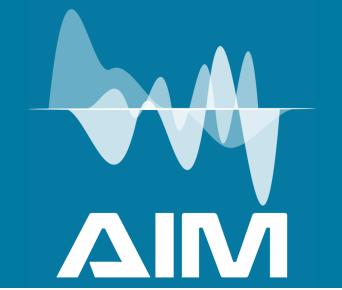
# Artificial Intelligence in Medicine



# Project Summary

Resp. Naz.: A. Retico (PI)

Resp. Loc.: S. Tangaro (BA), D. Remondini (BO), P. Oliva (CA),

M. Marrale (CT), C. Talamonti (FI), A. Chincarini (GE), M.E. Fantacci (PI)

AIM Annual Meeting - Pisa - February 3rd, 2020

# AIM Project Overview



## INFN - CSN5, 2019-2021

Several researchers from INFN divisions and University Departments collaborate with Radiologists, Clinicians and Medical Physicists in Clinical Centers to develop innovative solutions based on data mining and artificial intelligence.

## **Clinical partners**

- IRCCS S. Martino (GE)
- IRCCS Stella Maris (PI)
- IRCCS Gaslini (GE)
- IRCCS Centro S. G. di Dio (BS)
- IRCCS G.Paolo II (BA)





- IRCCS SDN (NA)
- **IMAGO7**
- AOUP (PI)

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- Policlinico (BA)

































Policlinico (PA)



**EU / consortia** 

EADC (EU)

ADNI (US)







ABIDE (EU/US)

ENIGMA (WW)

# Participants



moroso Nicola										
moroso Nicola		2.3	CAGLIARI			1.7	GENOVA			2.4
	40			1 Fanti Alessandro	30			1 <u>Alchera Nicola</u>	100	
<u>ellotti Roberto</u>	20			2 Golosio Bruno	30			2 <u>Boccacci Patrizia</u>	20	
ella Eufemia	30			3 Oliva Piernicola	50			3 <u>Peira Enrico</u>	50	
ombardi Angela	20			1 Chiriu Daniele	50			4 <u>Sensi Francesco</u>	50	
aggipinto Tommaso	40			2 Mazzarella Giuseppe	10			1 Corosu Mirko	20	
angaro Sabina	50				170				240	
onaco Alfonso	30									
эшешео гласопо	230		CATANIA			3.1	PISA			5.55
				1 Bartolotta Antonio	70			1 <u>Barca Patrizio</u>	40	
		5		2 Collura Giorgio	70			2 <u>Bosco Paolo</u>	10	
<u>arbieri Marco</u>	80			3 D'Oca Maria Cristina	50			3 <u>Buonincontri Guido</u>	20	
<u>rizi Leonardo</u>	80			4 Marrale Maurizio	70			4 Costagli Mauro	20	
astellani Gastone	30			5 <u>Tomarchio Elio Angelo</u>	50			5 Fantacci Maria Evelina	70	
<u>iampieri Enrico</u>	20				310			6 <u>Ferrari Elisa</u>	100	
atteuzzi Tommaso	50							7 Lamastra Rocco	30	
erlotti Alessandra	80		FIRENZE			1.4		8 <u>Lizzi Francesca</u>	100	
<u>emondini Daniel</u>	70			1 <u>Calusi Silvia</u>	20			9 <u>Marfisi Daniela</u>	30	
ıla Claudia	0			2 Pallotta Stefania	30			10 Retico Alessandra	70	
esta Claudia	80			3 <u>Piffer Stefano</u>	50			11 <u>Tosetti Michela</u>	10	
stoli Maria Cristina	10			4 <u>Talamonti Cinzia</u>	40			12 Tucciariello Raffaele M	30	
	500				140			1 <u>Arezzini Silvia</u>	10	
								2 <u>Ciampa Alberto</u>	10	
								3 Mazzoni Enrico	5	
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			51 Total peop	le <b>21.45</b>	Total	FTE				
	la Eufemia mbardi Angela nggipinto Tommaso ngaro Sabina maco Alfonso menico Diacono  rbieri Marco zi Leonardo stellani Gastone impieri Enrico itteuzzi Tommaso relotti Alessandra mondini Daniel a Claudia sta Claudia	la Eufemia 30 mbardi Angela 20 nggipinto Tommaso 40 ngaro Sabina 50 maco Alfonso 30 menico Diacono 230  rbieri Marco 80 zi Leonardo 80 stellani Gastone 30 mpieri Enrico 20 tteuzzi Tommaso 50 rlotti Alessandra 80 mondini Daniel 70 a Claudia 0 sta Claudia 80 toli Maria Cristina 10	la Eufemia 30 mbardi Angela 20 luggipinto Tommaso 40 mgaro Sabina 50 menico Diacono 230  5 mbieri Marco 80 zi Leonardo 80 stellani Gastone 30 mpieri Enrico 20 menico 10 menico 20 menico 20 menico 20 menico 30 menico	la Eufemia 30 mbardi Angela 20 luggipinto Tommaso 40 magaro Sabina 50 menico Diacono 230  CATANIA   Tobieri Marco 80 zi Leonardo 80 zi Leonardo 80 menici Enrico 20 menici Enrico 20 menici Alessandra 80 mondini Daniel 70 a Claudia 0 ata Claudia 80 toli Maria Cristina 10 500	la Eufemia 30	la Eufemia 30 3 Oliva Piernicola 50 bendardi Angela 20 1 Chiriu Daniele 50 gigipinto Tommaso 40 2 Mazzarella Giuseppe 10 pagaro Sabina 50 pagaro Sabina 50 pagaro Sabina 50 pagaro Alfonso 170 pagaro Alfonso 170 pagaro Marco 230 CATANIA 1 Bartolotta Antonio 70 2 Collura Giorgio 70 2 Collura Giorgio 70 patellani Gastone 30 paroleti Alessandra 30 paroleti Alessandra 80 pagaro 10 pagaro 10 pagaro 10 pagaro 11 Calusi Silvia 20 pagaro 12 pagaro 13 pagaro 14 pagaro 14 pagaro 15	la Eufemia 30 30 30 1 30 1 30 1 30 1 30 1 30 1 30	la Eufemia 30	A Eufemia 30 30 Peira Enrico 30 30 Peira Enrico 30 40 50 40 50 40 50 40 50 50 40 50 50 50 50 50 50 50 50 50 50 50 50 50	la Eufemia 30 30 30 10 10 10 10 10 10 10 10 10 10 10 10 10

