 - GHG emissions: 1.50 vs 2.43 kgCO₂e/patient (p < .05)
 - Energy: 6.17 vs 9.96 kWh/patient (p < .05)



Cancer staging

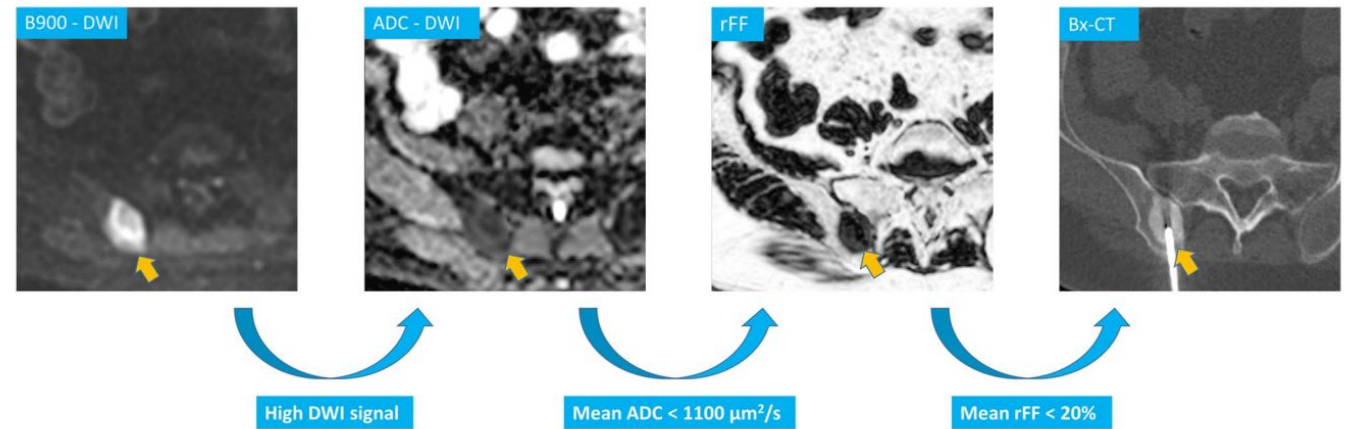
Mostly osteotropic cancers (prostate / breast / multiple myeloma)

Other cancers (lung, colon, ovarian)

Multiparametric analysis of the bone ☐ Improves both SE & SP

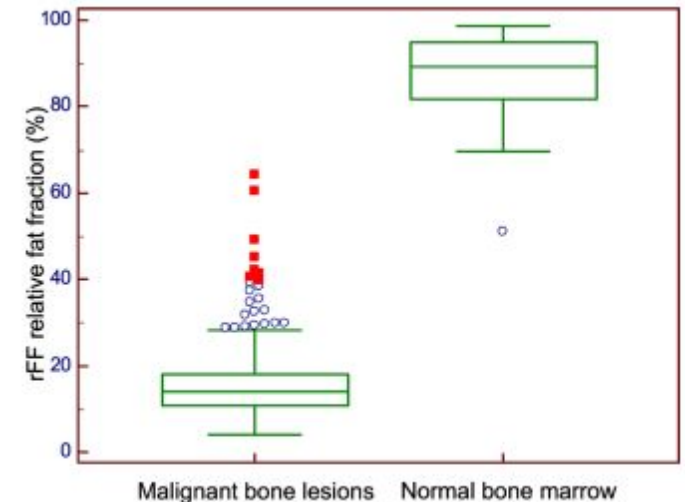
Active bone disease ☐ Hyper-DWI and ADC <1000 $\mu\text{m}^2/\text{s}$ /and rF% < 20%

- PPV = 93%¹
 - No overlap in values (rF%)²
- Excellent interobserver agreement (0.95)²



WB-MRI	ICC between observers (95% confidence interval)
Cervicothoracic spine	0.98 (0.96–0.98)
Lumbosacral spine	0.95 (0.92–0.97)
Pelvis	0.95 (0.92–0.97)
Extremity	0.93 (0.89–0.97)
Whole skeleton	0.95 (0.94–0.96)

