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Article

Fourier-Transform Infrared Spectroscopy Application for *Candida auris* Outbreak Typing in a Referral Intensive Care Unit: Phylogenetic Analysis and Clustering Cut-Off Definition

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Abstract: Recently *Candida auris* has emerged as a multi-resistant fungal pathogen, with a significant clinical impact, and has become a critical issue in WHO fungal priority list, due to its unique ability to persist for long time on human skin and hospital environments. It is therefore fundamental to reinforce hospital surveillance protocols to limit nosocomial outbreaks. The study purpose was the Fourier-Transform Infrared Spectroscopy (FT-IR) application to investigate the phylogenetic relationships between isolated strains within the *C. auris* outbreak at the university Intensive Care Unit of a Tertiary University hospital in Turin (Italy). In order to calculate a clustering cut-off, intra- and inter-isolates distance values were analysed. Data showed the presence of a major cluster Alfa and a minor cluster Beta with a defined *C. auris* clustering cut-off. The results were validated by an external *C. auris* strain and Principal Component and Linear Discriminant Analysis. The application of FT-IR technology had allowed to obtain important information about the phylogenetic relationships between the analysed strains, defining for the first time a “not WGS-based” clustering cut-off with a statistical-mathematical approach. FT-IR could represent a valid alternative to molecular methods for rapid and cost saving typing of *C. auris* strains with important clinical implications.

Keywords: *Candida auris*; Fourier-Transform Infrared Spectroscopy; IR-Biotyper; outbreak; phylogenetic analysis; cluster analysis; multi-resistant fungal pathogen; healthcare associated infections

1. Introduction

Candida auris was first isolated from the external ear canal of a Japanese patient in 2009 [1]. Since then, it was responsible for several infections worldwide with a serious nosocomial health risk [2]. In fact, this yeast merged pivotal pathogenetic features to pose a threat for public healthcare systems such as antifungal multidrug resistance, biofilm formation, ability to spread through contact

transmission and opportunistic behaviour in critically ill and immunocompromised patients [3]. Furthermore, reliable identification by traditional phenotypic and biochemical methods is challenging: *C. auris* could be misidentified with other yeast (e.g., *Candida haemulonii*, *Candida lusitaniae*, *Candida guilliermondii*) and its correct identification at species level requires more advanced techniques such as DNA sequencing, Nucleic Acid Amplification Tests or, most frequently, Matrix Assisted Laser Desorption Ionization Time-of-Flight Mass Spectrometry (MALDI-TOF MS)[4,5].

After its identification as a novel species, *C. auris* emerged in Africa, India (2009), China (2011), South (2012) and North America (2013) [6]. In the same year *C. auris* reached the Europe with sporadic cases in the United Kingdom [7]. In the period 2013-2021, 1812 new cases were reported by 15 countries belonging to the European Union and European Economic Area (EU/EEA). For most cases, carriage status was reported (1146; 63.2%), while a bloodstream or another type of infection was accounted for 277 (15.3%) and 186 (10.3%) patients respectively [8]. Focusing on Italy, *C. auris* was first identified as responsible of invasive infection in a hospital of the Liguria region in 2019 [9]. Thence, other 360 cases were registered until December 2022 in four Northern Italy regions (Liguria, n=297; Piedmont, n=48; Emilia-Romagna, n=15; Veneto, n=1) [10]. During this time span, *C. auris* epidemic raised two peaks: the first occurred in December 2020 and was related to Liguria local epidemiology, while the second was observed in September 2022, mainly due to the emergence of an outbreak in a referral Intensive Care Unit (ICU) in Turin (Piedmont)[10,11].

With regard to *C. auris* infection-control strategies, international healthcare agencies and expert consensus recommended disinfection of high touch areas and reusable equipment twice or three time daily in rooms housing patients infected by *C. auris*. Chlorine-based agents or other sporicidal disinfectants belonging on List P of Environmental Protection Agency (EPA) - Registered Disinfectants are highly effective in controlling *C. auris* cross-transmission and its spreading in healthcare settings[12,13]. Moreover, contact tracing of *C. auris* positive patients is critical to prevent the yeast diffusion and to determine potential outbreaks. To achieve this purpose, the IR-Biotyper (IR-BT) (Bruker Daltonics GmbH & Co. KG, Bremen, Germany), a novel typing instrument based on Fourier-transform infrared (FTIR) spectroscopy, represents a promising tool for rapid and reliable microbial outbreak analysis in nosocomial settings [14].

A preliminary analysis on the *C. auris* outbreak occurred between July 2021 and March 2022 in the AOU Città della Salute e della Scienza, Turin, Italy, was performed by Corcione et al. in 2022, considering the epidemiological and clinical aspects [11].