# Project timeline

## AIM workpackages and timeline

## **AIM 1: Data harmonization**

AIM1.T1 - Multi-site data harmonization in MRI (PI, BA, BO)

AIM1.T2 - Multi-site data harmonization in mammography (PI, CA)

## **AIM 2: Quantification**

AIM2.T1 - Quantification models in PET (GE, BO)

<u>AIM2.T2'</u> - Machine-learning (ML) and deep-learning (DL) methods for quantitative MRI (BO)

## **AIM 3: Predictive models**

<u>AIM3.T1</u> - Predictive models for Radiation Therapy treatments (FI, PI, CA, CT)

<u>AIM3.T2</u> - Predictive models for mammography and CESM (PI, CA, BA)

<u>AIM3.T3</u> - Predictive models for transcranial-MR-guided Focused Ultrasound Surgery (CT, BO)

AIM3.T4 - Predictive models for Systems Medicine (BO)

AIM3.T5 - Predictive models for tumor classification (BO,CT)

		l year		II year		III year	
AIM1: DATA HARMONIZATION	T1.1		*	*			*
	T1.2		*		*		
AIM2:	T2.1		*		*		
QUANTIFICATION	T2.2'		*		*	*	
AIM3: PREDICTIVE MODELS	T3.1		*		*		*
	T3.2	*		*	*	*	*
	тз.з		*		*		*
	T3.4		*		*		
	T3.5		*		*		*

