

MIMBCD-UI

Medical Imaging Multimodality Breast Cancer Diagnosis User Interface

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Abstract

This report belongs to Medical Imaging Multimodality Breast Cancer Diagnosis User Interface (MIMBCD-UI) state of the art project stage, describing the related work of Clinical User Interfaces.

Breast cancer is an abnormal growth of cells in the breast, usually in the inner lining of the milk ducts or lobules. It is currently the most common type of cancer in women in developed and developing countries. The number of women affected by breast cancer is gradually increasing and remains as a significant health concern.

Researchers are continuously working to develop novel techniques to detect early stages of breast cancer. This project proposes the development of a methodology for detection and cancer targeting breast using multimodality medical imaging and textual information.

Keywords: medical, imaging, multimodality, breast cancer, diagnosis, user interface

Resumo

O teu resumo aqui...

Palavras-Chave: as tuas palavras chave

Chapter 1

Introduction

The Medical Imaging Multimodality Breast Cancer Diagnosis is a topic of great interest, it has been the subject of intensive research in the world of medicine. However the developments in terms of innovation in the computational world are still scarce. The Interface herein proposer deals with the processing and analysis of images. Indeed, this topic has a wide spectrum of applications ranging from video surveillance based systems to medical applications.

In the proposed work, i.e., the analysis mammography using multi-modality images, several issues must be considered. First each image modality has its own image features. Which must be included in the interface. Second, for each image modality several and distinct image feature must be considered.

Masses and calcifications can be accurately diagnosed from cytological features [1] of the cells that constitute them. However, the diagnostic accuracy depends on the training, experience, and many indefinite factors of interpretation of the medical expert in cytological evaluation.

There were, in fact, some developments in the past facing the Computer-Based classification system [2, 3] that assists in the diagnosis of breast cells based on visual assessment of characteristics of the cells. [4] A set of cytologic features, previously evaluated visually, are now replaced by digital ones, evaluated by image analysis. In this project, the interface will be used by several experts in the field, to collect the ground truth, for Mammograms, MRI and Ultrasounds images. Those mammography experts annotations will be a crucial step towards the performance evaluation of Machine Learning (ML) Based-Algorithms.

Doctors are accountable for decisions they make on behalf of their patients. Likewise, computer interface developers and engineers must assume accountability for limitations, assumptions and other unplanned deficiencies that impact on the integrity, validity, quantity and timeliness of data made accessible through their interfaces.

Art and science [5] applied to the user interface field of clinical care are based on an unusual combination of non-judgement trust and exasperating mistrust [6]. Two major obstacles to good clinicians-patient communication are differences of language and culture [7]. Doctors and clinicians require that their patients keep no secrets or else an opportunity to reach the right diagnosis or select the proper therapy may be lost. At the same time, doctors and clinicians are taught to question everything they hear from both colleagues and patients. It is deeply ingrained in medical training to make no important decisions based on information supplied solely by others. The highly trained mistrust explains why many times patients complained that a dozen different people asked the same question. A deeply ingrained aversion to secrets and lies greatly characterise a clinicians attitude toward a computer interface where the responsibility of interface developers address and incorporate the concept of visual accountability extending well beyond medical user interfaces.

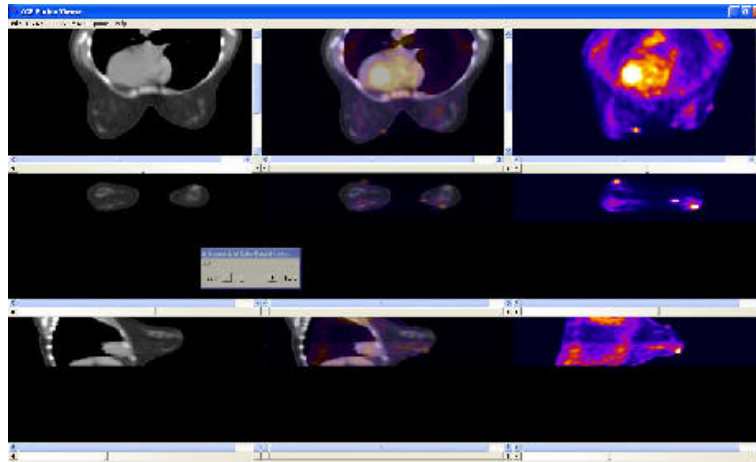


Figure 1.1: A screenshot of a fused data set.

