- 1 Identification of groundwater pollution sources in a landfill site using artificial
- 2 sweeteners, multivariate analysis and transport modeling

- 4 Gennaro A. Stefania<sup>1</sup>, Marco Rotiroti<sup>1</sup>\*, Ignaz J. Buerge<sup>2</sup>, Chiara Zanotti<sup>1</sup>, Veronica
- 5 Nava<sup>1</sup>, Barbara Leoni<sup>1</sup>, Letizia Fumagalli<sup>1</sup>, Tullia Bonomi<sup>1</sup>

6

- <sup>1</sup>Department of Earth and Environmental Sciences, University of Milano-Bicocca,
- 8 Piazza della Scienza 1, 20126 Milan, Italy.
- <sup>2</sup>Plant Protection Chemistry, Swiss Federal Research Station (Agroscope), CH-8820
- 10 Wädenswil, Switzerland.
- \*corresponding author, email: <a href="marco.rotiroti@unimib.it">marco.rotiroti@unimib.it</a>, Department of Earth and
- 12 Environmental Sciences, University of Milano-Bicocca, Piazza della Scienza 1, 20126
- 13 Milan, Italy.

14

15 Waste Management 95 (2019) 116–128. https://doi.org/10.1016/j.wasman.2019.06.010

16

17

### Abstract

- In this study, sources of groundwater pollution in a landfill site were identified, using
- 19 artificial sweeteners as chemical tracers, multivariate statistical analysis and a
- 20 quantitative analysis of the groundwater flow system through particle tracking and
- 21 transport modeling. The study area, located in northern Italy, hosts an older unlined
- 22 landfill and a newer lined municipal solid waste landfill placed downstream of the
- 23 former. Groundwater, surface water, treated wastewater, and leachate samples were

collected in March 2017 for analysis of the artificial sweeteners saccharin, cyclamate, acesulfame and sucralose together with major cations and anions, inorganic nitrogen compounds, total phosphorus, COD and some further parameters. The interpretation of the results suggests that two main leachate leaks/spills are affecting the study area. The first one concerns leachate probably spilling out of the leachate collection system serving the younger lined landfill, the other one involves leachate from the older unlined landfill that also seems to affect an area downstream of the lined landfill. Direct leachate leaks from the lined landfill seem unlikely, although they cannot be definitively excluded.

This work underlines the importance of a multi-methods approach, which integrates here chemical tracers, multivariate analysis and transport modeling, for assessing groundwater pollution sources generated from complex landfill sites, where multiple and different sources may exist. In particular, this work highlights how artificial sweeteners can be used for tracing leachate plumes from landfills. The methodology applied in this study can have a broad applicability also in other polluted landfill sites worldwide.

**Keywords**: groundwater quality, leachate pollution, environmental tracers, cluster analysis, factor analysis, particle tracking.

## 1. Introduction

During the last decades, industrialization and population growth brought, as a side effect, an increase of the amount of wastes produced. The impact of landfills on the environment and human health is a concern for environmental managers and citizens worldwide (Asase et al., 2009; Assamoi and Lawryshyn, 2012; Fatta et al., 1999).

- 49 Groundwater pollution caused by leaks from landfills is frequently reported in literature
- 50 (de Medeiros Engelmann et al., 2017; Giusti, 2009; Laner et al., 2012; Mor et al., 2006;
- Nigro et al., 2017; Öman and Junestedt, 2008; Srivastava and Ramanathan, 2008).
- 52 Accordingly, landfill leachate represents one of the most critical threats for groundwater
- 53 quality, since it can contain a wide range of pollutants (Christensen et al., 2001; Mor et
- 54 al., 2006).
- In the past, unlined landfills were widely used with the undesirable consequence of
- leachate infiltration into groundwater (Reyes-López et al., 2008). In response, to better
- 57 protect environmental resources, many countries (e.g. member states of EU) imposed
- requirements to build landfills with lined systems at their bottom and collection systems
- 59 to recover and treat the landfill leachate (e.g. the Landfill Directive; EC, 1999).
- 60 Unfortunately, these systems may fail over time with negative effects on groundwater
- 61 quality (Lee and Jones, 1994; Sizirici and Tansel, 2015).
- In order to assess the impact of landfills on groundwater, various methods can be used,
- such as the analysis of major ions (Han et al., 2013), emerging tracers (Clarke et al.,
- 64 2015), or stable isotopes (Castañeda et al., 2012; Nigro et al., 2017), microbiological
- analyses (Preziosi et al., 2019), multivariate statistical analysis of hydrochemical data
- 66 (de Medeiros Engelmann et al., 2017; Kim et al., 2012; Rapti-Caputo and Vaccaro,
- 67 2006; Singh et al., 2008) and transport modeling (Christensen et al., 1998; Cozzarelli et
- 68 al., 2011; Han et al., 2013; Van Breukelen et al., 2003).
- 69 The topic of the identification of groundwater pollution sources is a complex and
- 70 critical issue. For instance, in most urban environments, new lined landfills have been
- 71 built in areas already covered by older unlined landfills, making the proper
- 72 identification and apportionment of pollution sources challenging. An inadequate
- knowledge of pollution sources affecting a site would lead to inefficient remediation

strategies or complex legal disputes. The identification of groundwater pollution sources, including their extent, locations and dynamics, plays a key role in the management and remediation of polluted sites (Ayvaz, 2010). Various techniques and methods for identifying groundwater pollution sources are reported in literature, based on multivariate statistical analysis (Tariq et al., 2008), isotopic analysis (Alberti et al., 2017; Grimmeisen et al., 2017) and transport modeling (Ayvaz, 2010). However, a multi-methods approach which integrates various investigative techniques is lesscommonly used, likely due to the higher costs associated with the analysis of multiple parameters, the implementation of various tools and the fact that different expertise is required. Artificial sweeteners can be used to trace leachate pollution from municipal solid waste (MSW) landfills (Roy et al., 2014). They may also support the identification of leachate sources. Artificial sweeteners were used in the last decades worldwide as sugar substitutes in beverages, food, drugs and personal care products (Lange et al., 2012), consequently, they can be found also in wastewater (Buerge et al., 2009; Van Stempvoort et al., 2011) and domestic wastes (Clarke et al., 2015; Roy et al., 2014). They can be considered as new emerging tracers of human impacts on water resources (Lange et al., 2012). Buerge et al. (2009) showed that artificial sweeteners, in particular acesulfame, are good markers of domestic wastewater. Furthermore, the sweetener saccharin may also end up in soil via manure after its use as an additive in piglet feed. Saccharin is a soil metabolite of certain sulfonylurea herbicides, and may thus eventually be leached into groundwater (Buerge et al., 2011). Artificial sweeteners contained in solid and liquid wastes (e.g. food wastes) were found in landfill leachate (Clarke et al., 2015; Roy et al., 2014; Van Stempvoort et al., 2011), they can thus be used as tracers of leachate leaks/spills in groundwater. Artificial sweeteners were

74

75

76

77

78

79

80

81

82

83

84

85

86

87

88

89

90

91

92

93

94

95

96

97

introduced onto the market in different years, and their analysis may thus allow to distinguish leachate plumes originating from landfills with different age. To this end, Roy et al. (2014) proposed the use of saccharin (SAC), cyclamate (CYC), acesulfame (ACE) and sucralose (SUC) that, in European countries, were approved in 1977, 1984, 1984 and 2000, respectively (Mortensen, 2006).

The present study involves the investigation of a landfill site with groundwater that is affected by leachate pollution and the identification of its sources. This site, located in northern Italy, hosts an older unlined landfill and a newer lined MSW landfill, thus making the assessment of pollution sources a challenging task. A preliminary hydrochemical characterization of the area (Stefania et al., 2018a, 2019) showed that the old unlined landfill likely affects groundwater quality, however, other unknown sources have to be considered as well, and properly identified to address remediation strategies.

The main aim of this work is to identify the sources of leachate pollution affecting the study area using a multi-methods approach, which integrates the use of artificial sweeteners as tracers with standard hydrochemical measurements, multivariate statistical analysis and transport modeling. More specifically, this methodology involved: a) an initial overall groundwater quality classification, made by cluster analysis of artificial sweeteners together with the other hydrochemical data; b) the pollution sources identification, done by the interpretation of artificial sweeteners, in particular ACE, factor analysis and groundwater particle tracking and transport modeling.

### 2. Materials and methods

## 2.1 Study area

121

122

123 The study area is located in an Alpine valley in northern Italy (Fig. 1a), more precisely, in an alluvial plain close to the town of Aosta (Aosta Valley Region). This plain has a 124 length of ~13 km from west to east and its average width is ~2 km (Fig. 1b). It is made 125 126 up of an unconfined aquifer composed of alluvial, fluvioglacial and lacustrine deposits. 127 The texture of aquifer sediments ranges from coarse to medium (i.e. gravels to sands) 128 with local and discontinuous silty layers. A deeper confined aquifer, not exploited by 129 water wells, is found below the unconfined aquifer (Stefania et al. 2018b). These two 130 aquifer units are separated by a lacustrine silty aquitard. A schematic of the aquifer 131 system is represented by the cross-section in Fig. 1c. The thickness of the unconfined 132 aquifer ranges from 20 to 90 m. The lacustrine silty aquitard is about 40 m thick. The available well-logs (TANGRAM database; Bonomi et al., 2014) reveal the presence of a 133 134 discontinuous silty layer of about 5 m thickness in the eastern part of the plain, that subdivides the main aguifer in an unconfined (~20 m thick) and a semi-confined 135 (between 12 and 25 m in thickness) part (Bonomi et al., 2015a; Novel et al., 2002; 136 137 Triganon et al., 2003). The regional groundwater flow is from west to east following the slope of the valley. The main regional river (Dora Baltea River) flows along the plain 138 from west to east changing from losing to gaining along its path (Bonomi et al., 2015b; 139 140 Stefania et al., 2018b, 2018c). 141 More specifically, the study area is situated in the eastern part of this plain with a landfill site of approximately 0.55 km<sup>2</sup> that is bordered on the southern side by the main 142 143 regional river. Before the introduction of environmental regulation, this area was used 144 as an uncontrolled disposal site of waste that progressively formed an unlined landfill. 145 During the 80's, a new lined MSW landfill was built downstream of the old unlined