Aim of this work was to broaden and deep-in the previous outbreak analysis by the application of the IR-BT in order to investigate phylogenetic relationship among *C. auris* strains isolated in a referral ICU of AOU Città della Salute e della Scienza of Turin, Tertiary University hospital in Piedmont, Italy [11]. For this purpose, for the first time, data collected from IR-BT analysis were used to experimentally define a clustering cut-off to classify new *C. auris* strains as belonging or not to the same cluster.

2. Materials and Methods

The study was performed in the Microbiology and Virology Unit of the University Hospital A.O.U. Città della Salute e della Scienza of Turin, Italy, between December 2021 and February 2023. Positive clinical or surveillance samples for *C. auris* belonging to patients admitted to the university ICU, were accounted in the present work. Only the first strain per patient was considered. Subsequently to diagnostic routine, the isolated *C. auris* strains were rendered irreversibly anonymous. The anonymization process was carried out in accordance with the procedure concerning the use of clinical data for scientific purposes and of biological samples stored in the laboratories for retrospective studies; successively the strains were stored at -80 °C.

2.1. *C. auris* Surveillance Protocol

All patients admitted to the ICU were screened weekly by standard surveillance cultures (urine culture, endotracheal aspirate, rectal swab) for multidrug-resistant bacteria detection. Following the first evidence of a *C. auris* positive urine culture during surveillance standard screening and

according to international available guidelines, a specific surveillance protocol has been developed and applied for all patients hospitalized in the ICU ward[15–19]. *C. auris* screening was performed weekly through a bilateral axillae and groins eSwab (Copan, Brescia, Italy) before patient hygiene nursing care. After samples collection, they were seeded on BD Sabouraud Agar with gentamicin and chloramphenicol (Becton Dickinson, Franklin Lakes, New Jersey, USA) and on chromogenic agar (Brilliance Candida Agar, Thermo Scientific, Waltham, Massachusetts, USA). Incubation was performed at 37 °C for 48 hours. Isolates yeasts were identified at species level using Microflex LT MALDI-TOF (Bruker Daltonics GmbH&Co.KG, Bremen, Germany) according to manufacturer's instructions.

2.2. IR-Biotyper Protocol for *C. auris* Typing

Stored *C. auris* strains were thawed and grown at 37 °C on BD Sabouraud Agar for 24 hours, and then subcultivated on the same medium for 24 +1 h for IR-BT measurements. Sample preparation was performed accordingly to manufacturer's instruction. Briefly, two highly filled 1 µl inoculation loop of yeast colonies were suspended in 50 µl of 70% ethanol solution in the suspension vials containing metal beads included in the IR-BT kit (Bruker Daltonics). The suspension was homogenized by vortexing for two minutes, and 50 µl of deionized water were added to reach the final volume (100 µl). After two minutes vortexing, 10 µl of the yeast suspension were spotted in five technical replicates on a silicon sample plate (Bruker Daltonics GmbH&Co.KG) and dried at room temperature. Two IR Tests Standards (Bruker Daltonics GmbH&Co.KG) were included in duplicate in each run. All samples were tested in triplicate (biological replicates) in three different days to overcome the biological variation carried out to cultural and IR-BT tests.

Spectra were acquired and analysed in transmission mode (spectral range: 4000-500 cm⁻¹) through OPUS v.8.2 and IR Biotyper Client v.4.0 software (Bruker Daltonics GmbH & Co. KG). The second-order derivative was calculated using the Savitzky-Golay algorithm on nine datapoints and spectra were vector normalized. The similarity analysis between spectra was carried out with a hierarchical clustering algorithm based on Euclidean single linkage. The above-mentioned software allowed constructing a distance matrix and a dendrogram, which gives a tree-like overview of the spectral relationship. Moreover, the unsupervised dimensionality reduction method Principal Component Analysis (PCA) and the supervised Linear Discriminant Analysis (LDA), which maximizes the inter-group variance and minimizes the intra-group variance, were performed to represent spectra as dots in the two-dimensional (2D) and three-dimensional (3D) scatter plots. Each strain was represented with an average spectrum derived from fifteen IR-BT measurements (five spectra, technical replicates, for three biological replicate).

In order to correctly interpret the local *C. auris* outbreak, a highly characterized strain, DSM 21092, belonging to DSMZ-German Collection of Microorganisms and Cell Cultures GmbH (Leibniz Institute, Germany) was included as external clustering control.

2.3. Statistical Approach to Define a Clustering Cut-Off for IR-Biotyper and *C. auris*

Starting from the distance matrix, intra-strain variation (span among technical and biological replicates of the same isolate) and inter-strain variation (span among technical and biological replicates of different isolates) were evaluated for each *C. auris* strain.