The growing interest in multimodal interface development is inspired in large part by goals of supporting more flexible, transparent, efficient and powerfully expressive means of human-computer interaction than in the past. Multimodal interfaces are expected to support a wider range of diverse applications, be usable by a broader spectrum of the average population, and function more reliably under realistic and challenging usage conditions.

Computer-aided diagnosis often implies processing large and high dimensional datasets, for instance, high-resolution volumes containing millions of voxels.

Visualisation and analysis of such data can be very time demanding for physicians but also very computationally expensive for machines assisting diagnosis tasks. Fortunately, in many cases the relevant information for an application can be represented in lower dimensional spaces. If appropriately chosen and designed, dimensionality reduction methods will not only decrease the processing time but also facilitate any posterior analysis. Therefore, they can be of great use to a variety of CAD (Computer Aided Diagnosis) applications, ranging from general problems such as classification and visualisation, to more specific ones like multi-modal registration or motion compensation.

Dimensionality reduction in CAD has relied mainly on linear methods and linear methods are however not suitable for handling non-linear complex relationships among the data samples. Non-linear approaches based on manifold learning are a good alternative for dimensionality reduction in such cases.

Medical Imaging Multimodality Breast Cancer Diagnosis User Interface (MIMBCD-UI) registration consists in finding a map between images of the same scene acquired with different imaging modalities. The standard approach to multi-modal registration is to use sophisticated similarity metrics such as mutual information to compare the images.

Chapter 2

Overview

CAD Based-Systems are typically single-user oriented that is, designed to support individual tasks such as notations and information visualisation. This personal and task-oriented approach for clinical software provides little support for the aggregation of resources and tools required in carrying out higher level activities for multimodality of medical imaging. It is left to the user to aggregate such resources and tools in meaningful bundles according to the activity at hand, and users often have to reconfigure this aggregation manually when shifting between a set of parallel activities and machines.

A suited number of studies have shown that clinical professionals, upon the act of organising and thinking in their work routines, which often carried out search of general objectives, often in collaboration with others [???, ???, ???], are significant mental and manual overhead associated with handling of parallel work and interruptions [???, ???]. The rest of the user interfaces in the current operating systems, fail to provide adequate support in the resumption of the previous activities and for an easy switching between parallel activities [???, ???].

Clinical user interfaces have been extensively discussed in the literature on information visualisation. MIMBCD-UI shows the details of an user interface for diagnosing breast cancer using multimodality medical imaging.

MIMBCD-UI have several benefits. In fact, the diagnosis it self is more efficient since the clinical users may navigate using the overview of multimodality of imaging rather than the others techniques. The overview of multimodality of imaging window aids users in keeping track of their current position in the information space [???]. Moreover the overview window itself give users task-relevant information and a feeling of control [???].

A multimodality of views permits to acquire better, more efficient and flexible information and to easily diagnose in it; however, it is more difficult to users to manage information in a more complex user interface.

Specifically, this project deals with the use of a recently proposed technique in literature: Deep Convolutional Neural Networks (CNNs).

These deep networks will incorporate information from several different modes: magnetic resonance imaging volumes (MRI), ultrasound images, mammographic images (both views CC and MLO) and text.

The proposed algorithm, called for multimodality CNNs (MMCNNs) will have the ability to process multimodal information at an unified and sustained manner.

This methodology needs to "learn" what are the masses and calcifications.

So that is necessary to collect the ground truth, or notes of the masses and calcifications provided by medical experts.

For the collection of these notes, the design and development of an interface is necessary allows the user (in this case, the medical specialist) to display various types of image (i.e., ultrasound, MRI and mammography), and that also allows for user interaction, particularly in providing the notes of the masses and calcifications.

For these reasons, it is crucial for the development of this project, cooperation with experts providing the above notes.

Chapter 3

Goals

Development of the User Interface for Diagnosis of Breast Cancer in Medical Imaging Multimodality.