146 landfill (Fig. 2). The liner system consists at least of a 1 m thick clay layer at the 147 bottom. During the early 90's, the unlined landfill was closed and a capping was placed 148 on top of the landfill in order to prevent rain infiltration to the waste. 149 In the MSW landfill ~1,800,000 t of waste are deposited with an annual increase of 150 70,000 t. The wastes stored in the MSW landfill are domestic waste and sewage sludge, 151 whereas those in the unlined landfill are inert, plastic and urban wastes of different and 152 unknown composition. A leachate collection system serving the MSW landfill is 153 composed of 4 underground tanks (3 x 5 m and unknown depth), 3 leachate wells, and related underground pipes that cross the western and southern sides of the area (Fig. 2). 154 155 The leachate is then pumped to a wastewater treatment plant (WTP) located in the 156 western part of the dumping area (Fig. 2) that serves ~115,000 equivalent inhabitants. 157 The landfill is located in the area where the main aquifer is subdivided into an 158 unconfined and a semi-confined unit (Fig. 1c). The leachate pollution affects only the 159 ~20 m thick unconfined aquifer, whereas the underlying semi-confined aquifer is free 160 from pollution since it is protected by the silty aquitard and, where this is absent (i.e. in 161 proximity of the river), the groundwater flow is directed upwards due to the gaining 162 behaviour of the river (Stefania et al., 2018b, 2018c). The site has been polluted for at least a decade, as shown by some legacy data provided by the Regional Environmental 163 Protection Agency of Aosta Valley Region (ARPA VdA) that testify the prolonged 164 165 deterioration of the quality of surrounding groundwater: mean values of Cl 166 concentrations (399 samples over the period 2011-2017), electrical conductivity (EC; 167 811 samples over the period 2014-2017) and chemical oxygen demand (COD; 1969 168 samples over the period 2006-2017) were 134 mg/L, 1326 uS/cm and 66 mg/L, 169 respectively. The groundwater table depth beneath the landfill site is, on average (variable topography), 5-6 m bgl. The entire landfill area is monitored by 38 170

piezometers with an average depth of 15 m bgl, thus tapping the sole unconfined aquifer. These piezometeres are located around the MSW and unlined landfills (Fig. 2).

173

174

171

172

### 2.2 Field survey

A field survey was performed during March 2017. Water samples were collected from 175 176 groundwater (38 samples), surface water (5 samples), and treated wastewater from the effluent of the WTP (1 sample). A leachate sample from a leachate well serving the 177 MSW landfill was also collected. In addition, local authorities provided data related to 3 178 179 leachate samples collected from the leachate wells in January 2017. The location of the 180 sampling points is shown in Fig. 2. Static groundwater levels were measured in March 181 2017 from the monitoring piezometers before sampling. Groundwater was sampled after a piezometer purging by 3 volumes using the portable sampling pump Grundfos MP1. 182 183 Grab samples of surface water and sewage effluent were taken at 30 cm below the water 184 surface using a bucket. Leachate samples were collected from the underground leachate tanks using a bucket. 185 186 Temperature (T), EC, and pH were measured in the field for all samples using portable instruments. Groundwater samples were analysed for nitrogen compounds (NH<sub>4</sub><sup>+</sup>-N, 187 NO<sub>3</sub>-N, NO<sub>2</sub>-N), COD, total phosphorus (P-tot), major ions (Ca<sup>2+</sup>, Mg<sup>2+</sup>, K<sup>+</sup>, Na<sup>+</sup>, Cl<sup>-</sup>, 188 SO<sub>4</sub><sup>2-</sup>) and the artificial sweeteners SAC, CYC, ACE and SUC. Surface water and 189 sewage effluent samples were analysed for major ions and artificial sweeteners whereas 190 nitrogen compounds, COD, P-tot, Cl<sup>-</sup>, SO<sub>4</sub><sup>2-</sup> and SUC (the latter, only for the sample 191 collected in March 2017) were measured in leachate samples. Table S1 shows the list of 192 193 sampling points with measured parameters.

Nitrogen compounds were analysed using the indophenol blue spectrophotometric method for NH<sub>4</sub><sup>+</sup>-N (Bolleter et al., 1961), the Griess reagent spectrophotometric method for NO<sub>2</sub><sup>-</sup>-N (Barnes and Folkard, 1951), and ion chromatography for NO<sub>3</sub><sup>-</sup>-N (Leoni et al., 2014). A titration method was used to analyse COD whereas SO<sub>4</sub><sup>2</sup>- and major ions were analysed by ion chromatography (Leoni et al., 2014). P-tot was determined by inductively coupled plasma mass spectrometry (ICP-MS; EPA, 2014). Artificial sweeteners (SUC, ACE, CYC and SAC) in groundwater and surface water were analysed by liquid chromatography tandem-mass spectrometry (LC-MS/MS) after online solid-phase extraction (Buerge et al., 2009), whereas SUC in leachate was analysed by gas chromatography-mass spectrometry (GC/MS; modified from Mead et al., 2009).

207 ic

mg/L for NO $_3$ -N, 0.0015 mg/L for NO $_2$ -N, 0.004 mg/L for P-tot, 0.1 mg/L for major ions, 1.0  $\mu$ g/L for SUC with the LC-MS/MS method, 0.05  $\mu$ g/L for SUC with the

GC/MS method, 0.4  $\mu$ g/L for ACE, 0.1  $\mu$ g/L for CYC, and 0.3  $\mu$ g/L for SAC. Results

The limit of detection (LOD) was 2.5 mg/L for COD, 0.02 mg/L for NH<sub>4</sub><sup>+</sup>-N, 0.014

of chemical analyses were stored in the TANGCHIM database (Stefania et al., 2019).

## 2.3 Multivariate statistical analysis

Multivariate statistical analysis was applied on groundwater data considering 17 hydrochemical variables (i.e. EC, pH, COD, P-tot, NH<sub>4</sub><sup>+</sup>-N, NO<sub>3</sub><sup>-</sup>-N, NO<sub>2</sub><sup>-</sup>-N, Ca<sup>2+</sup>, Mg<sup>2+</sup>, Na<sup>+</sup>, K<sup>+</sup>, Cl<sup>-</sup>, SO<sub>4</sub><sup>2-</sup>, SAC, CYC, ACE and SUC) from 37 samples. Sample 28 was excluded since only major ions were measured. Concentrations below LOD were substituted with a value of LOD/2. Hierarchical clustering analysis (CA) and factor analysis (FA) were performed. The CA was done by means of the Ward method (Ward,

1963) using the Euclidean distance (Cloutier et al., 2008). In order to guarantee an equal weight for each variable in calculating the Euclidean distance matrix, the CA was made on standardized data (i.e. mean = 0 and standard deviation = 1; Judd, 1980). The FA was based on the calculation of the correlation matrix and was conducted using Varimax rotation (Kaiser, 1958). The selection of the significant factors was done on the basis of the eigenvalues matrix, in particular, only those factors with eigenvalues  $\geq 1$  were considered as significant factors (Kaiser, 1958).

### 2.4 Particle tracking and transport modeling

Particle tracking and transport modeling were based on the 3D steady-state groundwater flow simulation (January 2009) described in Stefania et al. (2018b) using MODFLOW2005 (Harbaugh, 2005). Details on groundwater flow model settings are reported in Sect. S3 of the Supporting Material. Particle tracking in forward and backward modes was done using MODPATH (Pollock, 2012), with the aim of estimating the potential area impacted by a leachate plume sourced from the old unlined landfill. The starting location of particles covered the entire area of the unlined landfill and they were placed on the top of the groundwater table.

Transport modeling was done using MT3DMS (Zheng, 2010; Zheng and Wang, 1999). The concentration of chloride, used as conservative tracer of landfill leachate, was simulated with the aim of testing whether C1 concentrations could be explained by the sole advective-dispersive transport from the old landfill to downstream of the MSW landfill, excluding possible additional leaks/spills sourced from the MSW landfill. The choice of the longitudinal dispersivity ( $\alpha_{\rm L}$ ) value was driven by a sensitivity analysis since the simulated plume was expected to be fairly sensitive to changes of this

parameter (Han et al., 2013). The initial value of 15 m, calculated with the Mercado equation (Mercado, 1967) considering a length of the polluted aquifer (from the unlined landfill to the river) of 220 m, was varied using four multipliers: 0, 0.1, 1 and 10. Once selected the proper longitudinal dispersivity, the values of transversal ( $\alpha_T$ ) and vertical  $(\alpha_{\rm V})$  dispersivities were calculated using the well-known constant ratios (Gelhar et al., 1992), i.e.  $\alpha_I/\alpha_T$  and  $\alpha_T/\alpha_V = 0.1$ . The source of chloride was simulated by imposing a constant concentration boundary at the cells corresponding to piezometers located upstream of the lined landfill and assigning the average measured Cl concentration (Table S2) calculated for each piezometer on the legacy data (over the 2011-2017 period) provided by ARPA VdA. The use of average measured Cl<sup>-</sup> concentrations, rather than measured Cl<sup>-</sup> in March 2017, was chosen since a) the simulated groundwater flow in January 2009 (on which the transport model is based on) represents average hydrodynamic conditions (Stefania et al. 2018b) and b) some variations in the groundwater flow direction occurred between January 2009 and March 2017 (see Sect. 3.1), so the use of measured Cl<sup>-</sup> in March 2017 would be incongruous. Accordingly with the use of Cl<sup>-</sup> as a conservative tracer (Christensen, 1992; Han et al., 2013), no physical and/or chemical reactions were simulated. A period of 365 days was used as total transport simulation time. This allowed to reach a quasi-steady-state for simulated concentrations downstream of the MSW landfill. The advective term of the transport was solved using the total variation diminishing (TVD) scheme since it is more accurate in solving advection-dominated problems and minimizing numerical dispersion (Zheng, 2010; Zheng and Wang, 1999).

