

# STUDY OF PROTOZOA POPULATION IN WASTEWATER TREATMENT PLANTS BY IMAGE ANALYSIS

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*(Received: October 5, 2000; Accepted: January 15, 2001)*

**Abstract** - Protozoa are important microorganisms taking part to the ecosystem balance in wastewater treatment plants. A procedure for their semi-automated identification and counting based on image analysis is proposed. The main difficulty is the segmentation of the protozoa as most of them are in contact with the sludge. The protozoa are characterized by the size of their silhouette (area and length) and three shape factors (elongation, circularity and eccentricity). They are identified after projecting the resulting 5D space into a 3D space of principal components. The rate of automated identification is actually higher than 50% for some of the species commonly found in activated sludge.

Keywords: Protozoa, wastewater treatment, image analysis.

## INTRODUCTION

The efficiency of wastewater treatment plants by activated sludge is linked to the bacterial population but also to the protozoa (Nicolau et al., 1997). Different species can be found and have been listed by various authors: Curds and Cockburn (1970a), Martin-Cereceda et al. (1996), Richard (1991), Sasahara et Ogawa (1983), etc. Under normal conditions their concentrations are larger than  $10^6$  protozoa/L.  $10^7$  protozoa/L corresponds to a very good pollution abatement. On the contrary concentrations lower than  $10^5$  protozoa /L are indicative of the low efficiency of the plant (Drakides, 1978). In terms of biomass, protozoa represent between 0.17 and 0.44% of the sludge during the colonization phase but can represent up to 9% at steady-state (Madoni, 1994a). Curds and

Cockburn (1970b) established relationships between the abundance of some species and the sludge loading: they have associated them to the quality of the effluent depending upon the biological oxygen demand (BOD). Table 1 summarizes the predominant groups of protozoa in function of the organic loading. These protozoa have an important role in maintaining a good balance in the biological ecosystem: they eliminate the bacteria in excess and stimulate their growth and they promote flocculation (Gerardi et al., 1995). By consuming the free bacteria they help to decrease the effluent turbidity as well as its BOD and its suspended matter content (Curds et al., 1968).

Most of the protozoa found in the sludge are ciliated and they can be classified in four main groups: free-swimming, crawling, attached and carnivorous. Table 2 shows that the predominance of one group or another can be an indicator of the

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efficiency of a wastewater treatment plant using activated sludge. Several authors have applied statistical methods to express the relationships between the protozoa and the operational conditions of the plants. Martin-Cereceda et al. (1996) used a partial correlation analysis to examine the protozoa of ten wastewater treatment plants at Madrid (Spain) and established relationships between the protozoa and the plant efficiency (effluent quality and settleability). Using principal component analysis (PCA) with Varimax rotation, Genoveva et al. (1991) expressed 73% of the process variability in terms of six principal components: the first of these components explains 25% of the variability and takes in account the ciliates.

The protozoa identification and counting needed for the studies previously mentioned has been done

manually: this is a very tedious task for an expert. Amaral et al. (1999) developed a procedure for the semi-automated recognition of protozoa by image analysis. The image analysis section, called ProtoRec V0, is embedded into a Visilog™ 5.1 environment (Noésis, Les Ulis, France). The results (size and shape descriptors) are later analyzed by a multivariate method (PCA) for the identification of the protozoa from a database. This procedure was validated on samples regularly taken on a full-scale municipal wastewater treatment plant over a summer period of two months (June and July 1998). However, since that date, other species have been noticed in the samples and the amount of filamentous bacteria has increased drastically, which causes problems in the image treatment. Here a new version is developed to cover of the filamentous bacteria and to increase the size of the database.

**Table 1: Predominant protozoa groups in function of organic loading [from Richard (1991)]**

Conditions	Predominant groups
Low organic loading	Stalked ciliates, rotifers and higher invertebrates, especially nematodes.
Optimum organic loading	Good diversity of organisms, dominated by free-swimming and stalked ciliates.
High organic load	Flagellates, amoebae, and small, free-swimming ciliates