It is intended to develop an User Interface for monitoring and diagnosis of breast lesions in various medical imaging modalities. Imaging modalities to include in the work are:

- Mammography (including the views caudal-skull and oblique);
- Ultrasound;
- MRI volumes;

With protocol already signed with the Fernando Fonseca Hospital, it is intended that this interface has two features:

- (i) - Build a database with annotations in multimodality mammography image.

Provide the user (doctor) facility to draw / write down masses and calcifications, as well as the corresponding BI-RADS for each imaging modality. This annotation process can be built during the examination, and thus it is possible to build a database of medical notes.

- (ii) - Follow-up of the patient. With this feature is to allow the doctor automate a multimodality inspection for the patient.

Based on the patient's identification (eg, via a query on the ID), and for a given type of mammography imaging, the system must return all images of this patient over a period of time (eg. Two or more years) entered by the doctor, and show these images (pre-recorded). This feature is critical for diagnosis because it allows, through information visualisation, observing not only the calcifications density and the morphological evolution of the masses in that time period.

Chapter 4

User Interface Contextualisation

The first step in successfully analysing the digital image is to specify the exact location of each masses nucleus or calcifications nucleus. The image is projected onto a computer screen, and the clinical medical operator uses, preferentially, a mouse button that will trace a rough outline of each visible masses (Figure 4.1) nucleus. On the other hand, the clinical medical operator will mark with dots the calcification (Figure 4.2) nucleus of cells.

For a precise and rigorous diagnosis of the cancer in mammography, it is necessary a successful step when analysing the image, specifying the exact location and morphology of the masses as well as calcifications.