242

243

244

245

246

247

248

249

250

251

252

253

254

255

256

257

258

259

260

261

262

#### 3. Results and Discussion

### 3.1 Groundwater flow

265

266

267

268

269

270

271

272

273

274

275

276

277

278

279

280

281

282

283

Fig. 2 shows the piezometric map obtained by ordinary kriging interpolation of groundwater levels measured in March 2017. Fig. 2 also reports the simulated piezometric map by Stefania et al. (2018b) for January 2009. Groundwater mainly flows from west to east; however, the flow direction shifts toward south-east in proximity of the river due to its gaining behavior (PIAHVA, 1996; Stefania et al., 2018b). The effect of the gaining river on groundwater flow is more evident in the map for March 2017. This could be related to the fact that the simulated map for January 2009 comes from a regional model (covering the entire ~25 km<sup>2</sup> of the Aosta Plain; Stefania et al., 2018b), therefore it could not consider local variations of flow direction occurring at the sitespecific scale of the landfill (0.55 km<sup>2</sup>) as the detailed groundwater level survey of March 2017 can do. Moreover, some variations in the hydrodynamic conditions may have occurred between January 2009 and March 2017. The gaining behavior of the river nearby the landfill is kept throughout the year, even during the early summer when the river has its highest discharge due to snow melting (Stefania et al., 2018b). On the basis of the groundwater flow, piezometers 26-30 can be considered located downstream of the old unlined landfill and piezometers 2-4B and 19-22 downstream of the MSW landfill.

284

285

286

287

288

#### 3.2 Artificial sweeteners

Fig. 3 shows the spatial distribution of measured concentrations of artificial sweeteners in groundwater and surface water. In general, ACE was the most frequently detected artificial sweetener, whereas SUC was the least detected (note the higher LOD for

- SUC). This is consistent with previous studies in other urban environments worldwide
- 290 (Lee et al., 2015; Tran et al., 2014; Van Stempvoort et al., 2011; Wolf et al., 2012).
- 291 ACE was measured above the LOD in 7 groundwater samples, with maximum
- 292 concentrations found in piezometers 1 (9.69 μg/L) and 17 (5.15 μg/L), located close to
- 293 the leachate well L1. Relevant concentrations were measured also in piezometers 27
- 294 (4.55 µg/L) and 28 (0.68 µg/L), located downstream of the older unlined landfill, in
- 295 piezometers 19 and 20 (1.71 and 1.51 μg/L), located downstream of the MSW landfill,
- and in piezometer 11 (0.82  $\mu$ g/L), close to the leachate well L3.
- 297 CYC confirmed these results, with highest concentrations in piezometers 1 and 17
- 298 (29.56 and 1.05  $\mu$ g/L, respectively), followed by piezometer 27 (0.85  $\mu$ g/L) and 11
- 299 (0.14 µg/L), although it was not detected in piezometers 19, 20, and 28. SAC was
- detected in piezometers 1 and 17 (5.44 and 0.68 µg/L, respectively), moreover, it was
- 301 also detected in two piezometers in the eastern part of the area, downstream of the
- 302 unlined and MSW landfills, that are piezometers 22 (1.28 μg/L) and 24 (0.50 μg/L).
- 303 SUC was only detected in piezometer 1 (3.0 µg/L).
- 304 Concerning surface waters, SUC, ACE and CYC were detected in the main regional
- river (3.21, 4.93 and 0.12 µg/L, respectively), but only just downstream of the discharge
- of treated effluent from the WTP that showed concentrations of 3.43, 7.05, 0.32, and
- 307 0.53 μg/L for SUC, ACE, CYC, and SAC, respectively. Therefore, the concentrations
- measured in the river seem to be related to the discharge of the WTP rather than the
- 309 gaining of polluted groundwater from the landfill site.
- SUC was detected in the leachate sample L3 (0.15  $\mu$ g/L). This indicates that SUC can
- be used to trace pollution in groundwater by leachate from more recent landfills, as it
- may be the case in piezometer 1 (see Sect. 3.4.1 for an in-depth discussion).

315

316

317

318

319

320

321

322

323

324

325

326

327

328

329

330

331

332

333

334

335

# 3.3 Groundwater quality classification

An overall characterization of the groundwater quality in the site can be obtained from the results of CA that combined the artificial sweeteners with the other measured hydrochemical parameters. The CA showed that groundwater samples can be grouped into three main clusters, called C1, C2 and C3. The location of piezometers composing each cluster is shown in Fig. 2, the histogram of centroids for the three clusters is shown in Fig. 4, and the CA dendrogram is shown in Fig. S1. Cluster C1 groups 3 sampling points, piezometer 27, located downstream of the old unlined landfill, and piezometers 1 and 17, located upstream of the MSW landfill and close to the leachate well L1 (Fig. 2). Cluster C1 is mainly characterized by high values of ACE, COD, K<sup>+</sup>, Mg<sup>2+</sup>, Na<sup>+</sup>, Cl<sup>-</sup>, P-tot and EC (Fig. 4) ranging between 4.55 and 9.69 µg/L, 172 and 572, 124 and 434, 40 and 81, 219 and 634, 360 and 736, 0.25 and 1.84 mg/L and 1180 and 6260 µS/cm, respectively. All these parameters, in particular COD, K<sup>+</sup> and the tracer ACE, are indicators of groundwater contamination by landfill leachate (Christensen et al., 2001; Mor et al., 2006; Öman and Junestedt, 2008; Roy et al., 2014), therefore their high concentrations reveal that piezometers forming cluster C1 (i.e. 27, 17 and 1) are affected by a severe leachate pollution. It can be assumed that these piezometers are likely located close to some considerable leachate spills or leaks (i.e. main pollution sources of the site). It is noted that NO<sub>3</sub>-N values have a large variation in C1 ranging from <LOD in piezometer 1 to 455 mg/L in piezometer 27; this may indicate the presence of different types of pollution sources within this cluster (see Sect. 3.4 for a more detailed discussion).

Cluster C2 groups piezometers located in three different zones of the landfill site (Fig. 2): a) piezometer 11 is close to the leachate well L3, b) piezometers 29 and 30 are downstream of the unlined landfill and c) piezometers 4B, 19, 20 and 21 are located downstream of the MSW landfill, along its south-eastern side. Cluster C2 is mainly represented by higher values of NO<sub>2</sub>-N and NH<sub>4</sub>+N. The former ranges between 0.04 and 0.20 mg/L whereas the latter varies from 9.4 to 118.0 mg/L. The hydrochemical features of cluster C2 can be related to ongoing degradation of organic compounds and its attenuation along groundwater flow paths (Christensen et al., 2001; Cozzarelli et al., 2011). High NO<sub>2</sub>-N values indicate an ongoing nitrification, i.e. NH<sub>4</sub><sup>+</sup> (the product of degradation of organic N) is oxidized to NO<sub>3</sub>. The lower concentrations of COD, P-tot, and major ions with respect to cluster C1 could be related to attenuation (i.e. dilution/dispersion/degradation) processes during the transport of leachate in groundwater (Appelo and Postma, 2004; Christensen et al., 2001). Cluster C2 groups piezometers that can be considered affected by a moderate leachate pollution. This could be related to some leachate spills/leaks less intense than for C1 or to the transport of main leachate plumes (originating close to piezometers forming C1) that evolve their chemical composition along groundwater flow paths. Cluster C3 groups the remaining 27 piezometers of the groundwater monitoring network of the landfill site. Since all measured parameters have lower values here, it can be stated that this cluster represents the baseline hydrochemistry of the area. Fig. 5 shows the scatter plot of Cl<sup>-</sup> vs K<sup>+</sup> for groundwater, surface water and sewage effluent samples. The ions Cl<sup>-</sup> and K<sup>+</sup> are useful tracers of MSW leachate pollution since they are conservative and typically found at high concentrations in MSW leachate (de Medeiros Engelmann et al., 2017; Devic et al., 2014; Kim et al., 2016; Panno et al.,

2006; Rotiroti et al., 2015a, 2015b; Singh et al., 2008). K<sup>+</sup> is contained in vegetal

336

337

338

339

340

341

342

343

344

345

346

347

348

349

350

351

352

353

354

355

356

357

358

359

wastes, e.g. paper (Naveen et al., 2017), while Cl is contained in domestic salts (Rotiroti et al., 2017). In general, the Cl vs K plot confirms the groundwater classification resulting from CA. Indeed, samples from C1 were the most polluted, followed by samples from C2 and then by C3 with the lowest values. Within the latter, representing the baseline hydrochemistry, a sub-classification can be done. Some points exhibit lower concentrations (Cl<sup>-</sup> < 21 and K<sup>+</sup> < 5 mg/L) attributable to the natural baseline (i.e. piezometers 35-38 located outside of the landfill site) whereas for the other points with higher concentrations, an anthropogenic baseline, accounting for all human activities at the site over time, can be considered, as for piezometers 8, 31 and 32 that reach Cl concentrations around 200 mg/L. However, for these piezometers, a slight influence of the leachate collection system serving the MSW landfill cannot be excluded since they are all located close to an underground leachate tank (Fig. 1). The samples from cluster C1 together with sample 28, that has high C1 and K<sup>+</sup> concentrations, but was excluded from the CA (see Sect. 2.3), show a good linear correlation between Cl and  $K^+$  ( $r^2 = 0.98$ ). This leads to the following two considerations: a) sample 28 likely has similar hydrochemical features with respect to the samples forming cluster C1, so it can be considered as part of this cluster b) all these four piezometers are affected by the same landfill pollution evidenced by CA results. Fig. 5 shows that concentrations of Cl and K in surface water samples were similar to groundwater samples from cluster C3. This suggests that, at the time of sampling, the main regional river was not affected by the landfill although it gains groundwater crossing the landfill site. This could be due to attenuation (i.e. dilution/dispersion/degradation) occurring along groundwater flow paths and within the river. The highest concentrations of K<sup>+</sup> and Cl<sup>-</sup> in surface water were found just downstream of the discharge of treated wastewater from the WTP.