**Table 2: Some relations between protozoa and plant efficiency [from Madoni(1994b)]**

Predominant group	Efficiency	Possible cause
Small flagellates	very low	Bad oxygenation of the sludge, loading that is too high, presence of fermenting substances
Small swimming ciliates (< 50 µm)	low	Contact time too short; low oxygenation of the sludge
Large swimming ciliates (> 50 µm)	low	Loading that is too high
Crawling ciliates	good	
Crawling + attached ciliates	good	
Attached ciliates	decreasing	Unsteady state (discontinuous feeding, sludge wastage)
Small amoebae (with and without flagellum)	very low	Loading that is too high, not easily biodegradable
Amoebae with shell	good	Low loading, diluted mixed liquor, good nitrification

## MATERIALS AND METHODS

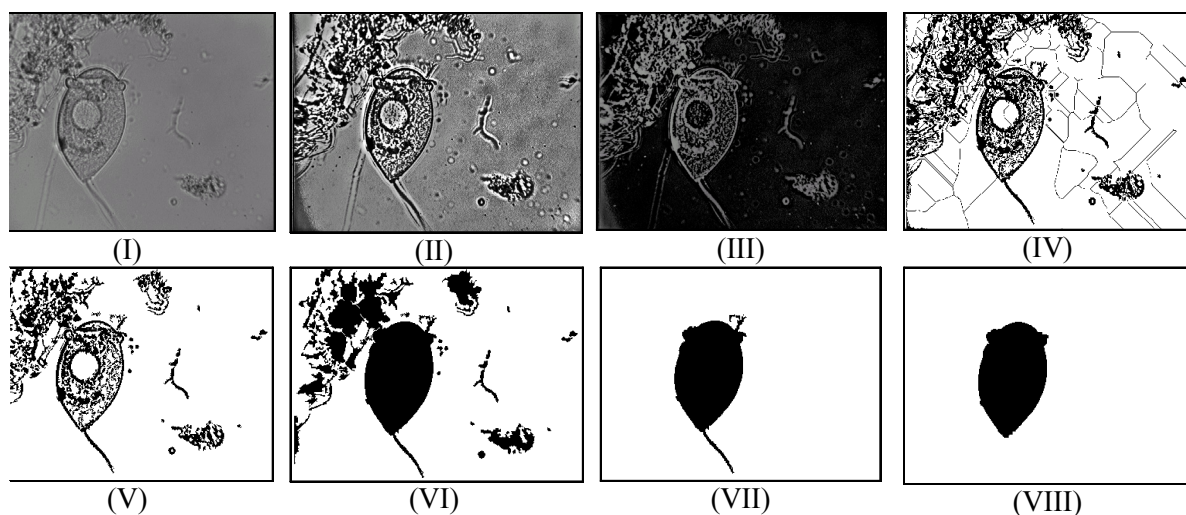
### Sampling and Image Grabbing

Sludge samples are regularly taken on the wastewater treatment plant of Nancy-Maxéville (350 000 PE). The delay between the sampling and image grabbing is about 30 min. The image grabbing system is based on a optical microscope (Leitz Dialux 20) and a monochrome video camera (Hitachi CCTV) connected to a PC via a Matrox Meteor board. A mixed liquor drop is deposited on a glass slide and carefully covered with a slip to avoid any mechanical stress on the microorganisms. For most images a 400x magnification (normal illumination) is used, except in the case of sets of protozoa

(*Opercularia* for instance) or large rotifers, where a x250 magnification was needed. For each sample 50 images of live protozoa are grabbed by a systematic examination of the slide.

### Image treatment

The procedure is called ProtoRec V1 and it is implemented in Visilog<sup>TM</sup>5.1: its aim is the calculation of size and shape parameters describing the silhouette of the protozoa. The gray-level image is pre-treated to enhance the contours of the protozoa and is segmented. This is a key step as many protozoa are contact with the flocs and validation by the operator is requested at some points of the procedure. The main steps are presented in Figure 1



- (I) Initial image with a x400 magnification (light power = 1V).
- (II) Contour enhancement by histogram local equalization (Russ, 1991)
- (III) Background suppression by opening (2 iterations) and closing (55 iterations) to remove the halo (Coster and Chermant, 1989).
- (IV) Semi-automated segmentation based on the Euclidian Distance Map (Russ, 1991).
- (V) When the protozoan is not in contact with the frame, part of the flocs is eliminated by a border-killing routine. The protozoan contour is closed by openings.
- (VI) Hole-filling of the silhouette and semi-automated segmentation based on the Euclidian Distance Map.
- (VII) Elimination of flocs by a series of erosion and reconstruction of the protozoa silhouette. If flocs are larger than protozoa, they are isolated and discarded by a logical subtraction.
- (VIII) Localization of flagella and stalk.