In order to define a *C. auris* clustering cut-off, intra- and inter-strain values, average, median, standard deviation, 5th percentile and 95th percentile were calculated and graphed. A 5% error was considered acceptable for clustering discrimination.

If the inter-isolate distance between two strains is included within the 95th percentile of the intra-isolate distances, the first strain is considered similar to the technical and biological replicates of other and therefore it could be defined clonal. Assuming this, the 95th percentile of intra-isolate distances was considered the lower cut-off to define a strain as part of the same cluster (minimum clustering cut-off). On the other hand, if the inter-isolate distance between two strains is under the 5th percentile of the inter-isolates distance between two distinct groups, the strains could be considered part of the same cluster. Therefore, the 5th percentile of inter-isolates distances between two clusters will be

considered as the higher cut-off to consider a strain as belonging to a different cluster (maximum clustering cut-off). The area between the lower and higher cut-off values will be defined as a grey zone of uncertain clustering result.

3. Results

During the considered period of 14 months, 56 positive cases of *C. auris* were identified in patients admitted in the ICU. The majority of *C. auris* positive samples (51/56; 91.1%) resulted from surveillance cultures from patients colonized at skin level (45; 80.4%), at the urinary (3; 5.4%) and respiratory tract (3; 5.4%). In 5 cases (8.9%) an invasive infection occurred, with *C. auris* isolation from blood cultures and intravascular catheter tip samples (Table 1).

Table 1. Colonized and infected *C. auris* patients in relationship to the different sample types.

Samples	Colonized patients (%)	Infected patients (%)
<i>Skin swab</i>	45 (80.4)	0 (0.0)
<i>Urine</i>	3 (5.4)	0 (0.0)
<i>Tracheal aspirate</i>	1 (1.8)	0 (0.0)
<i>Sputum</i>	1 (1.8)	0 (0.0)
<i>Bronchoalveolar lavage</i>	1 (1.8)	0 (0.0)
<i>Blood</i>	0 (0.0)	3 (5.4)
<i>Intravascular catheter tip</i>	0 (0.0)	2 (3.6)
Total	51 (91.1)	5 (8.9)

A total of 855 spectra was obtained by typing the 56 clinical strains of *C. auris* involved in the outbreak and the external control strain. Intra- and inter-isolate distances of the acquired spectra were analysed in order to obtain a reference clustering cut-off.

3.1. Analysis of Intra-Isolate and inter-Isolates Distances Values and Clustering Cut-Off Definition

Considering intra-isolate distances of each strain of *C. auris* under study, mean, median, minimum and maximum, standard deviation, 5th percentile and 95th percentile were calculated. The histogram of the frequencies of all intra-isolate distance values showed a Gaussian distribution with unimodal trend (Figure 3). The median, the 5th and 95th percentile were 0.080, 0.030 and 0.160, respectively. Intra-isolate distance values analysis is reported in detail in the Supplementary material.

Setting the 95th percentile value, 0.160, as the minimum clustering cut-off, two distinct clusters could be demonstrated by dendrogram and distance matrix analysis: the larger cluster, named Alfa, consisting of 52 (92.9%) strains strictly related to each other and the smaller one, Beta, formed by four (7.1%) similar strains. The third arm of the dendrogram was characterized by the external control spectra of *C. auris* interspersed between Alfa and Beta clusters (Figure 1).