361

362

363

364

365

366

367

368

369

370

371

372

373

374

375

376

377

378

379

380

381

382

383

384

388

389

390

391

392

393

394

## 3.4 Identification of pollution sources

The groundwater classification (Sect. 3.3) allowed to identify those piezometers affected by more severe (cluster C1) and moderate (cluster C2) pollution. However, this classification was not able to differentiate between possible pollution sources of the area, that are a) the old unlined landfill, b) the MSW landfill, c) the leachate collection system serving the MSW landfill and d) a combination of these. The attribution of a pollution source to each cluster or sub-group of piezometers is discussed in the following.

395

396

404

# 3.4.1 Severely polluted groundwater

explains 7.0% and is only represented by NH4<sup>+</sup>-N.

- The identification of pollution sources attributable to piezometers with severe pollution (cluster C1) was supported by the FA made on groundwater samples.
- The FA identified 4 significant factors (FAC1-4) explaining a total cumulative variance of 86.8% (Table S3). FAC1 explains 45.8% of the total variance. The original variables that represent FAC1 (i.e. loading value > |0.7|) are NO<sub>3</sub>-N, Ca<sup>2+</sup>, SO<sub>4</sub><sup>2-</sup> and Na<sup>+</sup>. FAC2 explains 22.9% of the variance and is represented by the four sweeteners SUC, CYC, SAC and ACE. FAC3 explains 11.2% and is mainly represented by P-tot and EC. FAC4
- Fig. 6 reports the loading and score plots for FAC1 *vs* FAC2 and FAC1 *vs* FAC3. Fig. 6 shows that FAC1 is able to separate the samples forming cluster C1: piezometer 27 is polluted by leachate having higher NO<sub>3</sub><sup>-</sup>-N, Ca<sup>2+</sup>, SO<sub>4</sub><sup>2-</sup> and Na<sup>+</sup> whereas piezometers 1 and 17 have lower concentrations of these species. Considering the location of

piezometer 27 (Fig. 2), FAC1 may represent pollution by leachate leaking from the older unlined landfill. The higher values of NO<sub>3</sub>-N and SO<sub>4</sub><sup>2</sup>, that characterize FAC1, seem consistent with leachate coming from an older landfill. Indeed, Lee et al. (2010) reported an increase of  $SO_4^{2-}$  in leachate from older landfills. The high  $SO_4^{2-}$ concentration could be related to higher O<sub>2</sub> due to rainfall infiltration and heterogeneous mixing of wastes (Chofqi et al., 2004) that promote oxic conditions, preventing sulfate reduction (Abd El-Salam and Abu-Zuid, 2015). Ziyang et al. (2009) analyzed nitrogen compounds in leachate samples from landfills with different ages (2-12 years), observing a decrease of NH<sub>4</sub><sup>+</sup>-N and an increase of NO<sub>3</sub><sup>-</sup>-N over time. Fig. 6 shows that FAC2 and FAC3 distinguish piezometer 1 from piezometer 17. FAC2 highlights the highest concentrations for all the four measured sweeteners found in piezometer 1. In particular, the most relevant contribution of SUC to FAC2 indicates that this factor may represent pollution by leachate from the younger MSW landfill. This is confirmed by the detection of SUC in the leachate sampled from the leachate collection system serving the MSW landfill (see Sect. 3.2). The location of piezometer 1 indicates that this pollution is likely originated from the leachate well L1 and/or its related underground tank. FAC3 underlines that piezometer 17 has higher P-tot and EC. High values of these parameters are consistent with the chemical features of leachate from younger landfills (Christensen et al., 2001; de Medeiros Engelmann et al., 2017; Han et al., 2013; Mor et al., 2006; Van Breukelen et al., 2003; Van Breukelen and Griffioen, 2004; Vodyanitskii, 2016) that also typically shows lower concentrations of NO<sub>3</sub> and SO<sub>4</sub><sup>2</sup> (Aziz et al., 2010; Lee et al., 2010; Ziyang et al., 2009). Therefore, considering that piezometer 17 is located close to and downstream of piezometer 1, it can be argued that both these piezometers may be affected by a leachate spill from the leachate well L1 serving the younger MSW landfill.

409

410

411

412

413

414

415

416

417

418

419

420

421

422

423

424

425

426

427

428

429

430

431

432

A confirmation of this interpretation can also be given by the plot of SO<sub>4</sub><sup>2-</sup> vs Cl<sup>-</sup> (Fig. 7), measured also in leachate samples from the leachate collection system of the MSW landfill. Groundwater samples 1 and 17 plot towards the leachate samples that have high Cl<sup>-</sup> and low SO<sub>4</sub><sup>2-</sup>, thus strengthening the idea that leachate leaking, from the well L1 serving the younger MSW landfill, is polluting surrounding groundwater.

In summary, the identification of pollution sources for those piezometers classified as severely polluted revealed that piezometers 27 and 28 (the latter associable to the severely polluted group (Sect. 3.3) and located close to the former, as shown in Fig. 2) are likely affected by leachate leaking from the older unlined landfill, whereas piezometers 1 and 17 are likely affected by a leachate spill from the leachate well L1 serving the MSW landfill.

# 3.4.2 Moderately polluted groundwater

The understanding of the sources of pollution for piezometers forming cluster C2 (moderately polluted groundwater) was supported by the use of the sweetener ACE as tracer, followed by a quantitative analysis of the groundwater flow system through particle tracking and transport modeling.

The sweetener ACE gave more comprehensive information than the other sweeteners, indeed, characterizing cluster C1, it was able to trace the two main leachate spills/leaks (from the leachate well L1 serving the MSW landfill and from the unlined landfill) and, being detected in piezometers 11, 19 and 20 of cluster C2, it also allowed to identify groundwater classified as moderately polluted; this is consistent with its conservative properties (Buerge et al., 2009; Van Stempvoort et al., 2011). According to this, the interpretation of ACE concentrations can be a valid support for understanding what

causes the moderate pollution in piezometers 11, 19, and 20. The identification of the pollution source for piezometer 11 seems quite easy since its proximity to the leachate well L3 and the absence of any other possible sources upstream indicate, with little doubt, that some modest spills from well L3 are affecting piezometer 11. Conversely, the understanding of the cause of pollution in piezometers 19 and 20 could be challenging. Indeed, these piezometers might possibly be affected by a) the old unlined landfill, b) the MSW landfill or c) a combination of the two. The distribution of ACE concentrations, with higher values in piezometer 27 and lower values in piezometers 19 and 20, seems to sustain the idea that these piezometers could be affected by a leachate plume sourced from the old unlined landfill. This may also be the case for piezometers 4B and 21, that were classified as moderately polluted too (Sect. 3.3), and are located downstream of the MSW landfill, close to piezometers 19 and 20. The hypothesis that a leachate plume sourced from the unlined landfill, moving downstream, affects piezometers 4B, 19, 20 and 21 was tested by particle tracking and transport modelling. Results of particle tracking showed that a leachate spill from the old unlined landfill could affect the south-eastern part of the study area, between piezometers 3 and 5B (Fig. 8). The estimated travel time required for groundwater to move from the unlined landfill to these downstream piezometers is ~160 days. The simulation suggested that piezometer 19 is not affected by the plume from the unlined landfill. However, particle tracking was based on the simulated groundwater flow for January 2009 (see Sect. 2.4 for details), and piezometer 19 may nevertheless be affected by the plume from the old landfill. Indeed, the potentiometric map obtained from March 2017 data clearly shows that piezometer 19 is downstream of the unlined landfill along a groundwater flow line (Fig. 2). Therefore, piezometer 19 can also be considered as

affected by a leachate plume sourcing from the unlined landfill. The particle tracking

458

459

460

461

462

463

464

465

466

467

468

469

470

471

472

473

474

475

476

477

478

479

480

481

pointed out that also piezometers 29 and 30, classified as moderately polluted (Sect.

3.3), may be affected by leachate spills from the unlined landfill.

484

485

486

487

488

489

490

491

492

493

494

495

496

497

498

499

500

501

502

503

504

505

506

507

Results of particle tracking, together with groundwater level data of March 2017, showed that piezometers 4B, 19, 20 and 21 could be affected by a leachate plume from the unlined landfill but do not exclude any possible leachate spills from the MSW landfill. This can be elucidated by results of the chloride transport modeling. This modelling was aimed at testing if Cl concentrations in piezometers downstream of the MSW landfill can be explained by the advective-dispersive transport of Cl sourced upstream of it or whether additional leaks/spills from the MSW landfill contribute to the observed pollution. Fig. 9 and Table 1 show the results of this modeling. Fig. 9a depicts results of the sensitivity analysis on longitudinal dispersivity through simulated breakthrough curves of chloride in piezometer 4B. The curve obtained using a α<sub>L</sub> value of 1.5 m fits with the travel time of 160 days estimated by particle tracking, so this value was used for modeling. Fig. 9b shows the map of the simulated Cl<sup>-</sup> plume and indicates which piezometers were used as pollution point sources and pollution targets (the latter are the piezometers located downstream of the MSW landfill). In the target piezometers 3, 4B and 19, the simulated Cl<sup>-</sup> concentrations were comparable to average measured concentrations, in piezometers 4, 20 and 21 even higher (Table 1). This indicates that unaccounted additional sources, i.e. leachate leaks/spills from the MSW landfill, seem unlikely. Nevertheless, this conclusion based on chloride transport modeling does not allow to definitively exclude leachate spills/leaks from the MSW landfill. In particular, the NH<sub>4</sub><sup>+</sup>-N concentrations found in March 2017 were significantly higher in piezometers 19 and 20 (118 and 116 mg/L, respectively) than in piezometer 27 (2.3 mg/L), and exceeded the trigger level for identifying significant adverse environmental effects caused by the MSW landfill that was estimated by

Stefania et al. (2018a) to be 9 mg/L for this area (calculation based on legacy data from 2006 to 2010). The assessment of possible impacts from the MSW landfill is thus still an open issue and further monitoring of these piezometers is needed.