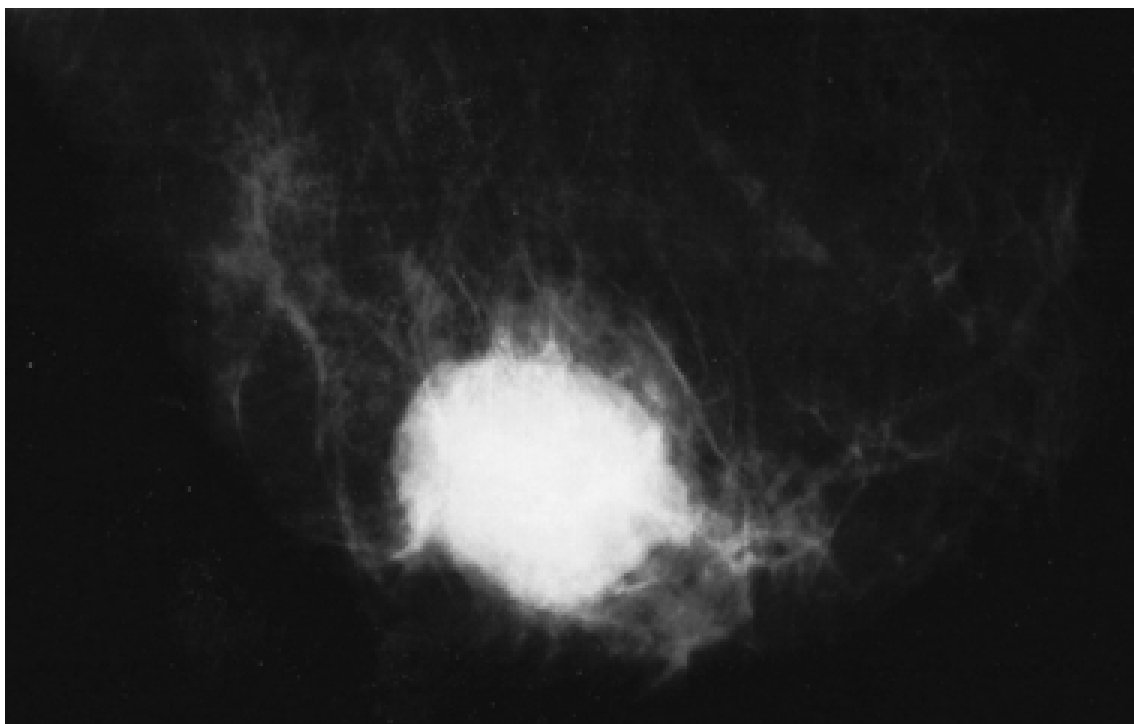


Figure 4.1: Mammographic image of a high-density mass

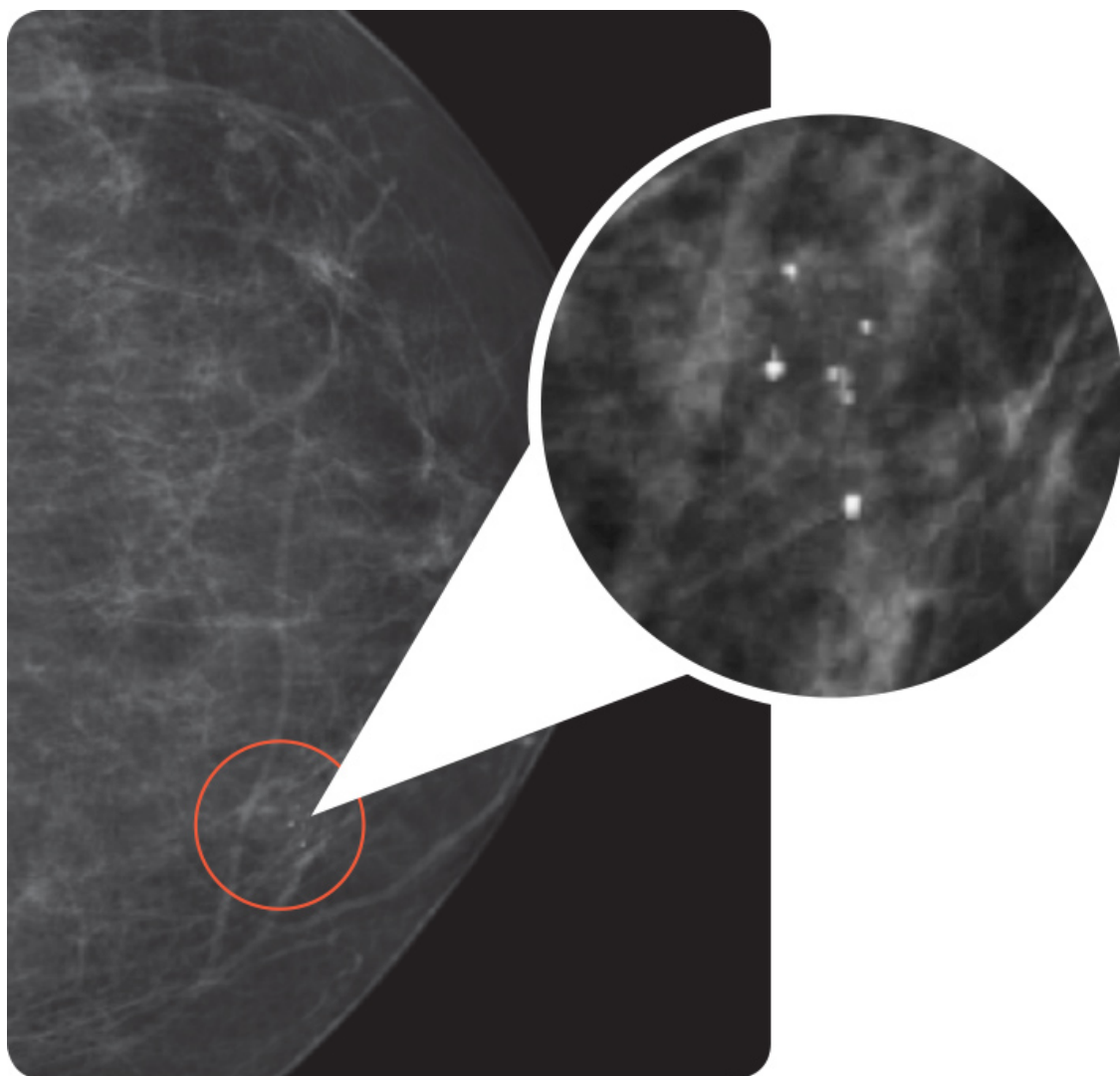


Figure 4.2: Mammogram shows calcifications, an early sign of breast cancer

Chapter 5

Related Work

Some systems have been designed to provide more direct support for managing multiple concurrent activities associated with a large amount of digital material and tools.

In the further section, we discuss software for both clinical and non-clinical imaging tools. More specifically, we address image modality concerning medical applications as well as non-medical applications (e.g., surveillance).