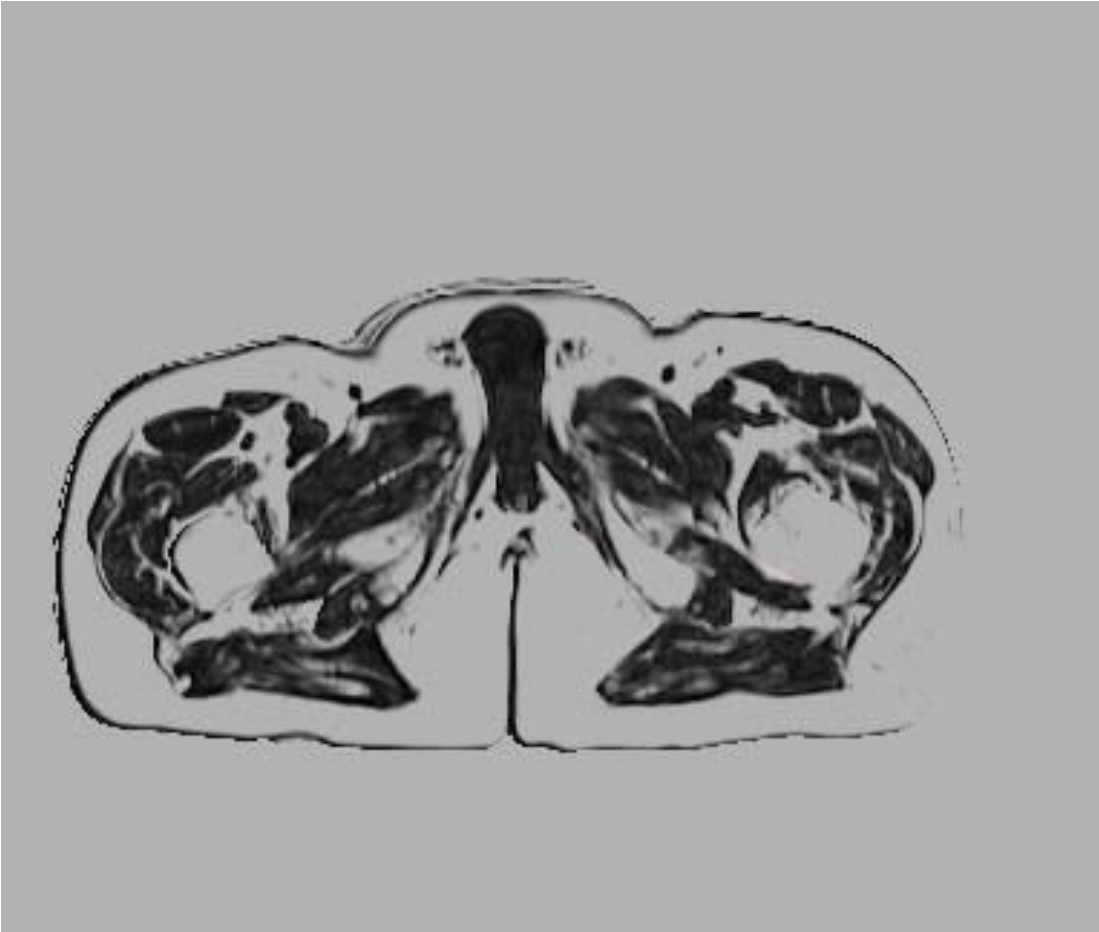
ICC, intraclass correlation coefficient; WB-MRI, whole-body MRI.