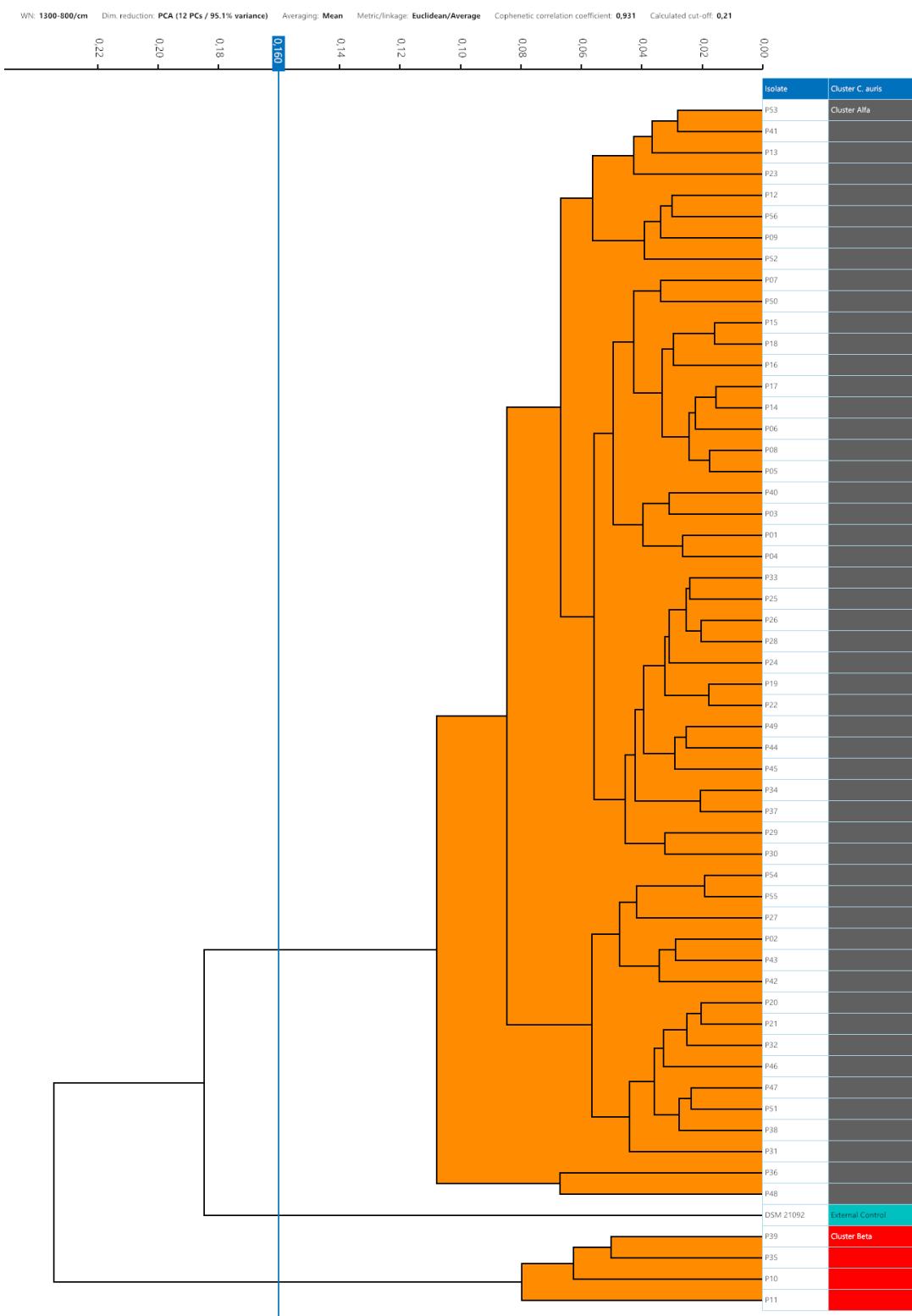


Figure 1. Dendrogram analysis of *C. auris* strains with 0.160 cut-off setting.

Considering the inter-isolates distances within the major cluster Alfa, the median, the 5th and 95th percentile were 0.107, 0.061 and 0.180, respectively. The inter-isolates distance distributions between strains belonging to the same cluster were consistently overlapping with each other and with the intra-strain distribution (Figure 3). However, as regards cluster Beta, due to the small number of isolates, the graphic distribution of inter-isolates distances was more irregular. Additional calculated variables and the intra-strains distribution are reported in Supplementary material.

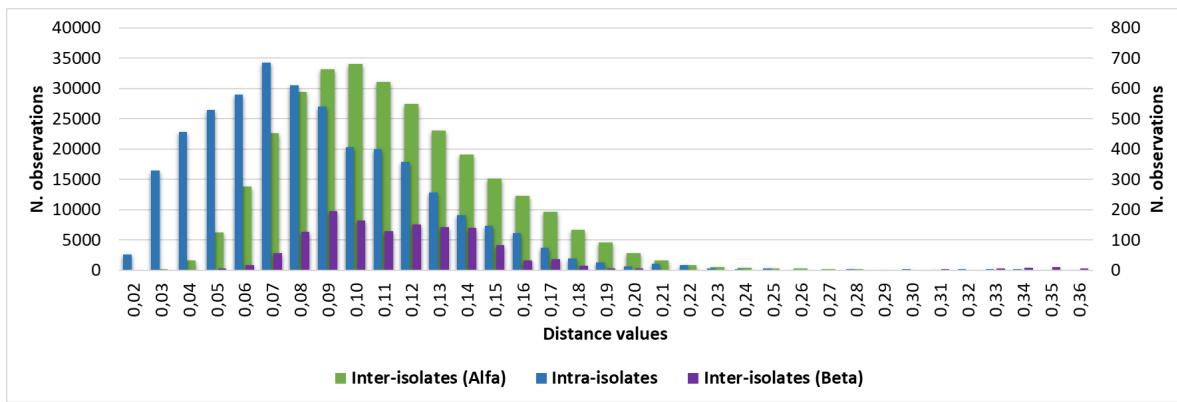


Figure 3. Intra-isolate and cluster Alfa and Beta inter-isolates distance values distribution.