In summary, the identification of the pollution sources for those piezometers classified as moderately polluted revealed that piezometers 4B, 19, 20, 21, 29 and 30 are likely affected by a leachate plume sourced from the old unlined landfill, whereas piezometer 11 is likely affected by a leachate spill from the leachate well L3 serving the MSW landfill. Table 2 summarizes the pollution phenomena identified in the site, for each of which the names of affected piezometers are listed and the composition of affected groundwater is reported through their mean concentrations. Direct leachate spills/leaks from the MSW landfill seem unlikely, although they cannot definitely be excluded, in particular, nearby piezometers 19 and 20.

### 3.5 Recommendations for improving groundwater quality in the landfill site

Once identified the source of pollution for each piezometer in the studied landfill site, some recommendations can be given in order to improve the groundwater quality. This work showed that the main pollution sources affecting the area are related to a) the old unlined landfill and b) the leachate collection system serving the MSW landfill. Therefore, the recommendations are: a) to check the sealing of the leachate collection system in order to identify and repair the spills of leachate and b) to implement a drainage system just downstream the old landfill in order to prevent the migration of leachate toward the MSW landfill; this, in turn, would allow to better monitor the MSW landfill itself making the identification of possible future leachate spills from it easier.

#### 4. Conclusions

532

533

534

535

536

537

538

539

540

541

542

543

544

545

546

547

548

549

550

551

552

553

554

555

landfill sites worldwide.

This work presented a detailed identification of pollution sources for groundwater in a landfill site. For each monitored point affected by leachate pollution, the likely source and cause of pollution was assessed. This was done using a multi-methods approach which integrates the use of artificial sweeteners as tracers of leachate pollution, multivariate statistical analysis, particle tracking and transport modelling. This work highlights that a multi-methods approach allows to overcome gaps and limitations related to each single method, supporting a more comprehensive understanding of the pollution phenomena affecting the study area. Artificial sweeteners are confirmed to be useful tracers of leachate plumes from MSW landfills, moreover, due to their different commercialization years, they may give some indication on the age of the leachate; in particular, the presence of SUC indicates that the leachate is sourced from a landfill containing recent (after 2000) wastes. The sweetener ACE, due to its conservative properties, gives more comprehensive information on leachate pollution affecting the study area. However, a better understanding of the system under analysis can be given combining the use of artificial sweeteners with other tracers/parameters, for example through a multivariate statistical analysis, and implementing other investigative techniques, such as transport modelling. The detailed identification of pollution sources for each cluster or sub-group of monitored sampling points leads to suggest effective and specific actions for remediation and improving groundwater quality in the study area. This work presented a local case study for attributing groundwater pollution sources in a landfill site, however, the methodologies used here can be applied to other polluted

556	
557	Funding
558	This research was funded by the Regional Environmental Protection Agency-Aosta
559	Valley Region through the scientific collaboration n. 2018-CONV25-0025.
560	
561	Acknowledgment
562	The authors are grateful to Pietro Capodaglio and Fulvio Simonetto of Regional
563	Environmental Protection Agency-Aosta Valley Region (ARPA VdA) for supporting
564	this study. The authors wish to thank Valentina Soler of University of Milano-Bicocca
565	for performing major ions analyses. We also thank Antonio Finizio, Sara Villa and
566	Giovanna Marino of University of Milano-Bicocca for sucralose analysis on the
567	leachate sample.
568	
569	Appendix A. Supplementary material
570	Supplementary material to this article can be found online at
571	
572	References
573	Abd El-Salam, M.M., Abu-Zuid, G.I., 2015. Impact of landfill leachate on the
574	groundwater quality: A case study in Egypt. J. Adv. Res. 6, 579–586.
575	doi:10.1016/j.jare.2014.02.003
576	Alberti, L., Marchesi, M., Trefiletti, P., Aravena, R., 2017. Compound-Specific Isotope
577	Analysis (CSIA) Application for Source Apportionment and Natural Attenuation
578	Assessment of Chlorinated Benzenes, Water 9, 872, doi:10.3390/w9110872

- Appelo, C.A.J., Postma, D., 2004. Geochemistry, groundwater and pollution. CRC
- 580 press.
- Asase, M., Yanful, E.K., Mensah, M., Stanford, J., Amponsah, S., 2009. Comparison of
- municipal solid waste management systems in Canada and Ghana: A case study of
- the cities of London, Ontario, and Kumasi, Ghana. Waste Manag. 29, 2779–2786.
- 584 doi:10.1016/j.wasman.2009.06.019
- Assamoi, B., Lawryshyn, Y., 2012. The environmental comparison of landfilling vs.
- incineration of MSW accounting for waste diversion. Waste Manag. 32, 1019–
- 587 1030. doi:10.1016/j.wasman.2011.10.023
- Ayvaz, M.T., 2010. A linked simulation optimization model for solving the unknown
- groundwater pollution source identification problems. J. Contam. Hydrol. 117, 46–
- 59. doi:10.1016/j.jconhyd.2010.06.004
- Aziz, S.Q., Aziz, H.A., Yusoff, M.S., Bashir, M.J.K., Umar, M., 2010. Leachate
- characterization in semi-aerobic and anaerobic sanitary landfills: A comparative
- study. J. Environ. Manage. 91, 2608–2614. doi:10.1016/j.jenvman.2010.07.042
- Barnes, H., Folkard, A.R., 1951. The determination of nitrites. Analyst 76, 599–603.
- 595 doi:10.1039/AN9517600599
- Bolleter, W.T., Bushman, C.J., Tidwell, P.W., 1961. Spectrophotometric determination
- of ammonia as indophenol. Anal. Chem. 33, 592–594. doi:10.1021/ac60172a034
- Bonomi, T., Fumagalli, L., Rotiroti, M., Cavallin, A., Bellani, A., 2014. Banca dati
- idrogeologica TANGRAM©: strumento per elaborazioni quantitative di dati per la
- valutazione delle acque sotterranee "The hydrogeological well database
- TANGRAM©: a tool for data processing to support groundwater assessment".
- 602 Acq. Sott. Ital. J. Groundw. 3 (2/136), 35-45. doi:10.7343/AS-072-14-0098
- Bonomi, T., Fumagalli, L., Stefania, G.A., Rotiroti, M., Pellicioli, F., Simonetto, F.,
- 604 Capodaglio, P., 2015a. Groundwater contamination by Cr(VI) in the Aosta Plain

- 605 (northern Italy): characterization and preliminary modeling. Rend. Online Soc.
- Geol. Ital. 35, 21–24. doi:10.3301/ROL.2015.54
- Bonomi, T., Fumagalli, L., Rotiroti, M., Perego, R., Simonetto, F., Capodaglio, P.,
- 608 2015b. Groundwater Flow Modelling of the Aosta Plain in Northern Italy. In:
- Lollino G, Arattano M, Rinaldi M, Giustolisi O, Marechal J-C, Grant GE (eds)
- Engineering Geology for Society and Territory Volume 3. Springer International
- Publishing, pp 227-230. doi:10.1007/978-3-319-09054-2\_46
- Buerge, I.J., Buser, H.R., Kahle, M., Müller, M.D., Poiger, T., 2009. Ubiquitous
- occurrence of the artificial sweetener acesulfame in the aquatic environment: An
- ideal chemical marker of domestic wastewater in groundwater. Environ. Sci.
- 615 Technol. 43, 4381–4385. doi:10.1021/es900126x
- Buerge, I.J., Keller, M., Buser, H.R., Müller, M.D., Poiger, T., 2011. Saccharin and
- other artificial sweeteners in soils: Estimated inputs from agriculture and
- 618 households, degradation, and leaching to groundwater. Environ. Sci. Technol. 45,
- 619 615–621. doi:10.1021/es1031272
- 620 Castañeda, S.S., Sucgang, R.J., Almoneda, R. V., Mendoza, N.D.S., David, C.P.C.,
- 621 2012. Environmental isotopes and major ions for tracing leachate contamination
- from a municipal landfill in Metro Manila, Philippines. J. Environ. Radioact. 110,
- 623 30–37. doi:10.1016/j.jenvrad.2012.01.022
- 624 Chofqi, A., Younsi, A., Lhadi, E.K., Mania, J., Mudry, J., Veron, A., 2004.
- Environmental impact of an urban landfill on a coastal aquifer (El Jadida,
- 626 Morocco). J. African Earth Sci. 39, 509–516. doi:10.1016/j.jafrearsci.2004.07.013
- 627 Christensen, J.B., Jensen, D.L., Grøn, C., Filip, Z., Christensen, T.H., 1998.
- 628 Characterization of the dissolved organic carbon in landfill leachate-polluted
- groundwater. Water Res. 32, 125–135. doi:10.1016/S0043-1354(97)00202-9