1. Donners R, et al. Eur radiol. 2022 Jul;32(7):4647-4656.
2. Castagnoli F, et al. BJR. 2023 Dec;96(1152):20230240.

Welcome to a new era with AI

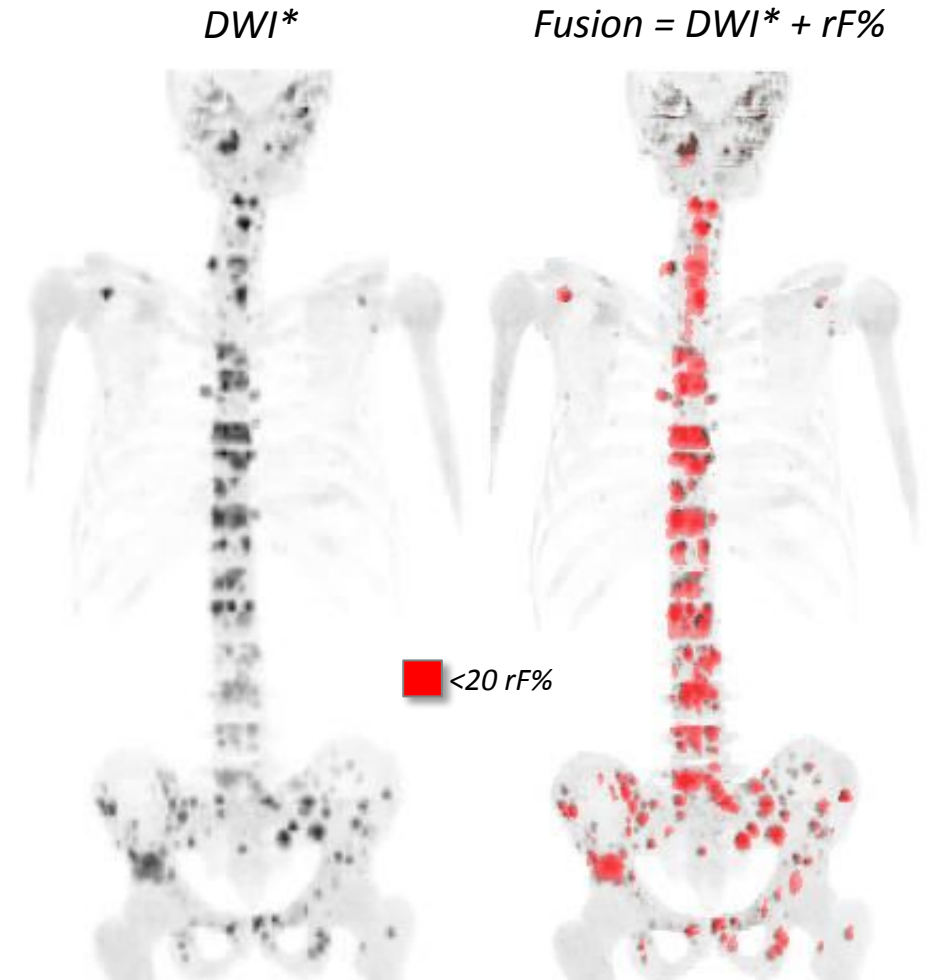
From multiple to *single image reading*



$Fusion = DWI^* + rF\%$

$*b = c1400 \text{ s/mm}^2$

Active metastastic volume = 104mL



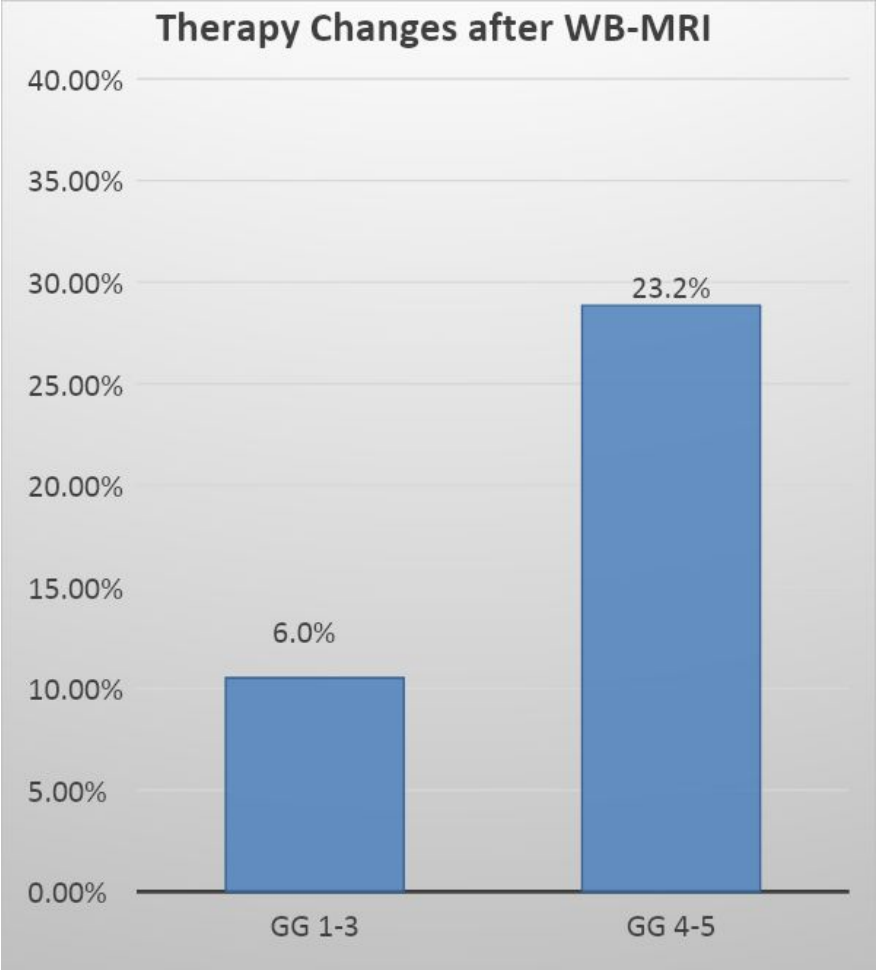
Cornelius Jacob, IEO & Siemens Healthineers

Prostate cancer ☐ «All-in-one» staging with WB-MRI¹

Multicentre (IEO, AOUV, SCB), prospective, interventional study

	TOTAL	Therapy UNCHANGED	Therapy CHANGED
Patients	152	131 (86.2%)	21 (13.8%)
CONCORDANT	109 (71.7%)	108 (71.0%)	1 (0.7%)
UPSTAGING	26 (17.1%)	13 (8.5%)	13 (8.5%)
DOWNSTAGING	17 (11.2%)	9 (5.9%)	8 (5.3%)

Data relative to IEO (Milan) and Spedali Civili (Brescia)