Also, we address software concerning the (non)-multimodality views and existing work in the field of medical and clinical user interfaces.

5.1 Activity-Based Computing

In this section we address other approaches like an Activity-Based Computing (ABC) for Medical Work in Hospitals [???] that presents the concept, which seeks to create computational support for human activities contributing to the growing research on support for human activities, mobility, collaboration, and context-aware computing. To summarise, activity-based computing builds and expands upon prior work within each of the areas described as activity management, virtual window management, collaboration support systems and context-awareness. However the last topics, it does not approach a multimodal view of images, but it was great on other fields of understanding the context and most of the problem/solutions.

5.2 Fine Needle Aspirate

Another direction of work is known as Fine Needle Aspirate (FNA) [???]. Basically, their class of approaches, by using computer based image analysing, we research a Breast Cytology Diagnosis via Digital Image Analysis [???] paper work that brings us an improvement on the diagnostic accuracy of breast FNA goal where an interactive computer system has been developed for evaluating cytologic features derived directly from a digital scan of breast FNA slides. The system uses computer vision technology techniques to analyse cell nuclei and classifies them using an inductive method based on linear programming.

The researched accuracy for medical imaging breast cancer diagnosis from FNAs varies considerably. Reported accuracy for visually diagnosing breast cancer from FNAs varies considerably. Giard and Hermans [???] researched on FNA performance parameters and found some sensitivities. The FNA diagnosis is highly operator-dependent and emphasised the need for developing individual performance characteristics for those doing this test. One goal of the present work is to improve the diagnostic accuracy of FNA by increasing its objectivity and thereby making it less operator-dependant. This image analysis and machine learning applied to breast cancer diagnosis and prognosis [14] study introduce us to a breast cancer diagnosis and prognosis by computer and to the value of aspiration cytologic examination of the breast into a statistical review of the medical literature [???].

5.3 Picture Archiving and Communication Systems

Medical services in current-time rely heavily on digital imaging technology due to image modalities utilised in medical field such as the computer Ecography, Mammography and Magnetic Resonance Imaging (MRI). These techniques require image-processing tools and digital management that has been the primary reason for development of Picture Archiving and Communication Systems (PACS) [???]. This technology provides economical storage and convenient access to images from multiple modalities where images are transmitted digitally via PACS where it eliminates the need to manually file, retrieve, or transport film jackets. The universal format for PACS image storage and transfer is Digital Imaging and Communications in Medicine (DICOM) [???] format.

The work that addresses the web based medical images, data processing and management systems, present an application of database and functional imaging [???] runs through the network and internet browser that has similar ability to the PACS yet having the advantages of being an online system can be viewed as archiving one step closer towards total online medical imaging system and online imaging in general. Despite the excellent information that this paper offer in the field of this research, we are more concerned with analysing the problem in a multimodality shed of image and interface surround, than this distribution of information side.

5.4 Computer Aided Diagnosis

The Picture Archiving and Communication System (PACS) [???] faces ever-growing adoption in hospitals and clinics worldwide [???] as we seen before. Digitalisation process and sharing of medical images is progressively replacing the use of tomography films, thus reducing costs and increasing the possibility of remote medical diagnosis through telemedicine solutions. Inline with this trend, Computer Aided Diagnosis (CAD) [???] is also gaining ground. CAD is an interdisciplinary technology combining elements of machine learning and computer vision with radiological image processing. A typical application is the detection of a tumor. For instance, some hospitals use CAD to support preventive medical check-ups in mammography (diagnosis of breast cancer). CAD typically intends to provide suggested diagnosis based on automatic quantitative analysis of medical images in order to aid physicians in their final diagnosis.

5.5 Patient Visualisation

[illegible]

The objective of this work is to display as much as possible information about the patient history on a limited display space, providing overview data as well as details. By displaying on a single screen of a personal computer the overview of multiple facets of records will provide users with a better sense of type and volume of available data.

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histories and permits to visually query patient data stored in the hospital database exploiting information visualisation techniques where it is able to accommodate on the screen a good amount of clinical cases.

This work has been developed according to an user-centered approach and will bring MIMBCD-UI support in that way. Beside the user studies conducted in the hospital at the requirement phase, they have performed with doctors evaluations of the different prototypes and this kind of information is kindly useful for our research field as well.