**Figure 1:** Main steps of ProtoRec V.1

## Measurements

The protozoa are characterized by their size (projected surface,  $A$ , and length,  $L$ , given by the maximal Feret diameter,  $F_{max}$ ) and shape descriptors: elongation,  $FS$ , circularity,  $C$  and eccentricity,  $E$ , calculated from the second-order moments ( $M_{2x}$ ,  $M_{2y}$  and  $M_{2xy}$ ):

$$FS = F_{max} / F_{min} \quad (1)$$

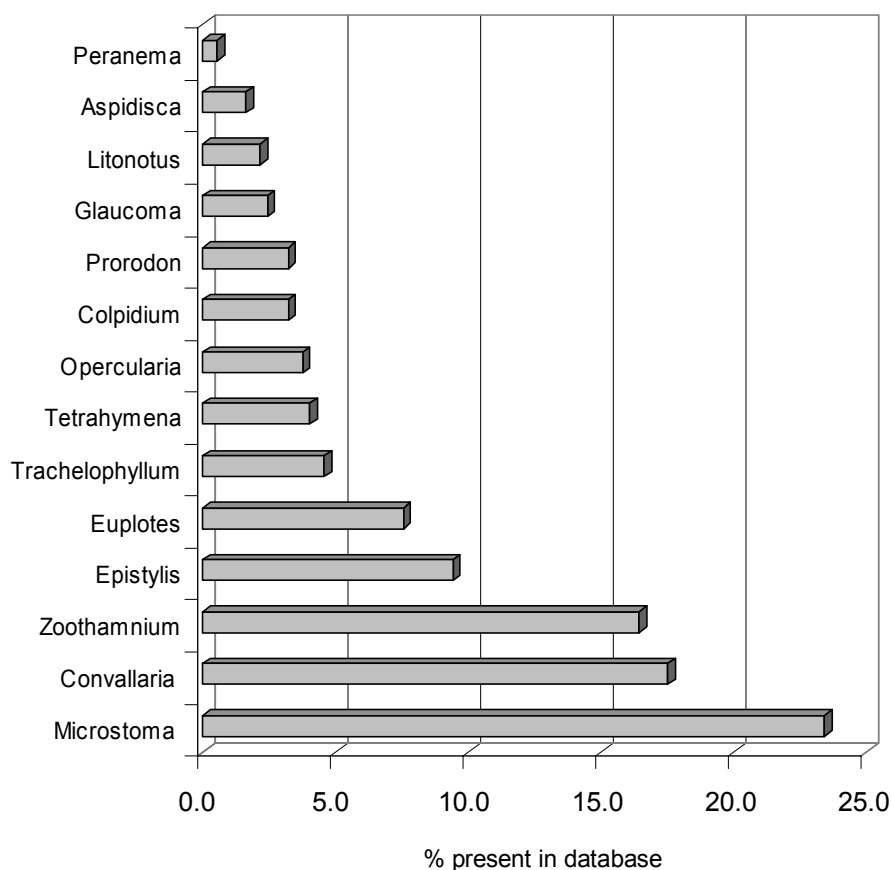
$$C = P^2 / (4\pi A) \quad (2)$$

where  $P$  is the perimeter of the silhouette

$$E = \frac{(4\pi)^2 (M_{2x} - M_{2y})^2 + 4M_{2xy}^2}{A^2} \quad (3)$$

The presence of a flagellum or a stalk is helpful in the identification step, but it is not always possible to obtain complete protozoa (with flagella or stalk).

Figure 2 gives the percentage of each species present in the database. From the total population of protozoa a training set has been defined, with protozoa identified by an expert (Jahn et al., 1979; Madoni, 1994b). A principal component analysis (PCA) (Xlstat™, T. Fahmy, Paris, France) is run on the training data set, which contains several individuals of 14 protozoa species, to take into account the variability within each species (Einax et al., 1997).