AIM, CSN5, 2019-2021

30/06/2019 M3.2a - Development and validation of a Convolutional

density according to the 4 BIRADS classes

Network (GAN) for MRI data harmonization

harmonization algorithm for mammograms

31/12/2019 M1.2 Implementation of first prototype of the

of amyloid- PET quantification

**Radiation Therapy treatments** 

classification method in CESM

guided Focused US Surgery

identification

31/12/2019 M3.1 Creation of database for predictive models for

31/12/2019 M3.2b - Development and validation of an automatic

31/12/2019 M3.3 Database creation and development of analysis

31/12/2019 M3.4 Development of a pipeline for the integration of

31/12/2019 M3.5 Database creation and development of analysis

multiple omics data in relation to drug target

software for predictive models for transcranial-MR-

software for predictive models for tumor classification

to clinical variables

Neural Network for automatic classification of breast

Mile	estones 2019		
Deadline	Milestone	Brief description of completed work (July); updates (July->December 2019)	Degree of co
Deauine	Milestone	brief description of completed work (July); apaates (July->December 2015)	

Conference (Lizzi et al.) and published in the proceedings.

the ABIDE data in the MRI-siteA <==> MRI-siteB conversions

based approach to amyloid PET semi-quantification."

Master thesis discussed in october 2020 (supervisors: M.E Fantacci and P. Oliva).

techniques is done. (master's degree). Work submitted to conference

31/12/2019 M1.1 Identification and coding of Generative Adversarial The GAN architecture has been identified. The training and validation procedures of GAN on 3D images have been

31/12/2019 M2.1 Paper submitted, describing an innovative method The paper is published! Eur J Nucl Med Mol Imaging. 2020 Jan 25. doi: 10.1007/s00259-020-04689-v. "A kinetics-

31/12/2019 M2.2 Characterisation of PET dataset and its association The construction of the entire PET dataset is completed. The association with clinical variables (EEG) with ML

necessary for full functionality.

experts).

This task is completed. The four-class CNN classifier has been trained and validated on 1962 mammographic

exams (7848 images/single projections). Work presented at Bionformatics 2020 conference (Lizzi et al. and VIMABI

setup. This architecture has been identified and trained on 3D MRI and it is now ready to be tested next year on

The algorithm has been completed. A first version of the reconstruction model has been implemented and is

validated in clinical conditions but only for materials of which dedicated physical phantoms are been made.

Patients were selected. MRI, CT and dose distributions related to radiotherapy treatment were extracted from the

diagnostic support tool for clinicians. The system performance is currently under evaluation on the available CESM

The Imaging database is almost completed, the clinical database is under construction because we are waiting for

Created a meta-database to integrate different types of data (Genomics, Metabolomics, drug-disease, disease-

several visualization and search algorithms. The network is very big, so further computational optimization is

The first batch of data have been acquired (June 2019) and the analysis pipeline has been implemented. The

classification performance will be ultimately estimated when all the data will be made available. The full acquisition of data is still underway, even if a full analysis pipeline has been run on the data available up to now.

symptoms). A paper is in progress, and within the end of the year the meta-database has been tested internally by

different databases at Meyer and at the Radiotherapy Unit of Careggi Hospital (FI). The image database has been collected and it is ready for radiomic and dosiomic analysis. Clinical labels are available (under revision by clinical

A fully automatic system for automated breast cancer diagnosis based on CESM data has been designed as a

data collection. A first paper on the clinical relevance of the technique has been published.

the 3- and 6-months follow-up after treatment. Software development is almost completed.

Master Thesis completed and PhD Thesis in progress (supervisor: M. Marrale).

Milestones 2019	
	Degree of cor

completion Dec. 2019

100%

70 %

100%

100 %

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100%

90%

85 %

85 %

**July 2019** 100%

100%

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60%

50%

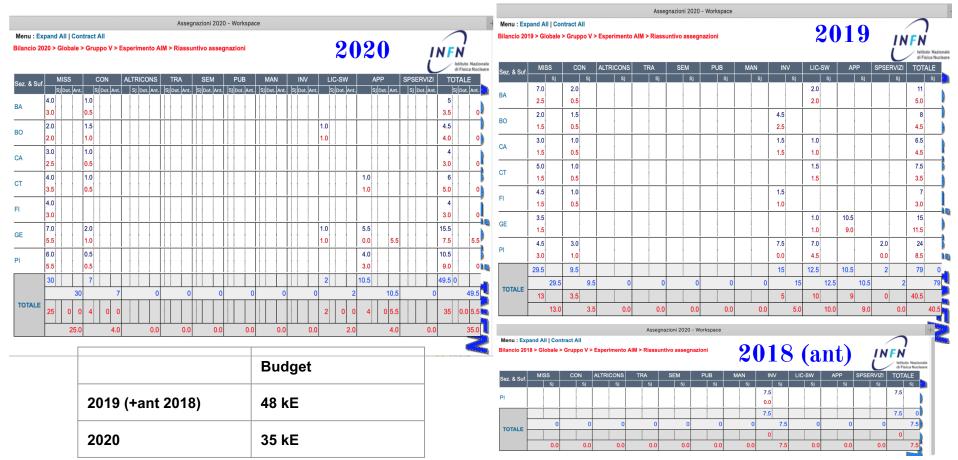
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80%