1. ClinicalTrials.gov Identifier: NCT06071195

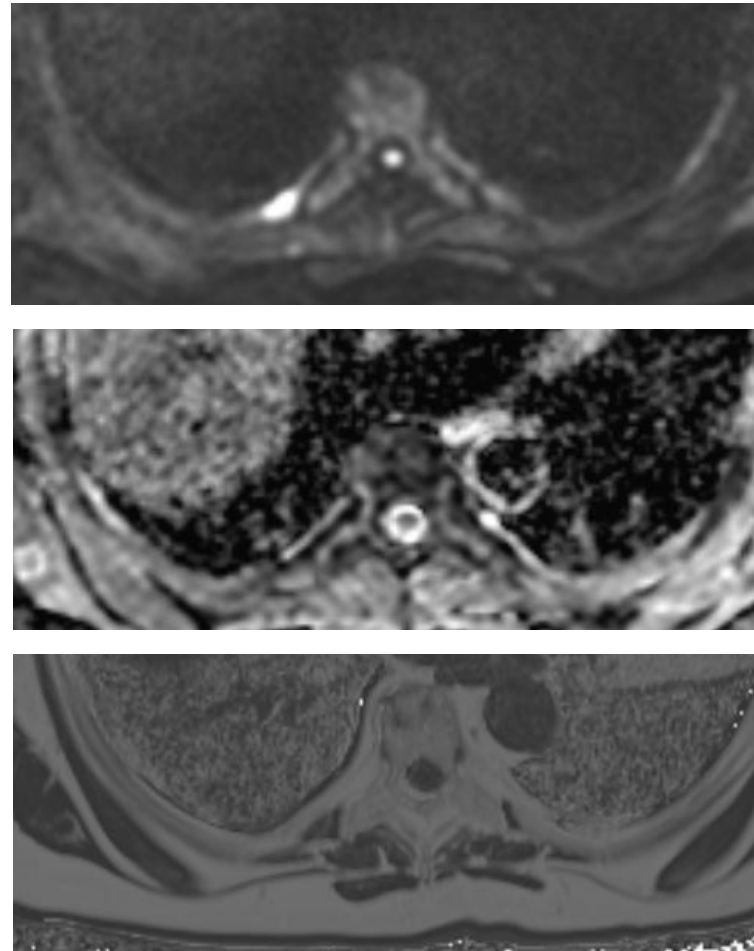
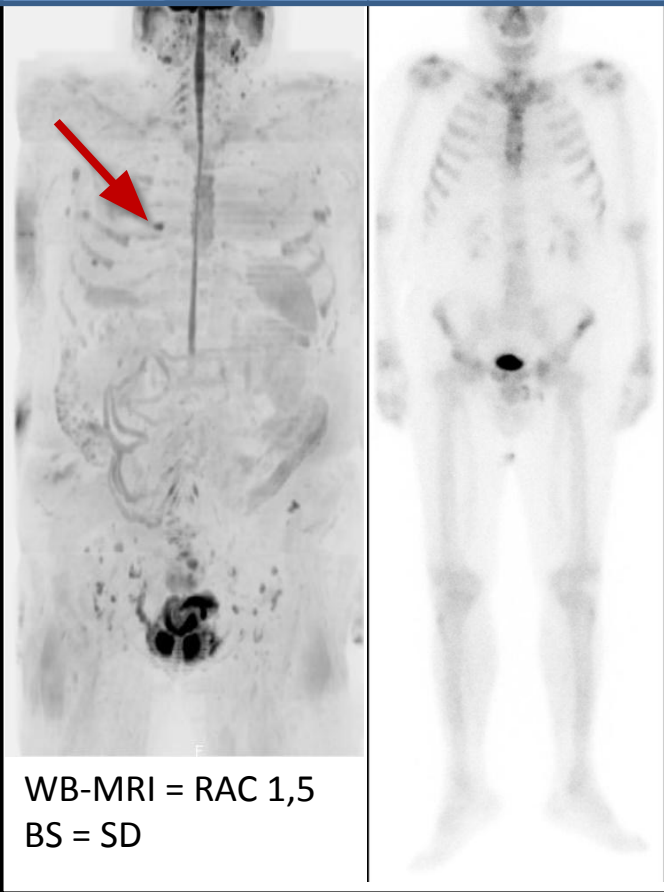
Cancer therapy monitoring