Through the inter-isolates distances analysis between cluster Beta and Alfa, a Gaussian distribution of the distance values could be observed with median, 5th and 95th percentile values of 0.244, 0.160 and 0.354, respectively. Inter-isolates distance analysis and graphic representation are described in detail in the Supplementary material. A summary of the principal calculated distance values is reported in Table 2.

Table 2. Distance values median, 5th and 95th percentile in relationship to intra- or inter-strains analysis.

Distance values	N. strains	Median	5th percentile	95th percentile
<i>Intra-strain</i>	56	0.080	0.030	0.160
<i>Inter-strains</i>	56	0.115	0.062	0.266
<i>Inter-strains cluster Alfa</i>	52	0.107	0.061	0.180
<i>Inter-strains cluster Beta</i>	4	0.113	0.074	0.176
<i>Inter-strains cluster Beta vs Alfa</i>	56	0.244	0.160	0.354

The overlap between the 95th percentile of intra-isolate and the 5th percentile of the inter-cluster distribution could be observed in Table 2 and Figure 4.

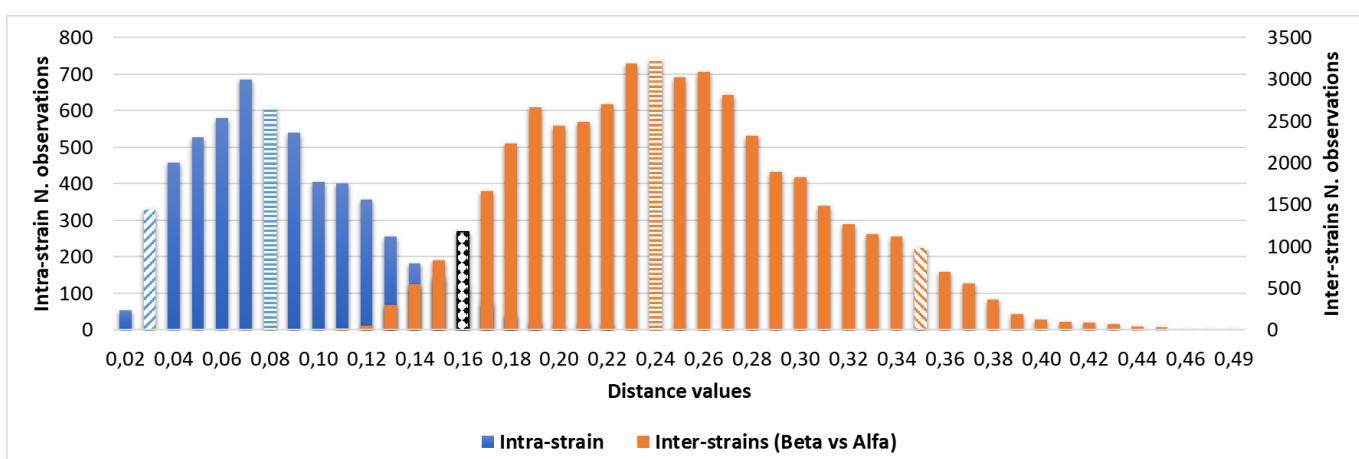


Figure 4. Comparison of intra-isolate and Cluster Beta vs Alfa inter-isolate distances and clustering cut-off. Median is highlighted by horizontal rows, 5th and 95th percentile by oblique lines, the overlapping minimum and maximum cut-offs, 0.160, is highlighted in black and white texture.

No grey zone could be observed between minimum and maximum clustering cut-off. Considering the external control position in the dendrogram representation, the cut-off values within which the external control could be considered independent from Alfa or Alfa and Beta clusters were <0.185 and <0.235 , respectively. According to 0.160 clustering cut-off, it was separated from both Alfa and Beta clusters.

All the obtained spectra were successively analysed by PCA and LDA analysis in 2D and 3D scatter plots. Acquired spectra clearly grouped separated from each other within the belonging cluster in both PCA and LDA analysis (Figures 5 and 6).

A subset analysis was conducted to investigate strains features in relationship with samples, antifungal profile, and time of isolation. No differences in clustering analysis were observed between invasive and colonizing strains, antifungal profile, or temporal series of admitted patients and related samples.