**Figure 2:** Percentage of the various species of protozoa present in the database

## RESULTS

Table 3 gives the eigenvalues obtained from the correlation matrix. The first two principal components,  $f_1$  and  $f_2$ , explain 79% of the variability of the training data set. With three components,  $f_1$ ,  $f_2$  and  $f_3$ , 95% of the variability can be explained. No larger improvement is obtained by addition of another component.

The correlation circle (Figure 3) summarizes the relationships between the variables. They are relatively well distributed, indicating that these descriptors can really help to discriminate between the species. As seen in Table 4,  $L$ ,  $E$  and  $C$  have a strong effect on  $f_1$ ,  $A$  on  $f_2$  and  $FS$  on  $f_3$ .

Equations 4 to 6 give the relationships between the co-ordinates in the principal component space ( $Co_i^j$ ) for each protozoa species  $i$  along the axis  $j$ .

$$Co_i^1 = 0.5505 \frac{E_i - \mu_E}{\sigma_E} + 0.3174 \frac{FS_i - \mu_{FS}}{\sigma_{FS}} + 0.5754 \frac{C_i - \mu_C}{\sigma_C} + 0.1193 \frac{A_i - \mu_A}{\sigma_A} + 0.5009 \frac{L_i - \mu_L}{\sigma_L} \quad (4)$$

$$Co_i^2 = -0.2928 \frac{E_i - \mu_E}{\sigma_E} - 0.3335 \frac{FS_i - \mu_{FS}}{\sigma_{FS}} - 0.1063 \frac{C_i - \mu_C}{\sigma_C} + 0.7517 \frac{A_i - \mu_A}{\sigma_A} + 0.4761 \frac{L_i - \mu_L}{\sigma_L} \quad (5)$$

$$Co_i^3 = -0.1573 \frac{E_i - \mu_E}{\sigma_E} + 0.8698 \frac{FS_i - \mu_{FS}}{\sigma_{FS}} - 0.3644 \frac{C_i - \mu_C}{\sigma_C} + 0.2916 \frac{A_i - \mu_A}{\sigma_A} - 0.0292 \frac{L_i - \mu_L}{\sigma_L} \quad (6)$$

where  $\mu_i$  is the mean value taken by parameter  $i$  for the whole set of protozoa and  $\sigma_i$  the corresponding standard deviation.

In Figure 4 the average position of each species has been plotted in the 3D space of the principal components. It can be seen that *V. microstoma* without stalk, *Aspidisca* and *Colpidium* are very close one to another. *V. microstoma* can be isolated when its stalk is considered. The same improvement can be obtained for *V. convalaria* and *Opercularia*: the stalk makes the identification easier.

The location of each species and the standard deviation due to the variability within each species are given in Table 5. Flagella and stalks increase the standard deviations as they can have various positions, but they nevertheless improve identification as the average positions differ considerably, depending on whether or not the stalk is considered. The recognition rate doubles when the stalk can be taken into account. *Peranema* exhibits very large standard deviations along the three axes due to its small size, its flagellum and its mobility.

Figure 5 gives the percentage of each protozoa present, imaged during one week and identified by the operator. Some species have not been included in

the database yet and about 22% of the protozoa could not be clearly identified. The semi-automated recognition is applied only to the protozoa previously identified by the expert. The protozoa coordinates in the PCA space are computed using equations 4 to 6: the distance of each protozoa to the characteristic position of each species, as given in Table 5, is calculated. The protozoa is assigned to the species for which the distance is minimal. The results obtained by the automated classification have been compared with those found by the operator. Figure 6 gives the rate of successful recognition for the species included in the database.

The rate is larger than 50% for *Zoothamnium*, *Microstoma* and *Convallaria*, that are relatively abundant in the population, as well as for *Trachelophyllum* and *Tetrahymena*. Some species are particularly difficult to recognize: *Peranema*, *Chilodonella* and *Aspidisca* (Figure 7a and b). *Peranema* and *Chilodonella* are new species that have recently been introduced in the database and the limited number of individuals could be a reason for the bad rate of recognition. *Aspidisca* is a small protozoa which is often over the sludge flocs (Figure 7c and d).