mCRPC □ Abiraterone

WB-MRI detects PD earlier than BS

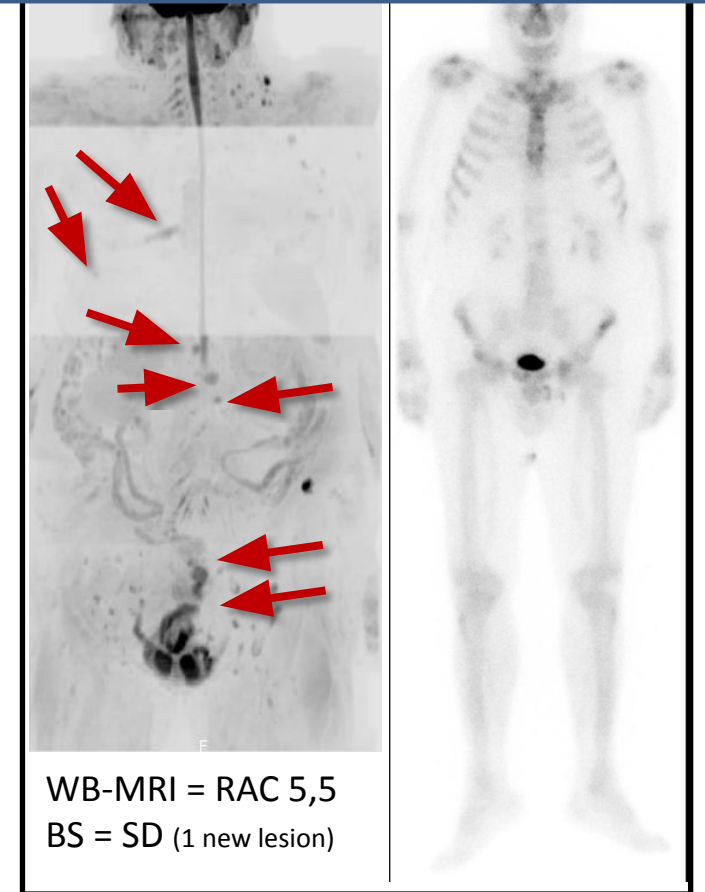
24 weeks – PSA = 0.56 ng/mL

Oligoprogressive

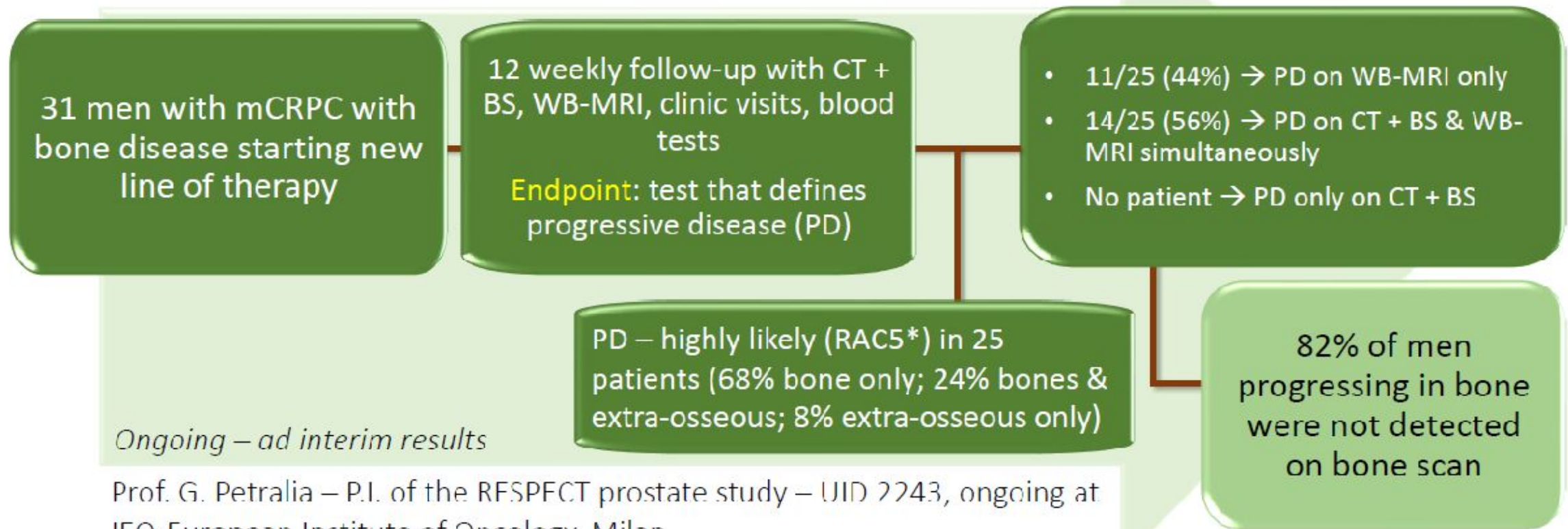


36 weeks – PSA = 2.42 ng/mL

Polymetastatic progression



RESPECT prostate study: prospective, non-inferiority study evaluating anticancer therapies in mCRPC with bone disease with WB-MRI versus BS/CT scans



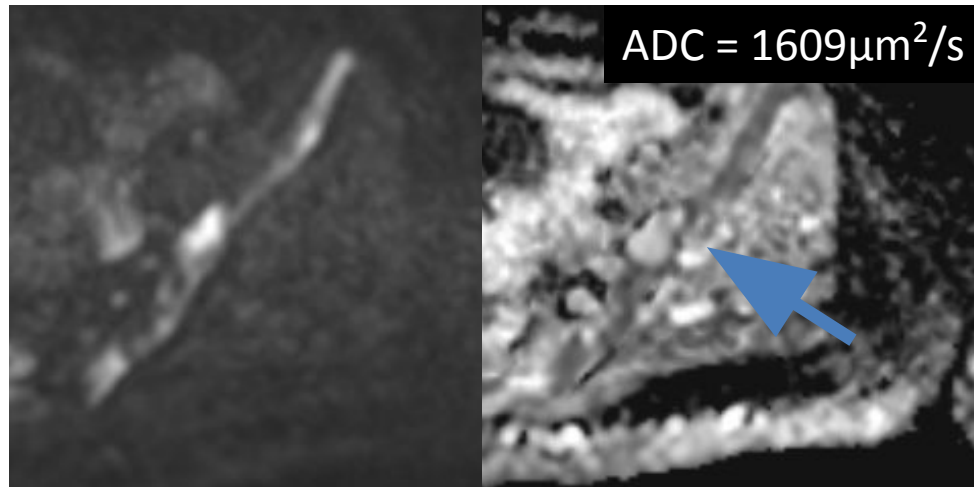
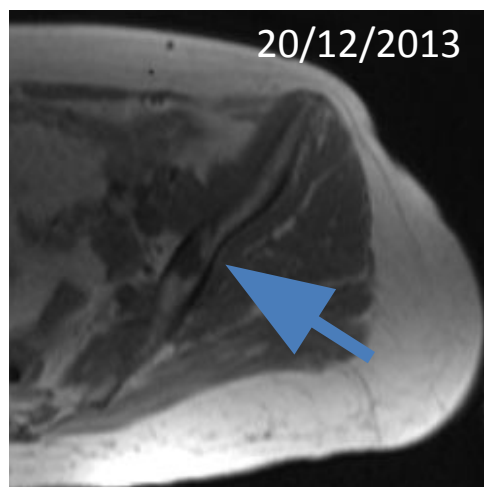
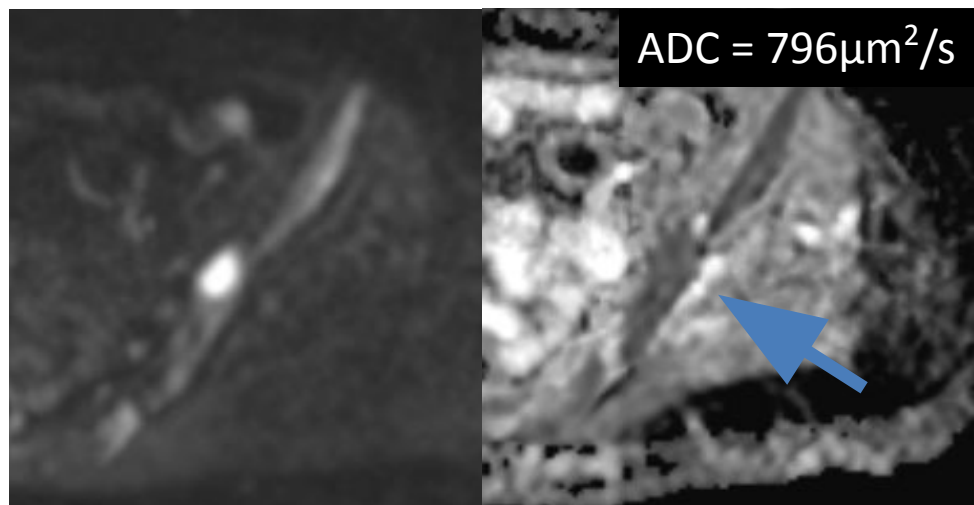
Ongoing – ad interim results