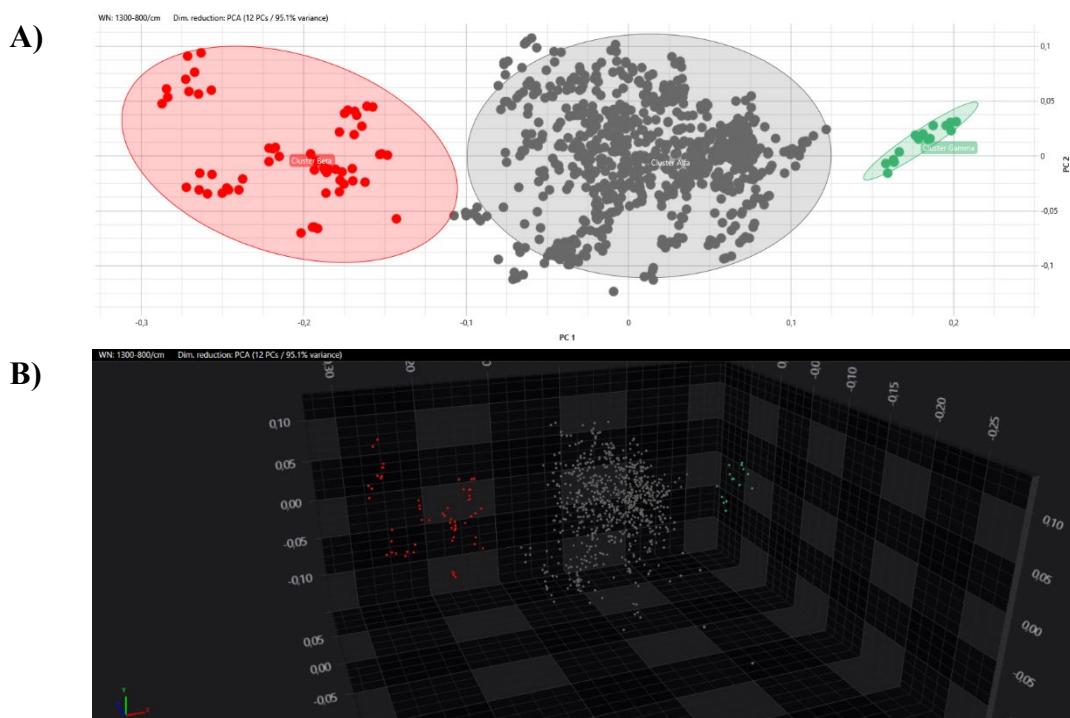
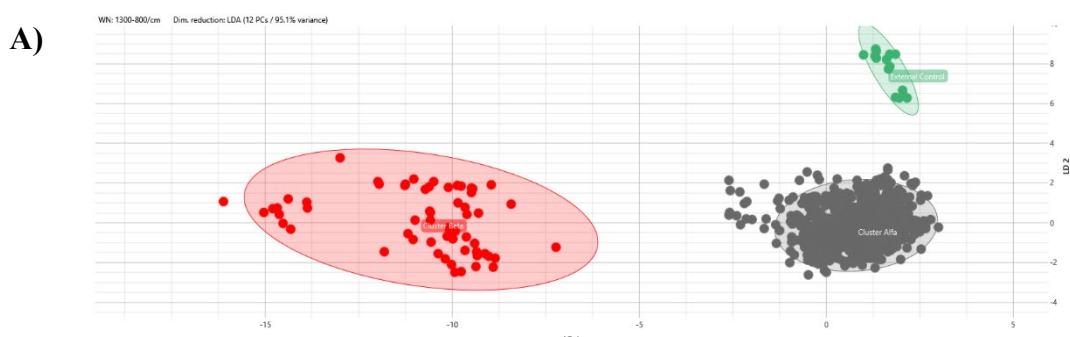


Figure 5. PCA analysis with 2D (A) and 3D (B) scatter plot representations: clusters are marked with different colours (grey, alfa; red, beta; green for the external control).