**Table 3: Eigenvalues and degree of explanation of the variability**

Factor	$f_1$	$f_2$	$f_3$	$f_4$	$f_5$
Eigenvalues	2.4313	1.5397	0.7637	0.1922	0.0731
% variability	0.4863	0.3079	0.1527	0.0384	0.0146
% total variability	0.4863	0.7942	0.9469	0.9854	1.0000

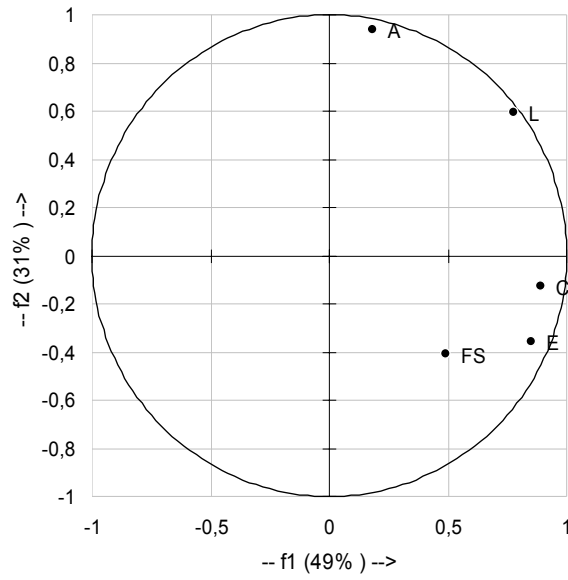


Figure 3: Correlation circle

Table 4: Relationships between the protozoa descriptors and the factors

	$f_1$	$f_2$	$f_3$	$f_4$	$f_5$
<i>E</i>	0.8584	-0.3633	-0.1375	0.3348	-0.0155
<i>FS</i>	0.4949	-0.4138	0.7601	-0.0777	0.0007
<i>C</i>	0.8971	-0.1319	-0.3184	-0.2475	-0.1228
<i>A</i> ( $\mu\text{m}^2$ )	0.1860	0.9328	0.2548	0.0974	-0.1447
<i>L</i> ( $\mu\text{m}$ )	0.7811	0.5908	-0.0255	-0.0576	0.1920