5.6 Patient Progress

In computer-assisted creation of patient progress notes [11] a prototype application that supports the creation of critical care notes by physicians in a hospital of an intensive care unit, called activeNotes, integrates automated, context-sensitive patient data retrieval and user control of automated data updates and alerts into the note creation process.



Figure 5.2: activeNotes Prototype System.

A critical care note is a clinical document, written by a hospital physician, that documents and patient's progress and prognosis. This kind of work will help MIMBCD-UI project by giving us information analyse by physicians feedback and user understanding. It also bring us information with qualitative study by providing us the right path throw prototype design and user experience evaluation.

The physician-driven management of patient progress notes in an intensive care unit [20], describes a design exploration focused on techniques to support data input and management of electronic progress note content. This will help MIMBCD-UI project by giving us an alternative design exploration including observations, structured and semi-structured interviews, design and implementation of a prototype, and feedback gathered in qualitative study with physicians surveys.

5.7 Interaction System

On M/ORIS: a Medical/Operating Room Interaction System [12] is proposed an architecture for a real-time multimodal system, which provides non-contact, adaptive user interfacing for Computer-Assisted Surgery (CAS) [13]. This paper focuses on the proposed activity monitoring aspects of M/ORIS. The researchers have analyse the issues of Human-Computer Interaction (HCI) in an Operation Room (OR) based on real-world case studies.



Figure 5.3: Operating room interaction system example.

5.7.1 CAS vs CAD

Computer Aided Surgery (CAS) [14] and Computer Aided Diagnosis (CAD) [15] can contribute to the general cost cutting trend in health care by making it possible to have fewer staff perform the same activity in less time than with traditional methods. It also brings us human error prevention and, if so, the system can better audit the source of problems and reduce error effects. In particular, it is likely that in the near future, a single doctor will have to control and diagnose several computer-based processes during a surgical, diagnosis or clinical intervention.

Efficient User Interface (UI) design that matches the constraints of clinical environments and that helps reduce the doctor's workload will, in a large part, determine the success of CAS and CAD.

5.7.2 User Interface for CAD

CAD techniques, whether they enhance traditional methods (e.g. image visualisation [16]) or provide new tools such as augmented displays [10], share a common need for multimodality of imaging UI. Interface issues are systematically brought up in connection with new computer-assisted techniques, and poor UI design is cited [12, 16] as significant limiting factor for many operations. In particular, doctors criticise the lack of user-centered design, the difficulty to operate computer-assisted equipment during surgery, and the failure to convey information without otherwise constraining the doctor.

To address these issues, several authors have developed guidelines for medical UI design. An introduction to human factors in medical devices [17] and making medical device interfaces more user-friendly [18] stress the importance of a doctor-centered design for both efficiency and human error reduction. A framework for determining component and overall accuracy for computer assisted surgery systems [19] proposes a framework for evaluating the benefits of new UI paradigms in CAS system design that can be applied to CAD system design.

5.8 Designing the User Interface

Multimodal systems that process user's speech and pen-based gestural input have become a vital and expanding field, especially within the past years, with demonstrated advances in a growing number of research and application areas.

A growing interest in multimodal interface design is inspired in large part by the goals of supporting more transparent, flexible, efficient and powerfully expressive means of human-computer interaction than in the past. Multimodal interfaces are expected to support a wider range of diverse applications, be usable by a broader spectrum of the average population, and function more reliably under realistic and challenging usage conditions.

In designing the user interface for multimodal speech and pen-based gesture applications: state-of-the-art systems and future research directions [21] article, researchers summarise the prevailing and emerging architectural approaches available for interpreting dual input signals in a robust manner, including early and late semantic fusion approaches, as well as new hybrid symbolic-statistical architecture, that potentially are capable of achieving very robust functioning, for processing pen-voice input (i.e. speech and gesture). Researchers also described a diverse collection of state-of-the-art multimodal systems that are capable of processing user's actions input. This will bring an enormous added value in the implementation and architecture of our future user interface.

5.9 Usability and Ergonomic Testing

Semiotic analysis combined with usability and ergonomic testing for evaluation of icons in medical user interface [3] have evaluated the medical icons and iconic interfaces of touch screen ventilator systems used in Intensive Care Unit (ICU).