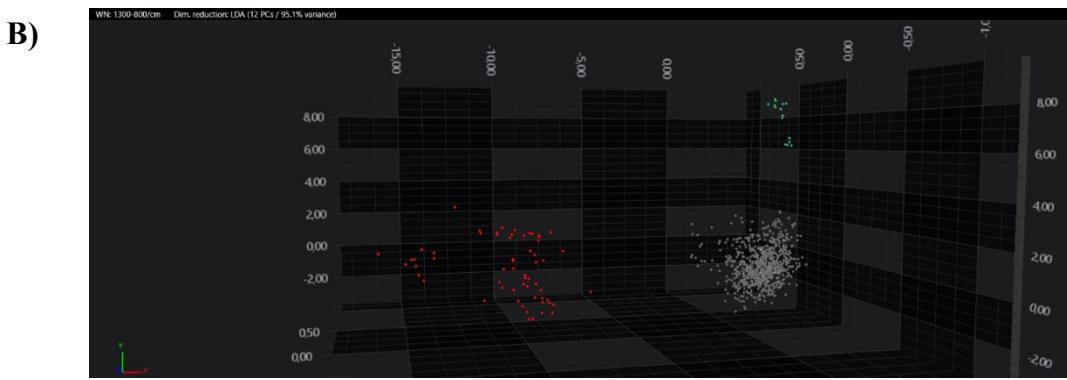


Figure 6. LDA analysis with 2D (n. X A) and 3D (n. X B) scatter plot representations: clusters are marked with different colours (grey, alfa; red, beta; green for the external control).

4. Discussion

In recent years, *C. auris* has emerged as a multi-resistant fungal pathogen, with a significant clinical and health impact and it has been recently reported as a critical issue in the WHO fungal priority list. Unique characteristic of this species is its ability to persist for a long time on the human skin and in hospital environments, resulting in the spread of this microorganism inside and through health networks [20]. It is therefore of strategic importance to apply correct disinfection guidelines and protocols for the eradication and containment of this microorganism [21]. Also its rapid and specific diagnosis, as well as the development of genotypical and phenotypic methods for typing, is pivotal in order to investigate with accuracy and speed the relationships between *C. auris* isolates involved in nosocomial outbreaks[22,23].

The main purpose of this study was the application of FT-IR spectroscopy to investigate the phylogenetic relationships between isolated strains within the local *C. auris* outbreak.

The first positive case for this emergent microorganism in the ICU ward led to the establishment of an extraordinary surveillance program aimed at identifying patients colonized/infected by *C. auris*. During the study period, an outbreak involving overall 56 patients was observed in the aforementioned ward. The phenomenon could be related to the high number of patients transferred from surrounding hospitals during the COVID-19 pandemic, as well as considerable access to transplant assessments and procedures of patients from other regions where *C. auris* had already been previously found [11]. Furthermore, the high clinical severity at admission, the notable invasiveness of treatment (major surgery, extracorporeal support, renal replacement treatment), the need for prolonged ICU length of stay and broad-spectrum antimicrobial therapies characterized the colonized population [11].

The innovative point of this study consisted in the definition of *C. auris* clustering cut-offs to discriminate between strains belonging or not to the same cluster.

Assuming that a strain could be considered as part of the same cluster if its inter-strain distance is within the intra-strain distance, the distance between each replicate spectra, the 95th percentile of intra-strain distance was used to define the minimum clustering cut-off with a 5% of accepted classification error. The strains analysed by IR-BT, with the stated 0.160 cut-off, were found to belong to a maximum of two distinct clusters: the major cluster, Alfa, consisting of 52 strains and comprising the index case, and the smaller Beta, consisting of the remaining 4 strains. Adopting this clustering cut-off, the external control was correctly positioned out from the Alfa and Beta clusters. Our minimum clustering cut-off is the result of the 56 *C. auris* strains' spectra evaluation, and it is independent from local epidemiology and clustering definition. For these reasons, the 0.160 cut-off value could be proposed as a robust and universal *C. auris* clustering cut-off whether the incubation and analysis protocol are respected.

The comparison between the intra- and inter-isolate distances of Alfa and Beta clusters shows a clear degree of distributions' overlapping, supporting the common clonal origin of all the strains belonging to the clusters. The slight shift to the right of the inter-isolate distribution can be explained

by the phenomenon of genetic drift due to the selective pressure to which *C. auris* is subjected in a hospital environment (e.g., use of antifungals, disinfectants, interactions with different hosts' microbiota and immune systems), which is reflected in phenotypic changes in fungal macromolecules production.

Having ascertained the legitimacy of the two clusters, we focused on the maximum clustering cut-off definition. The inter-strains distance values analysis between Beta and Alfa clusters was performed, assuming the 5th percentile of inter-isolates distance as the maximum clustering cut-off, with a 5% acceptance error. The inter-isolate distances distribution clearly shifted to the right in comparison to intra-strain distribution with only a small and partial overlap. The higher clustering cut-off was 0.160, coincident with the previous one, the minimum clustering cut-off. As validation of the proposed clustering cut-off, the value within which the external control could be considered independent from Alfa or Alfa and Beta clusters, in both dendrogram and distance matrix analysis, was correctly over the defined 0.160 cut-off (<0.185). Moreover, both PCA and LDA analysis clearly confirmed the analysis and the definition of Alfa and Beta clusters.