Prof. G. Petralia – P.I. of the RESPECT prostate study – UID 2243, ongoing at IEO-European Institute of Oncology, Milan

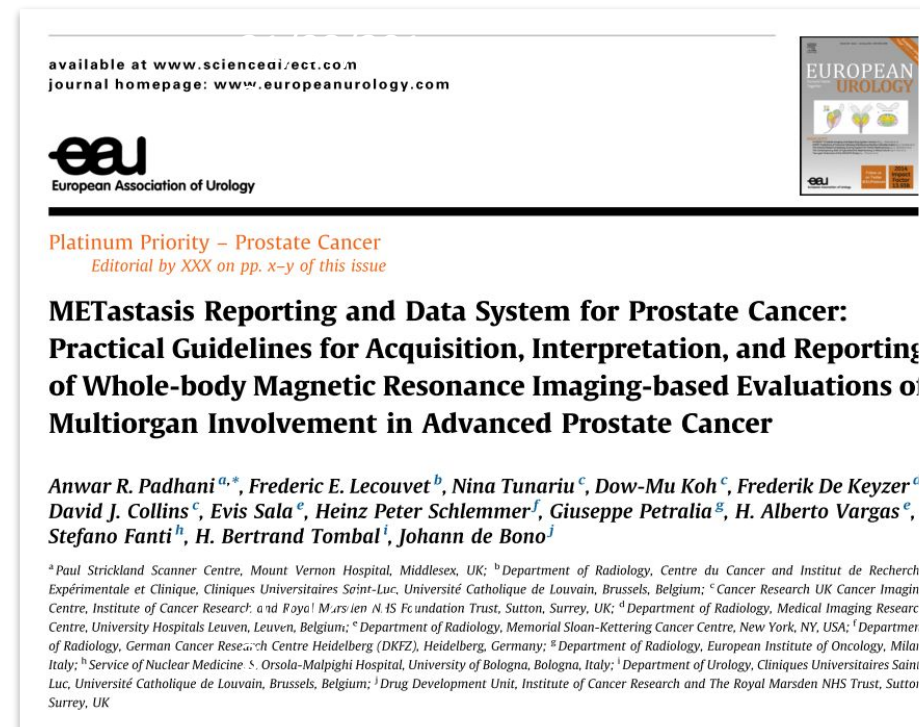
*Padhani AR. MET-RADS. Practical Guidelines for Acquisition, Interpretation, and Reporting of WB-MRI based Evaluations of Multiorgan Involvement in Advanced Prostate Cancer. Eur Urol 2017; 71:81-92

Imaging guidelines already published (MET-RADS)