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## Financial resources





## (INF

## Today's Agenda







## **AIM General Meeting**

Pisa, INFN Division, Largo B. Pontecorvo 3, 56127 Ed. C, Galileo Galilei meeting room (131), ground floor

> Agenda - February 3rd, 2020 https://agenda.infn.it/event/21746/

9:30-9:45 Welcome and Project summary (A. Retico, PI)

#### 9:45-15:00 Reports by project tasks

#### AIM 1: Data harmonization

AIM1.T1 - Multi-site data harmonization in MRI (PI, BA, BO)

9:45-10:00 Uncovering the causes of site signature in MRI features of multicenter data [P. Bosco, PI] 10:00-10:15 An attempt to account for site effects in multicenter MRI data analysis with ML [F. Laruina, PII

AIM1.T2 - Multi-site data harmonization in mammography (PI, CA)

10:15-10:30 Data harmonization in mammography: the tissue equivalent representation (P. Oliva, CA)

## AIM 2: Quantification

AIM2.T1 - Quantification models in PET (GE, BO)

10:30-10:45 Status of the DORIAN initiative [F. Sensi, GE]

10:45-11:00 Update on amyloid PET: quantification, classification and clinics [E. Peira, GE]

## 11.00-11.30 Coffee break

11:30-11:45 Quality, harmonization and parcellation [N. Alchera, GE]

AIM2.T2 - Machine-learning (ML) and deep-learning (DL) methods for quantitative MRI (BO) 11:45-12:00 BYRON: a Deep Learning library for advanced Machine Learning (N. Curti, BO) 12:00-12:15 Deep Learning implementation of MRF data reconstruction [L. Peretti, PI] 12:15-12:30 Advancements in QSM data analysis (C. Testa, BO)

## https://agenda.infn.it/event/21746/

#### AIM 3: Predictive models

AIM3.T1 - Predictive models for Radiation Therapy (RT) treatments (FI, PI, CT)
12:30-12:45 Collection of the dataset for Radiomic and Dosiomic analysis in RT [S. Piffer, FI]

12:45-13:00 Preliminary classification results on data from Lung RT [M. Marrale, CT] 13:00-13:15 Challenges in ML analysis implementation on RT data [L. Ubaldi, PI]

AIMO TO Production models for more services of OFCM (PL CA RA)

<u>AIM3.T2</u> - Predictive models for mammography and CESM (PI, CA, BA) 13:15-13:30 Update on predictive models for CESM data [S. Tangaro, BA]

#### 13.30-14.15 Lunch break

AIM3.T3 - Predictive models for transcranial-MR-guided Focused Ultrasound Surgery (CT, BO)

14:15-14.30 Thalamic parcellation through probabilistic tractography for tcMRgFUS treatments.

Preliminary results of fMRI analyses on TcMRgFUS patients (Remondini, BO; Marrale, Collura, CT)

AIM3.T4 - Predictive models for Systems Medicine (BO)

14:30-14.45 CHIMERA: a network of networks in medicine (D. Remondini, BO)

AIM3.T5\_- Predictive models for tumor classification (BO,CT) 14.45-15:00 A short update (D. Remondini, Mengucci, BO, Marrale, CT)

15:00-16:30 Hot Topics in ML: Explainability and Interpretability of ML models

15:00-15:30 Explaining Explanation Methods: Overview and Applications (R. Guidotti, Dip. Comp. Sc. PI) 15:30-15:50 Explainable ML Framework for Multi-site Harmonization (A. Lombardi, BA)

15:50-16:10 Explainable ML in mammography (F. Lizzi, C. Scapicchio, PI)

16:10-17:00 Discussion, General Remarks and Conclusions