The application of IR-BT as typing tool for *Candida spp.* analysis was investigated in 3 studies up to now. Contreras et al. (2022), by applying a surveillance protocol to over 700 patients admitted to a third-level hospital in Los Angeles, identified 28 positive samples for *C. auris* within a year. IR-BT typing allowed to identify two clusters, the first consisting of 27 strains and the second consisting of one isolate. The WGS analysis confirmed this subdivision and allowed to classify the first cluster as belonging to the South African clade and the second as belonging to the South Asian one [24]. In the Vatanshenassan et al. (2020) study, 96 *C. auris* strains isolated from 14 geographical regions were analysed using 5 typing protocols (microsatellite analysis, sequencing of ITS regions, AFLP, MALDI-TOF, IR-BT). The results indicated microsatellite analysis as the preferred method for evaluating *C. auris* outbreaks. The greater consistency with this method was the sequencing of ITS regions (45% similarity), followed by typing by IR-BT (33% similarity). The analysis of microsatellites allowed to group the isolates in four clusters, corresponding to the four geographical clades (East Asia, South Asia, South Africa and South America), while typing by IR-BT has grouped the strains into two main clusters, independently by their geographical origin [2].

The study of De Carolis et al. (2023) conducted at the University Hospital A. Gemelli IRCCS in Rome analysed 59 strains of *Candida parapsilosis* using IR-BT and microsatellite analysis, observing a concordance between the two methods varying from 47% to 74%, in relation to the cut-off value used in IR-BT analysis (respectively 0.967 - 0.995) [25].

The agreement discrepancies between microsatellite and IR-BT analysis observed in the two previous studies are presumably due to two reasons: the first lies in the analysis of genetic regions responsible for fluconazole resistance, which contain different mutations depending on *C. auris* clade and which can be demonstrated exclusively by genotypic analysis, the second reason is the different clonal origin of *C. auris* strains tested in the study of Vatanshenassan et al. In light of these characteristics, the greater concordance between genotypic (microsatellites) and phenotypic (IR-BT) analysis found by De Carolis et al. appears to be linked to the common geographical origin of *Candida parapsilosis* strains analysed, presumably genetically related. This is also reflected in a lower rate of mutations responsible for resistance to fluconazole.

The common element of the three studies described above concerns the comparison between genetic analyses (WGS or microsatellites analysis) and IR-BT, in order to evaluate their discriminatory capacity for clustering analysis. On the contrary, in our study, for the first time, a new analytical approach was developed to define a clustering cut-off useful to classify new *C. auris* strains without the aid of genetic information. This data could help to overcome traditional typing techniques (WGS, pulsed-field gel electrophoresis - PGFE, MLST) weaknesses such as the access to these technologies, their costs and turn-around time, and the need for expert personnel, features not commonly available in Microbiology laboratories. IR-BT could be a viable alternative for clustering analysis because it is cheaper, faster and has high daily throughput. In addition, its ability to use the cell surface as a sort of "barcode" that can provide more information than PGFE and MLST confirms the robustness of the method for industrial and clinical-epidemiological applications[23,26–28].

5. Conclusions

In this study IR-BT was used to investigate the onset and spread of an outbreak of *C. auris* at the University Hospital Città della Salute e della Scienza of Turin, Italy. The application of IR-BT based on FT-IR technology has allowed to obtain important information about the phylogenetic relationships between the analysed strains and to define for the first time a clustering cut-off with a “not WGS-based” statistical-mathematical approach, in order to correctly classify *C. auris* strains as belonging or not to the same cluster. The potential impact of this technology in the management of patients is pivotal not only for infection control policies but also for clinical application. The availability of information about *C. auris* circulating strains combined with their antifungal profile and virulence, such as their colonizing vs. invasive behaviour, could bring to important changes in patients’ therapeutic management.

Future perspectives will include the results confirmation by WGS genotyping and the typing of new strains of *C. auris*, in order to test and validate the robustness of the calculated cut-off. A high agreement between the two methods will allow the use of IR-BT as a valid alternative to molecular methods due to its easy to use, its fast turnaround time, its user-friendly interface and its low costs.

Supplementary Materials: The following supporting information can be downloaded at the website of this paper posted on Preprints.org

Author contributions: AC and LP: Conceptualization, Data Curation, Validation, Methodology and Writing - Original Draft; AC, CC, MC: Resources; AB, GP, MG, CP, LC: Investigation; LP, AC, PB and MC: Formal analysis; AC and PB: Visualization; AB, NM, SC, GM, GP and CP: Writing - review & editing; GM, LB and CC: Supervision. All authors contributed to the final version of the manuscript and approved it for publication.

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