- 630 Christensen, T.H., 1992. Attenuation of Leachate Pollutants in Groundwater. In: T.H.
- Christensen, Cossu, R., Stegmann, R. (eds) Landfilling of waste: leachate. CRC
- 632 Press, pp. 441-483.
- 633 Christensen, T.H., Kjeldsen, P., Bjerg, P.L., Jensen, D.L., Christensen, J.B., Baun, A.,
- Albrechtsen, H.J., Heron, G., 2001. Biogeochemistry of landfill leachate plumes.
- Appl. Geochemistry 16, 659–718. doi:10.1016/S0883-2927(00)00082-2
- 636 Clarke, B.O., Anumol, T., Barlaz, M., Snyder, S.A., 2015. Investigating landfill
- leachate as a source of trace organic pollutants. Chemosphere 127, 269–275.
- 638 doi:10.1016/j.chemosphere.2015.02.030
- 639 Cloutier, V., Lefebvre, R., Therrien, R., Savard, M.M., 2008. Multivariate statistical
- analysis of geochemical data as indicative of the hydrogeochemical evolution of
- groundwater in a sedimentary rock aquifer system. J. Hydrol. 353, 294–313.
- doi:10.1016/j.jhydrol.2008.02.015
- 643 Cozzarelli, I.M., Böhlke, J.K., Masoner, J., Breit, G.N., Lorah, M.M., Tuttle, M.L.W.,
- Jaeschke, J.B., 2011. Biogeochemical evolution of a landfill leachate plume,
- Norman, Oklahoma. Ground Water 49, 663–687. doi:10.1111/j.1745-
- 646 6584.2010.00792.x
- de Medeiros Engelmann, P., dos Santos, V.H.J.M., Moser, L.I., do Canto Bruzza, E.,
- Barbieri, C.B., Barela, P.S., de Moraes, D.P., Augustin, A.H., Goudinho, F.S.,
- Melo, C.L., Ketzer, J.M.M., Rodrigues, L.F., 2017. Environmental monitoring of
- water resources around a municipal landfill of the Rio Grande do Sul state, Brazil.
- 651 Environ. Sci. Pollut. Res. 24, 21398–21411. doi:10.1007/s11356-017-9725-7
- Devic, G., Djordjevic, D., Sakan, S., 2014. Natural and anthropogenic factors affecting
- the groundwater quality in Serbia. Sci. Total Environ. 468–469, 933–942.
- doi:10.1016/j.scitotenv.2013.09.011

- 655 EPA, 2014. Test Methods for Evaluating Solid Waste, Physical/Chemical Methods,
- 656 EPA publication SW-846, Third Edition. Method 6020B Inductively Coupled
- 657 Plasma Mass Spectrometry.
- Fatta, D., Papadopoulos, A., Loizidou, M., 1999. a Study on the Landfill Leachate and
- Its Impact on the. Environ. Geochem. Health 21, 175–190.
- doi:10.1023/A:1006613530137
- 661 Gelhar, L.W., Welty, C., Rehfeldt, K.R., 1992. A critical review of data on field-scale
- dispersion in aquifers. Water Resour. Res. 28, 1955–1974.
- doi:10.1029/92WR00607
- 664 Giusti, L., 2009. A review of waste management practices and their impact on human
- health. Waste Manag. 29, 2227–2239. doi:10.1016/j.wasman.2009.03.028
- 666 Grimmeisen, F., Lehmann, M.F., Liesch, T., Goeppert, N., Klinger, J., Zop, J.,
- Goldscheider, N., 2017. Isotopic constraints on water source mixing, network
- leakage and contamination in an urban groundwater system. Sci. Total Environ.
- 583, 202–213. doi:10.1016/j.scitotenv.2017.01.054
- Han, D., Tong, X., Currell, M.J., Cao, G., Jin, M., Tong, C., 2013. Evaluation of the
- impact of an uncontrolled landfill on surrounding groundwater quality, Zhoukou,
- 672 China. J. Geochemical Explor. 136, 24–39. doi:10.1016/j.gexplo.2013.09.008
- Harbaugh, A.W., 2005. MODFLOW-2005: the U.S. Geological Survey Modular
- 674 Ground-Water Model the Ground-Water Flow Process. U.S. Geological Survey
- Techniques and Methods 6–A16, Reston, VA.
- Judd, A.G., 1980. The use of cluster analysis in the derivation of geotechnical
- classifications. Bull. Assoc. Eng. Geol. 17, 193–211.
- Kaiser, H.F., 1958. The varimax criterion for analytic rotation in factor analysis.
- 679 Psychometrika 23, 187–200. doi:10.1007/BF02289233

- Kim, S., Thiessen, P.A., Bolton, E.E., Chen, J., Fu, G., Gindulyte, A., Han, L., He, J.,
- 681 He, S., Shoemaker, B.A., Wang, J., Yu, B., Zhang, J., Bryant, S.H., 2016.
- PubChem substance and compound databases. Nucleic Acids Res. 44, D1202–
- 683 D1213. doi:10.1093/nar/gkv951
- 684 Kim, T.H., Chung, S.Y., Park, N., Hamm, S.Y., Lee, S.Y., Kim, B.W., 2012. Combined
- analyses of chemometrics and kriging for identifying groundwater contamination
- sources and origins at the Masan coastal area in Korea. Environ. Earth Sci. 67,
- 687 1373–1388. doi:10.1007/s12665-012-1582-6
- Laner, D., Crest, M., Scharff, H., Morris, J.W.F., Barlaz, M.A., 2012. A review of
- approaches for the long-term management of municipal solid waste landfills.
- 690 Waste Manag. 32, 498–512. doi:10.1016/j.wasman.2011.11.010
- Lange, F.T., Scheurer, M., Brauch, H.J., 2012. Artificial sweeteners-A recently
- recognized class of emerging environmental contaminants: A review. Anal.
- 693 Bioanal. Chem. 403, 2503–2518. doi:10.1007/s00216-012-5892-z
- Lee, A.H., Nikraz, H., Hung, Y.T., 2010. Influence of Waste Age on Landfill Leachate
- 695 Quality. Int. J. Environ. Sci. Dev. 1, 347–350. doi:10.7763/IJESD.2010.V1.68
- 696 Lee, G.F., Jones, A., 1994. Impact of municipal and industrial non-hazardous waste
- landfills on public health and the environment: an overview. Report of California's
- 698 Environmental Protection Agency Comparative Risk Project.
- Lee, D.G., Roehrdanz, P.R., Feraud, M., Ervin, J., Anumol, T., Jia, A., Park, M.,
- Tamez, C., Morelius, E.W., Gardea-Torresdey, J.L., Izbicki, J., Means, J.C.,
- Snyder, S.A., Holden, P.A., 2015. Wastewater compounds in urban shallow
- groundwater wells correspond to exfiltration probabilities of nearby sewers. Water
- 703 Res. 85, 467-475. doi:10.1016/j.watres.2015.08.048
- Leoni, B., Marti, C.L., Imberger, J., Garibaldi, L., 2014. Summer spatial variations in

- phytoplankton composition and biomass in surface waters of a warm-temperate,
- deep, oligo-holomictic lake: Lake Iseo, Italy. Inl. Waters 4, 303–310.
- 707 doi:10.5268/IW-4.3.569
- Mead, R.N., Morgan, J.B., Avery, G.B., Kieber, R.J., Kirk, A.M., Skrabal, S.A., Willey,
- J.D., 2009. Occurrence of the artificial sweetener sucralose in coastal and marine
- 710 waters of the United States. Mar. Chem. 116, 13–17.
- 711 doi:10.1016/j.marchem.2009.09.005
- Mercado, A., 1967. The spreading pattern of injected water in a permeability stratified
- 713 aquifer. IAHS AISH Publ 72, 23–36.
- Mor, S., Ravindra, K., Dahiya, R.P., Chandra, A., 2006. Leachate characterization and
- assessment of groundwater pollution near municipal solid waste landfill site.
- 716 Environ. Monit. Assess. 118, 435–456. doi:10.1007/s10661-006-1505-7
- Mortensen, A., 2006. Sweeteners permitted in the European Union: Safety aspects.
- 718 Scand. J. Food Nutr. 50, 104–116. doi:10.1080/17482970600982719
- Naveen, B.P., Mahapatra, D.M., Sitharam, T.G., Sivapullaiah, P.V., Ramachandra,
- 720 T.V., 2017. Physico-chemical and biological characterization of urban municipal
- 721 landfill leachate. Environ. Pollut. 220, 1–12. doi:10.1016/j.envpol.2016.09.002
- Nigro, A., Sappa, G., Barbieri, M., 2017. Application of boron and tritium isotopes for
- tracing landfill contamination in groundwater. J. Geochemical Explor. 172, 101–
- 724 108. doi:10.1016/j.gexplo.2016.10.011
- Novel, J.P., Puig, J.M., Zuppi, G.M., Dray, M., Dzikowski, M., Jusserand, C., Money,
- E., Nicoud, G., Parriaux, A., Pollicini, F., 2002. Complexité des circulations dans
- 1'aquifère alluvial de la plaine d'Aoste (Italie): mise en évidence par
- 728 l'hydrogéochimie "Complexity of the groundwater flow in the alluvial aquifer of
- the Aosta plain (Italy): study with hydrogeochemistry". Eclogae Geologicae