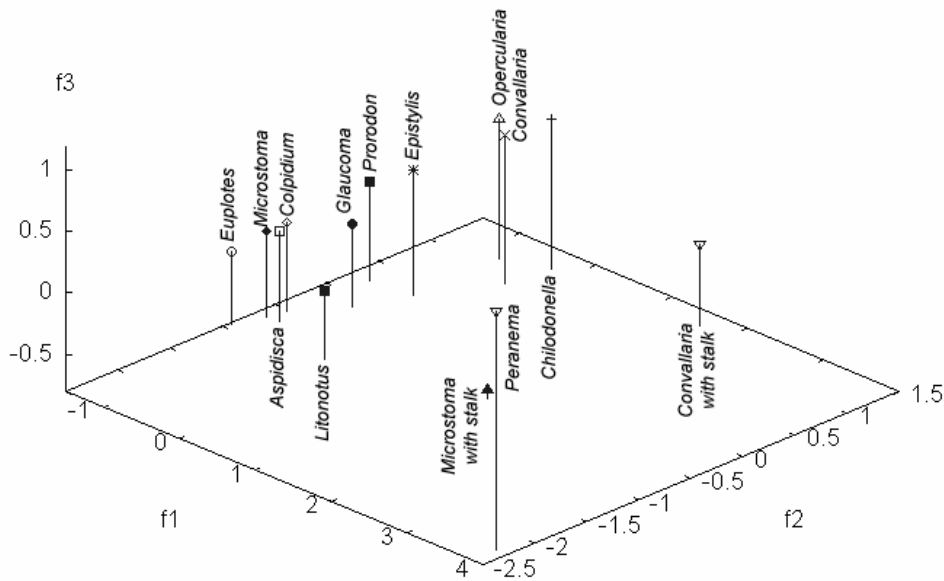
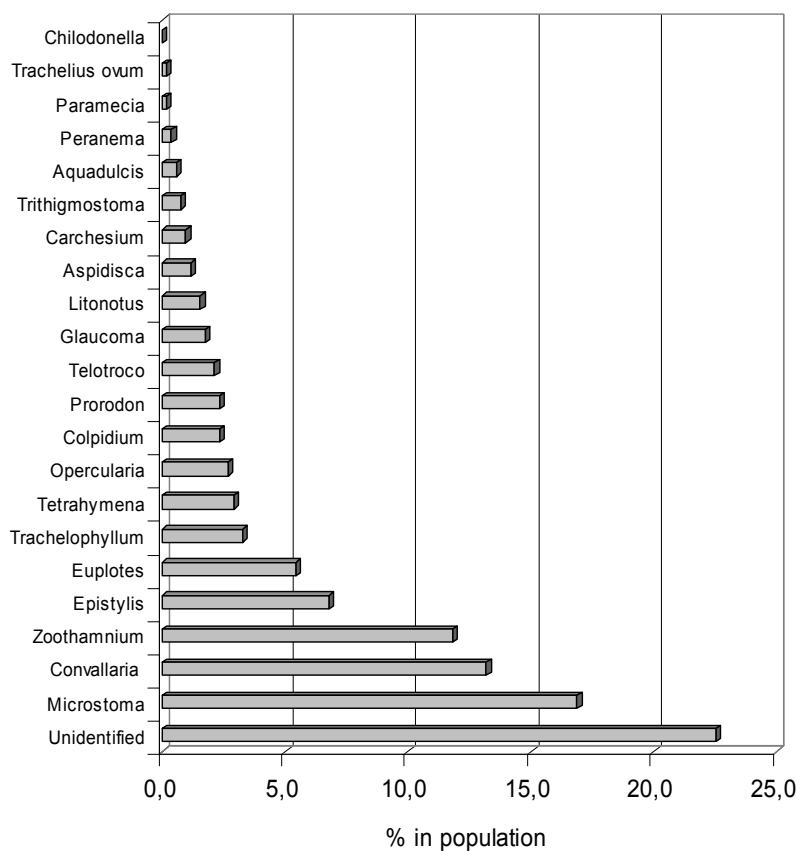
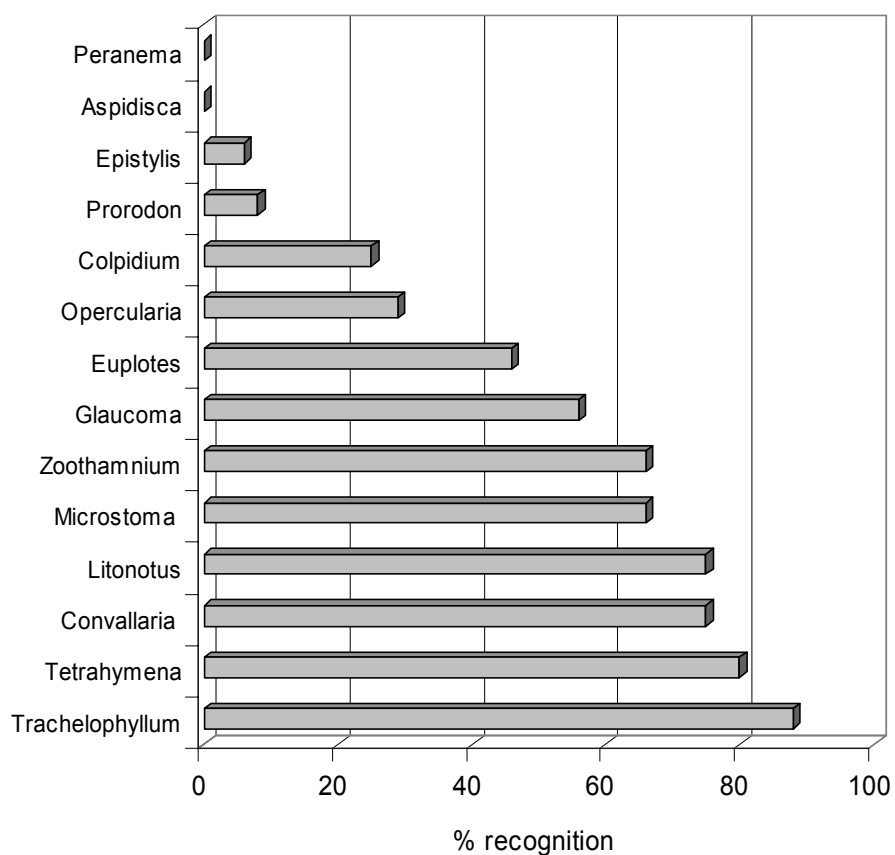