To overcome limitations of RECIST 1.1 for assessing metastatic bone disease

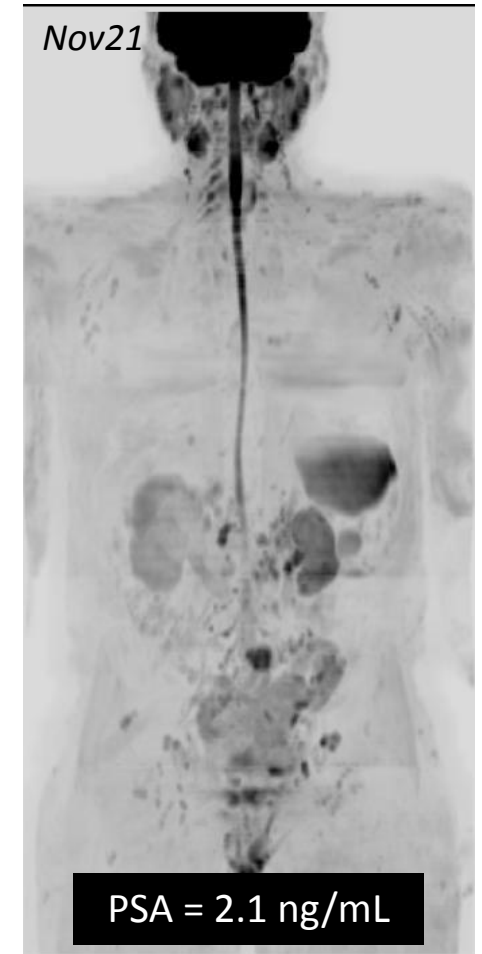
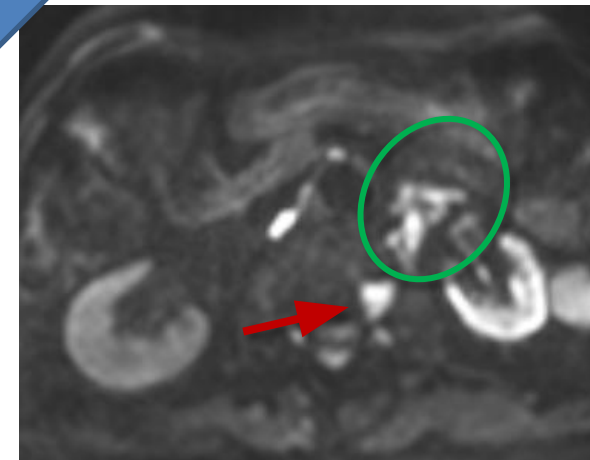
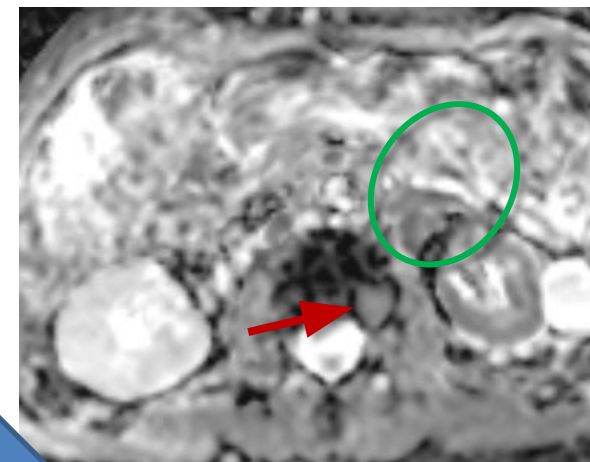
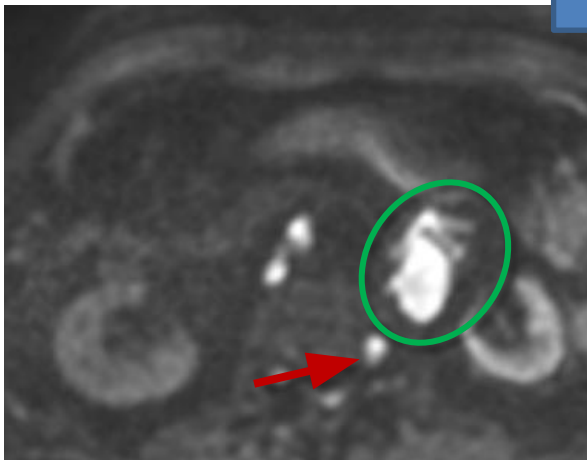
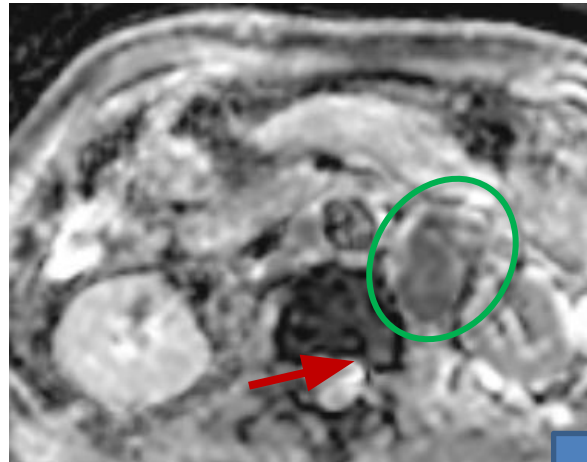
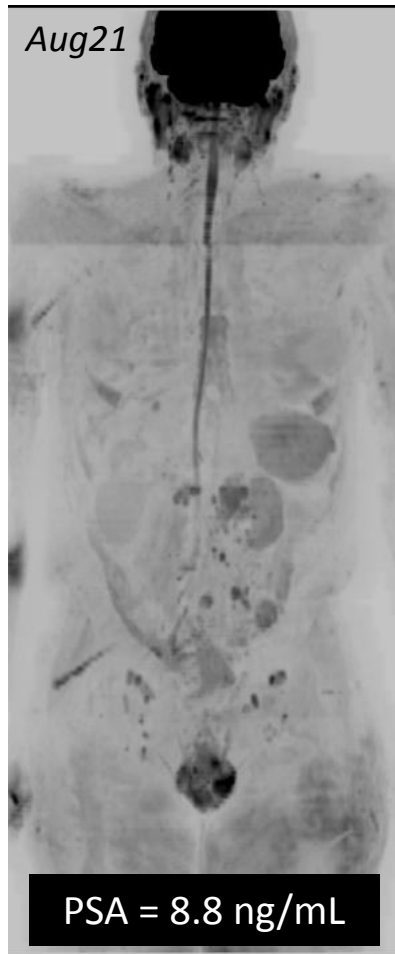