- 730 Helvetiae 95:323-331.
- Öman, C.B., Junestedt, C., 2008. Chemical characterization of landfill leachates 400
- parameters and compounds. Waste Manag. 28, 1876–1891.
- 733 doi:10.1016/j.wasman.2007.06.018
- Panno, S. V., Hackley, K.C., Hwang, H.H., Greenberg, S.E., Krapac, I.G., Landsberger,
- S., O'Kelly, D.J., 2006. Characterization and identification of Na-Cl sources in
- ground water. Ground Water 44, 176–187. doi:10.1111/j.1745-6584.2005.00127.x
- 737 PIAHVA Programme International d'Action Hydrogeologique en Val, D'Aoste, 1996.
- Modelisation de l'ecoulement souterrain del l'aquifere alluvial de la Doire Baltée-
- Val d' Aoste, Italie "Groundwater flow modeling of the alluvial aquifer of the Dora
- Baltea Aosta Valley, Italy". Final report, Universités d' Avignon, Chambéry,
- 741 Turin, Centre de Recherches Géodynamiques de Tholon Univ. Paris 6 Ecole
- Polytecnique de Lausanne (GEOLEP) France.
- Pollock, D.W., 2012. User Guide for MODPATH Version 6—A Particle-Tracking
- Model for MODFLOW. U.S. Geological Survey Techniques and Methods 6–A41,
- Reston, VA.
- Preziosi, E., Frollini, E., Zoppini, A., Ghergo, S., Melita, M., Parrone, D., Rossi, D.,
- Amalfitano, S., 2019. Disentangling natural and anthropogenic impacts on
- groundwater by hydrogeochemical, isotopic and microbiological data: Hints from a
- municipal solid waste landfill. Waste Manage. 84, 245-255. doi:
- 750 10.1016/j.wasman.2018.12.005
- Rapti-Caputo, D., Vaccaro, C., 2006. Geochemical evidences of landfill leachate in
- 752 groundwater. Eng. Geol. 85, 111–121. doi:10.1016/j.enggeo.2005.09.032
- Reyes-López, J.A., Ramírez-Hernández, J., Lázaro-Mancilla, O., Carreón-Diazconti, C.,
- Garrido, M.M.L., 2008. Assessment of groundwater contamination by landfill

- leachate: A case in Mexico. Waste Manag. 28, 33–39.
- 756 doi:10.1016/j.wasman.2008.03.024
- Rotiroti, M., Di Mauro, B., Fumagalli, L., Bonomi, T., 2015a. COMPSEC, a new tool to
- derive natural background levels by the component separation approach:
- Application in two different hydrogeological contexts in northern Italy. J.
- Geochemical Explor. 158, 44–54. doi:10.1016/j.gexplo.2015.06.017
- Rotiroti, M., Fumagalli, L., Frigerio, M.C., Stefania, G.A., Simonetto, F., Capodaglio,
- P., Bonomi, T., 2015b. Natural background levels and threshold values of selected
- species in the alluvial aquifers in the Aosta Valley Region (N Italy). Rend. Online
- 764 Soc. Geol. Ital. 35, 256–259. doi:10.3301/ROL.2015.114
- Rotiroti, M., McArthur, J., Fumagalli, L., Stefania, G.A., Sacchi, E., Bonomi, T., 2017.
- Pollutant sources in an arsenic-affected multilayer aguifer in the Po Plain of Italy:
- Implications for drinking-water supply. Sci. Total Environ. 578, 502–512.
- 768 doi:10.1016/j.scitotenv.2016.10.215
- Roy, J.W., Van Stempvoort, D.R., Bickerton, G., 2014. Artificial sweeteners as
- potential tracers of municipal landfill leachate. Environ. Pollut. 184, 89–93.
- 771 doi:10.1016/j.envpol.2013.08.021
- Singh, U.K., Kumar, M., Chauhan, R., Jha, P.K., Ramanathan, A.L., Subramanian, V.,
- 2008. Assessment of the impact of landfill on groundwater quality: A case study of
- the Pirana site in western India. Environ. Monit. Assess. 141, 309–321.
- 775 doi:10.1007/s10661-007-9897-6
- Sizirici, B., Tansel, B., 2015. Parametric fate and transport profiling for selective
- groundwater monitoring at closed landfills: A case study. Waste Manage. 38, 263–
- 778 270. doi:10.1016/j.wasman.2014.12.020
- 779 Srivastava, S.K., Ramanathan, A.L., 2008. Geochemical assessment of groundwater

- quality in vicinity of Bhalswa landfill, Delhi, India, using graphical and
- multivariate statistical methods. Environ. Geol. 53, 1509–1528.
- 782 doi:10.1007/s00254-007-0762-2
- 783 Stefania, G.A., Zanotti, C., Bonomi, T., Fumagalli, L., Rotiroti, M., 2018a.
- Determination of trigger levels for groundwater quality in landfills located in
- 785 historically human-impacted areas. Waste Manage. 75, 400-406.
- 786 doi:10.1016/j.wasman.2018.01.043
- 787 Stefania, G.A., Rotiroti, M., Fumagalli, L., Simonetto, F., Capodaglio, P., Zanotti, C.,
- Bonomi, T., 2018b. Modeling groundwater/surface-water interactions in an Alpine
- valley (the Aosta Plain, NW Italy): the effect of groundwater abstraction on
- 790 surface-water resources. Hydrogeol. J. 26, 147-162. doi:10.1007/s10040-017-
- 791 1633-x
- 792 Stefania, G.A., Rotiroti, M., Fumagalli, L., Zanotti, C., Bonomi, T., 2018c. Numerical
- Modeling of Remediation Scenarios of a Groundwater Cr(VI) Plume in an Alpine
- Valley Aquifer. Geosciences 8, 209. doi:10.3390/geosciences8060209
- 795 Stefania, G.A., Fumagalli, L., Bellani, A., Bonomi, T., 2019. The hydrochemical
- database TANGCHIM, a tool to manage groundwater quality data: the case study
- of a leachate plume from a dumping area. Rend. Online Soc. Geol. It. 47, 113-120.
- 798 doi:10.3301/ROL.2019.21
- 799 Tariq, S.R., Shah, M.H., Shaheen, N., Jaffar, M., Khalique, A., 2008. Statistical source
- identification of metals in groundwater exposed to industrial contamination.
- 801 Environ. Monit. Assess. 138, 159-165. doi:10.1007/s10661-007-9753-8
- 802 Tran, N.H., Hu, J., Li, J., Ong, S.L., 2014. Suitability of artificial sweeteners as
- indicators of raw wastewater contamination in surface water and groundwater.

- 804 Water Res. 48, 443-456. doi:10.1016/j.watres.2013.09.053
- Triganon, A., Dzikowski, M., Novel, J.P., Dray, M., Zuppi, G.M., Parriaux, A., 2003.
- Échanges nappe-rivière en vallée alpine : quantification et modélisation (Vallée
- d'Aoste, Italie). Can. J. Earth Sci. 40, 775–786. doi:10.1139/e03-017
- Van Breukelen, B.M., Griffioen, J., 2004. Biogeochemical processes at the fringe of a
- landfill leachate pollution plume: Potential for dissolved organic carbon, Fe(II),
- Mn(II), NH4, and CH4 oxidation. J. Contam. Hydrol. 73, 181–205.
- 811 doi:10.1016/j.jconhyd.2004.01.001
- Van Breukelen, B.M., Röling, W.F.M., Groen, J., Griffioen, J., Van Verseveld, H.W.,
- 813 2003. Biogeochemistry and isotope geochemistry of a landfill leachate plume. J.
- 814 Contam. Hydrol. 65, 245–268. doi:10.1016/S0169-7722(03)00003-2
- Van Stempvoort, D.R., Roy, J.W., Brown, S.J., Bickerton, G., 2011. Artificial
- sweeteners as potential tracers in groundwater in urban environments. J. Hydrol.
- 817 401, 126–133. doi:10.1016/j.jhydrol.2011.02.013
- Vodyanitskii, Y.N., 2016. Biochemical processes in soil and groundwater contaminated
- by leachates from municipal landfills (Mini Review). Ann. Agrar. Sci. 14, 1512–
- 820 1887. doi:10.1016/j.aasci.2016.07.009
- Ward, J.H., 1963. Hierarchical Grouping to Optimize an Objective Function. J. Am.
- 822 Stat. Assoc. 58, 236–244. doi:10.1080/01621459.1963.10500845
- 823 Wolf, L., Zwiener, C., Zemann, M., 2012. Tracking artificial sweeteners and
- pharmaceuticals introduced into urban groundwater by leaking sewer networks.
- 825 Sci. Total Environ. 430, 8-19. doi:10.1016/j.scitotenv.2012.04.059
- Zheng, C., 2010. MT3DMS v5.3: Supplemental User's Guide. Technical Report to the
- U.S. Army Engineer Research and Development Center, Department of Geological
- 828 Science, University of Alabama.

829	Zheng, C., Wang, P., 1999. MT3DMS: A modular three-dimensional multispecies
830	model for simulation of advection, dispersion and chemical reactions of
831	contaminants in groundwater systems. Documentation and User's Guide, Contract
832	Report SERDP-99-1. U.S. Army Engineer Research and Development Center,
833	Vicksburg, MS.
834	Ziyang, L., Youcai, Z., Tao, Y., Yu, S., Huili, C., Nanwen, Z., Renhua, H., 2009.
835	Natural attenuation and characterization of contaminants composition in landfill
836	leachate under different disposing ages. Sci. Total Environ. 407, 3385-3391.
837	doi:10.1016/j.scitotenv.2009.01.028
838	
839	
840	
841	
842	
843	
844	
845	
846	
847	
848	
849	
850	
851	
852	
853	

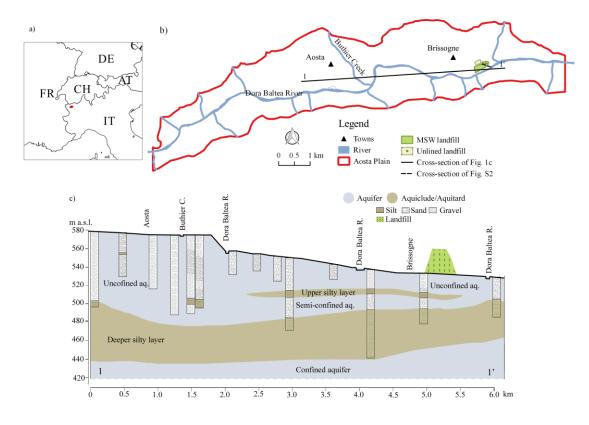


Fig. 1 - a) Location of the Aosta Plain. b) The Aosta Plain and location of the landfill site. c) Cross-section showing a schematic of the hydrogeological settings of the Aosta Plain.