Figure 4: 3D representation of the protozoa species in the PCA space

**Table 5: Co-ordinates of each species**

	Co-ordinates			Standard deviation		
	$f_1$	$f_2$	$f_3$	$f_1$	$f_2$	$f_3$
<i>Aspidisca</i>	-1.2904	-0.5251	-0.0740	0.3168	0.4242	0.2195
<i>Chilodonella</i>	-0.2118	1.2213	0.4328	0.3624	0.9778	0.5079
<i>Colpidium</i>	-1.1743	-0.6862	-0.0487	0.4035	0.4267	0.2402
<i>Convallaria</i>	-0.2915	0.8309	0.4175	0.4314	0.7395	0.4025
<i>Convallaria</i> with stalk	1.6609	1.2828	-0.1251	0.9637	1.1552	0.9238
<i>Epystilis</i>	-0.7034	0.2515	0.2306	0.6765	0.8059	0.3400
<i>Euplotes</i>	-1.4499	-0.9487	-0.1968	0.3100	0.1895	0.2102
<i>Glaucoma</i>	-0.9144	-0.1706	-0.1048	0.2509	0.1597	0.2389
<i>Litonotus</i>	-0.2705	-0.9075	-0.2256	0.4187	0.3519	0.3911
<i>Microstoma</i>	-1.3307	-0.6904	-0.0877	0.3396	0.2893	0.2560
<i>Microstoma</i> with stalk	1.4275	-0.5740	-0.7155	1.5784	0.6795	0.9681
<i>Opercularia</i>	-0.7166	1.0979	0.3463	0.5036	1.1535	0.3513
<i>Peranema</i>	3.8829	-2.2854	1.1603	2.1699	1.9153	3.0906
<i>Prorodon</i>	-1.2318	0.2190	0.0161	0.3301	0.6311	0.1863
<i>Tetrahymena</i>	-1.4831	-1.3282	-0.0744	0.3781	0.2412	0.2787
<i>Trachelophyllum</i>	-0.6888	-1.6834	-0.1077	0.2714	0.2357	0.5554
<i>Zoothamnium</i>	-0.5211	0.4129	0.3143	0.5645	0.5934	0.3925
<i>Zoothamnium</i> with stalk	0.9939	1.2534	-0.1183	0.7393	0.6112	0.4754

**Figure 5:** Distribution of protozoa collected over a one-week period.



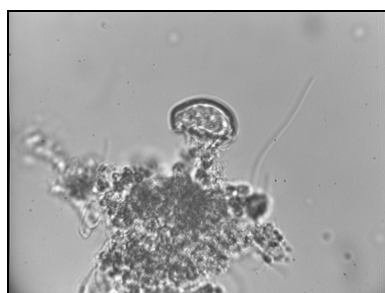
**Figure 6:** Rate of automated recognition in function of the protozoa species



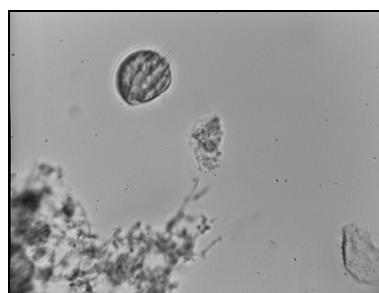
(a) *Peranema*



(b) *Chilodonella*



(c) *Aspidisca* grazing



(d) *Aspidisca* swimming

**Figure 7:** Some examples of protozoa for which automated identification is difficult



## CONCLUSIONS

Protozoa are known to be an important indicator of the efficiency of wastewater treatment plant. However, their manual identification and counting is a tedious task. A procedure was developed to perform these tasks semi-automatically. Segmentation of the protozoa from the sludge flocs is a key step in the image treatment, which cannot be fully automated at this point. Identification is based on size and shape descriptors of the protozoa silhouette. A database of several individuals belonging to 14 protozoa species was built. A multivariate analysis of the descriptors is used for the identification of the protozoa.

Although the procedure needs improvements, the initial results are promising. Further work is currently being conducted to improve the method of segmentation of the images and identification by introducing new shape descriptors to characterize the silhouette of the protozoa. In parallel the database is being gradually enlarged by addition of new protozoa and introduction of metazoa such as nematodes.

## ACKNOWLEDGEMENTS

The authors are thankful to the National Council of Scientific and Technological Development of Brazil (CNPq), the Embassy of France in Portugal and ICCTI.

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