After Docetaxel



Imaging guidelines already published (MET-RADS)

To enable recording of the presence, location & extent of discordant responses



mCRPC under Abiraterone (2nd line)

Lumbar spine = RAC 5

Para-aortic node = RAC 2

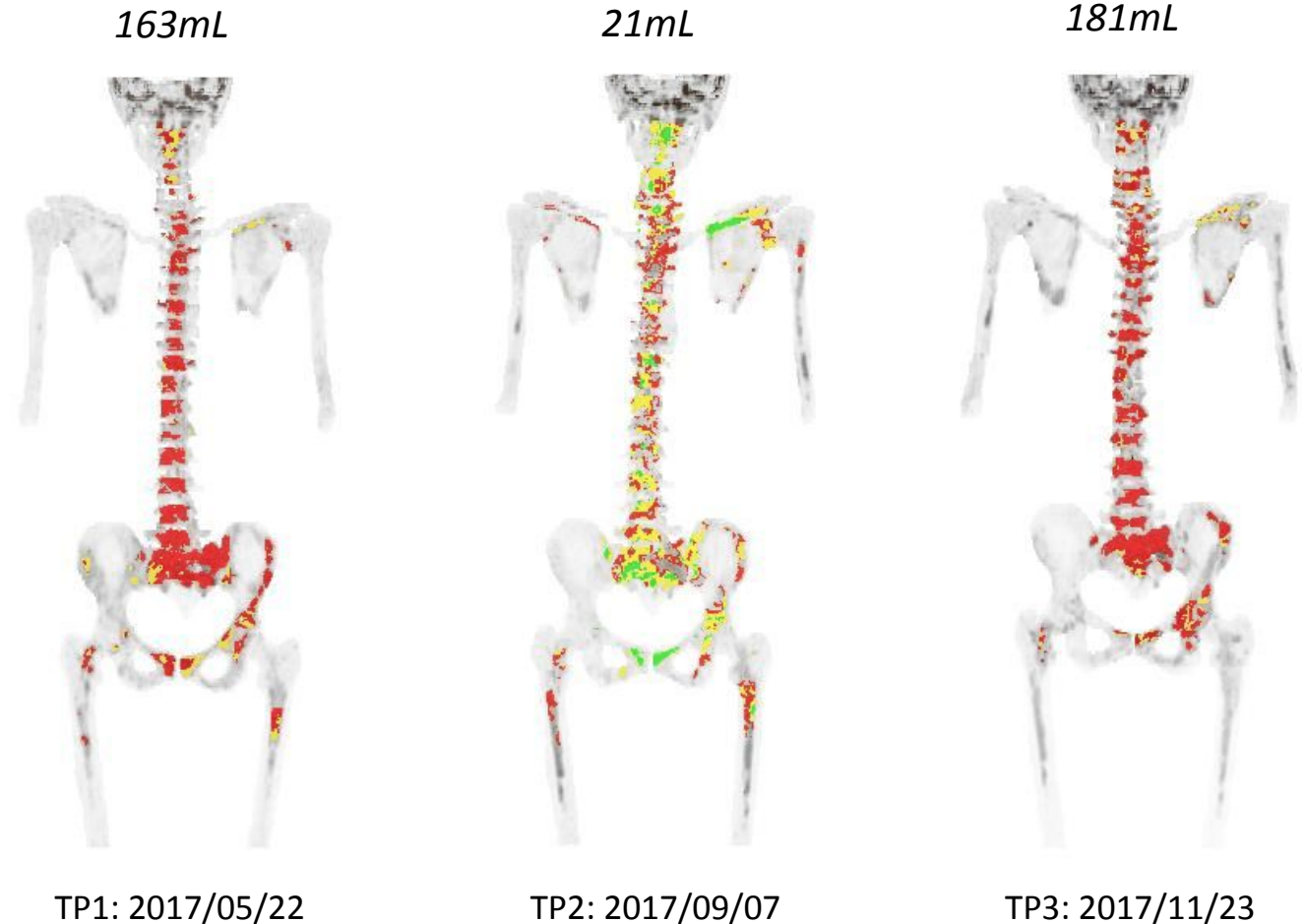
Welcome to a new era with AI

*From old response categories to **habitat imaging***

ADC classes	
Active	(650-1000*)
Dying	(1000-1400*)
Dead	(>1400*)

*values displayed in $\mu\text{m}^2/\text{s}$

Active metastatic volume



AI promotes **PRECISION IMAGING** in cancer patients

1. Streamlines imaging workflow
2. Reduces human error in routine examinations (e.g.. chest radiography)
3. Lowers radiation in CT and scan duration + CO₂ emissions in MRI
4. Minimizes inter-reader variability and shorten reporting times
5. Requires expert radiologists to ensure optimal patient outcomes

right treatment, right patient, right time, right duration