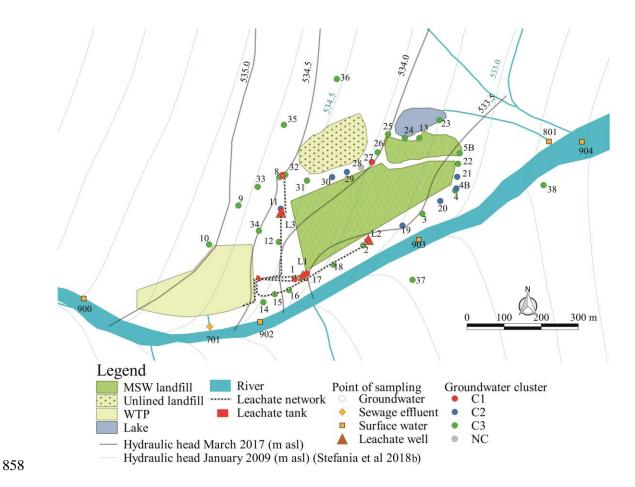


Fig. 2 - Map of the study area showing piezometric maps for January 2009 and March 2017 and locations of landfills, leachate collection system and sampling points (numbers are point IDs; Ln is for the leachate wells); groundwater sampling points are grouped into the 3 clusters resulting from the cluster analysis (C1, C2 and C3). MSW: Municipal Solid Waste, WTP: Wastewater Treatment Plant, NC: Not Classified.

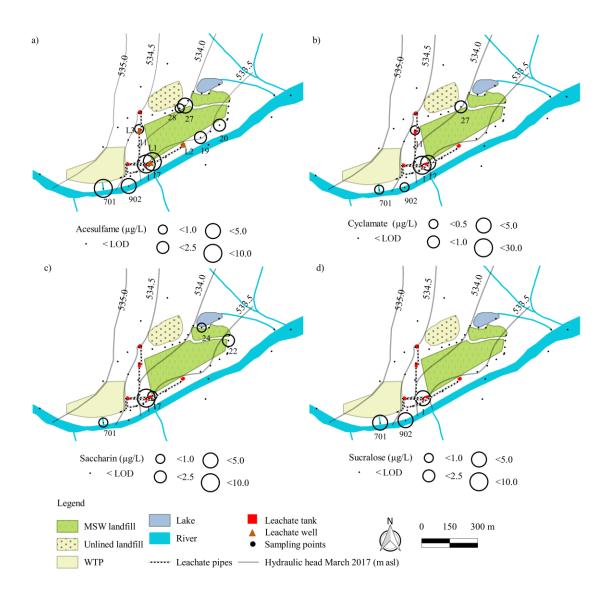


Fig. 3 - Maps of measured concentrations of artificial sweeteners (March 2017); sample IDs are reported for points with concentrations >LOD. a) Acesulfame. b) Cyclamate. c) Saccharine. d) Sucralose.

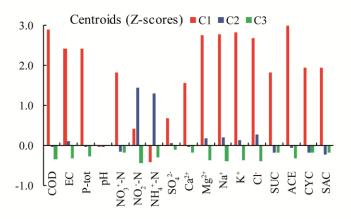


Fig. 4 - Histogram of centroids for the three identified clusters in the cluster analysis (C1, C2 and C3).

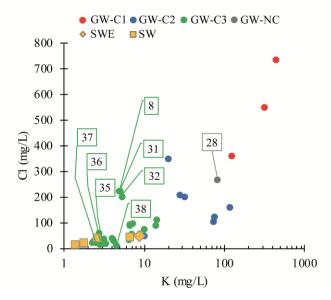


Fig. 5 - Scatter plot of  $Cl^-$  vs  $K^+$  for groundwater (GW), surface water (SW) and sewage effluent (SE) samples; numbers are sample IDs cited in the text; groundwater samples are grouped into the three identified clusters (C1, C2 and C3); NC = not classified.

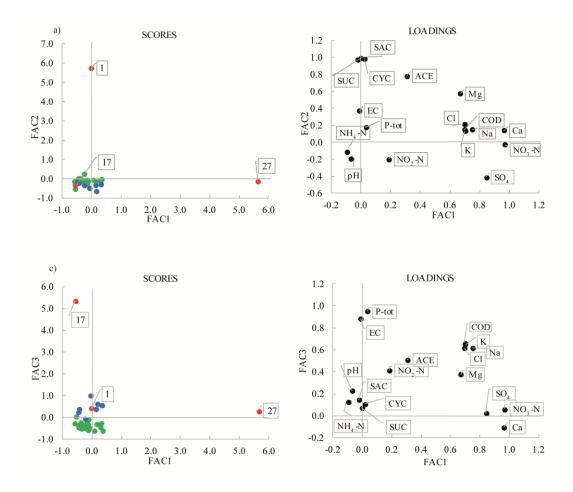


Fig. 6 - Score and loading plots resulting from the factor analysis of groundwater data; scores are grouped into the three identified clusters (C1, C2 and C3); numbers are sample IDs cited in the text. a) Plots of FAC1 *vs* FAC2. b) Plots of FAC1 *vs* FAC3.

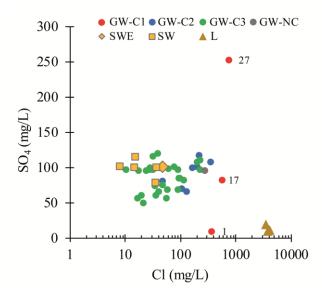


Fig. 7 - Scatter plot of  $SO_4^{2-}$  vs Cl<sup>-</sup> for groundwater (GW), surface water (SW) sewage effluent (SE) and leachate (L) samples; numbers are sample IDs cited in the text; groundwater samples are grouped into the three identified clusters (C1, C2 and C3); NC = not classified.

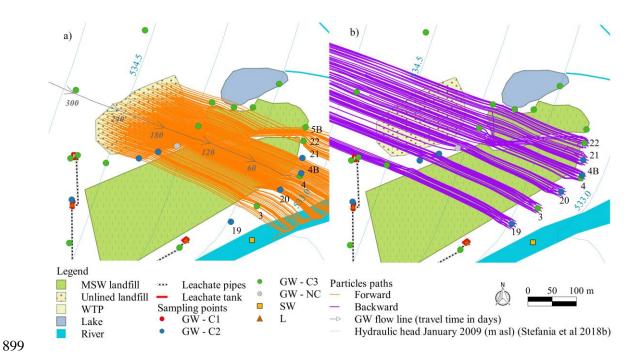


Fig. 8 - Results of particle tracking. a) Extension of a hypothetical plume originating from the whole old unlined landfill (forward simulation); the grey line represents the groundwater flow passing through piezometers 27 and 4B, for which the travel time (days) is expressed. b) Origin of groundwater passing through piezometers located downstream of the lined landfill (backward simulation). L: Leachate Well.

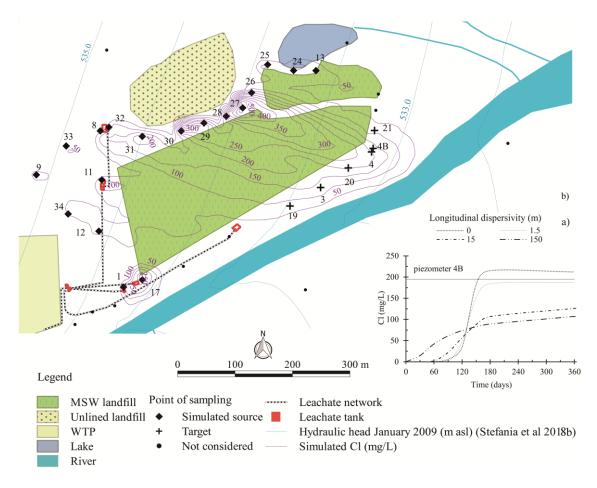


Fig. 9 - Results of the chloride transport model. a) Breakthrough curves of simulated Cl<sup>-</sup> in piezometer 4B using the different values of longitudinal dispersivity tested in the sensitivity analysis. b) Map of the simulated Cl<sup>-</sup> plume that indicates which piezometers were used as pollution sources and pollution targets.

Table 1 - Comparison of simulated against average measured Cl<sup>-</sup> concentrations (mg/L) from 2011 to 2017; targets are referred to piezometers located downstream of the MSW landfill.

Piezometer	Average measured	Simulated	Residual	Residual	Discrepancy (%)
	(mg/L)	(mg/L)	(mg/L)	(%)	
3	114.5	116.3	-1.8	-1.5	-1.5
4	84.9	194.4	-109.4	-128.8	-78.3
4B	195.0	186.9	8.1	4.2	4.3
19	105.5	86.4	19.1	18.1	19. 9
20	92.4	202.7	-110.4	-119.5	-74.8
21	76.3	101.6	-25.2	-33.1	-28.4

Table 2 - Summary of the pollution phenomena identified in the site and average composition of affected groundwater.

Pollution source	Old unlined landfill	MSW landfill leachate well L1	MSW landfill leachate well L3
Affected piezometers	4B, 19, 20, 21, 27, 28, 29, 30	1, 17	11
EC (μS/cm)	1300	4985	1580
COD (mg/L)	104	308	140
NO <sub>3</sub> -N (mg/L)	67.95	2.69	0.88
NO <sub>2</sub> -N (mg/L)	0.10	0.05	0.08
NH <sub>4</sub> <sup>+</sup> -N (mg/L)	44.51	0.76	54.00
P-tot (mg/L)	0.08	1.17	0.34
K <sup>+</sup> (mg/L)	95.8	218.0	116.6
Cl <sup>-</sup> (mg/L)	252.7	454.3	160.5
SO <sub>4</sub> <sup>2-</sup> (mg/L)	114.5	46.8	101.2
SUC (µg/L)	<1.00	1.75	<1.00
ACE (µg/L)	1.22	7.42	0.82
CYC (µg/L)	<0.10	15.31	0.14
SAC (µg/L)	<0.30	3.06	<0.30