The use of icons in iconic user interfaces [4] in medical devices like ventilator systems is a common practice. Precise communications through iconic interface between ventilator system and medical users like physicians or nurses is critical to avoid medical errors which may cost patient's life.

This research will help us understand and defining a set of icons that will represent our metaphor analysis through this work. It also, but not less, give us the right information about usability testing where icons can be tested using various usability testing methods. At last it will help us getting information about Semiotic and Lexical Analysis.

Semiotics is a study of cultural sign processes, analogy, signification, communication, metaphors, signs and symbols [5]. A semiotic analysis is concerned with meaning, which stems from relationships - in particular, the among signs relationships [6].

Linguistics has a term - 'Lexical Analysis' which is the process of converting a sequence of characters into a sequence of tokens. A lexical analysis helped in classification of medical icons [7] into mainly three classes: icons, indices and symbols.

Chapter 6

Another Class Of Devices

Mobile devices are increasingly being incorporated (Figure 6.1) onto Picture Archiving and Communication Systems (PACS). Previous work on medical image access using mobile devices essentially focuses on enabling the visualisation of the medical images at the mobile devices. In contrast, it can be proposed and developed a distributed system that allows medical image analysis using mobile devices. As a proof-of-concept, based on a mobile distributed system [20], which article develop a tool for dental implant simulation using mobile devices. There is also a discussion about the perspectives of extending the current system to incorporate Computer Aided Diagnosis (CAD) algorithms in it.



Figure 6.1: aycan mobile

Recently, mobile devices, such as PDAs, are being increasingly incorporated to PACS. Typically the flexibility on the visualisation of medical images storage in PACS, offered by a mobile access, is useful in patient care areas and emergency situations. This feature helps healthcare practitioners to have access to medical images at least for a preliminary image analysis in cases where searching for a dedicated terminal to access the images for a detailed and complete analysis is neither practical nor feasible.

The research proposes a distributed system that enables medical image analysis using mobile devices, as well as, the growth in the CAD area combined with the increase in processing power of the mobile devices and in the capacity of wireless networks favours the emergence of new developments integrating those technologies.

The communication between the mobile devices and the image server adopts web service technology [21]. To validate the distributed system processing power, speed, and feasibility we develop a tool for medical image analysis with mobile devices dedicated to assist in breast cancer visualisation diagnosis.

The deployed simulation tool allows the medic using a mobile device such as a PDA to determine the evolution of a patient like masses and calcifications location, preventing for instance the need for the doctor to move from analysis machine to the computer. After determine some critical areas, the doctor can visualise the analyse model of the result also using the mobile device. Results show that the use of mobile devices in hospital environments to assist the diagnosis and patient treatment is feasible. Other observation is that the mobile devices can be used to other tasks, like image model rendering, not only image visualisation.

Chapter 7

Conclusion

There is a lot of information concerning work in development for clinical user interfaces on images tools views, but, in fact, there is little in multimodality image and its display in breast cancer diagnosis fields.

This master project report is a first essay, to what will be the master thesis related work dissertation and state of the art [???]. It describe related systems that have been designed to provide more direct support and fundament to our research. We follow at most clinical imaging tools and personal computer-based interfaces as well as a hypothetical solution of implementation with mobile interfaces where it can help us understand the right user interface solution.

In short, we analyse and rehearsed what was the first approach to the subject-matter literature on a state of the art milestone of the project to understand and to investigate the various innovations and topics made in this field of research.

A review of the state of the art in the field is provided showing the increasing interest of researchers in the domain and a wide range applications where these methods can be applied.

Cancer is projected to become the world's leading cause of death by 2016, with the burden of disease shifting further towards medically underserved populations in industrialised countries and the developing world.

New approaches are required across the spectrum of cancer management, in prevention, diagnosis, treatment, education and care. If developed and tested appropriately, optical imaging technologies can play an important role in several aspects, from providing objective diagnostic screening at the community healthcare level, to enabling pathology guidance in the clinical setting.

Importantly, by delivering these technical capabilities within cost-effective platforms, the impact on public health can be magnified through expanding patient access to previously unreachable healthcare systems.

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Appendix A

Appendix chapter